

# Assesment of the detection distance of an autonomous recording unit in the cloud forest

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## ABSTRACT

Passive acoustic monitoring is an efficient and non-intrusive fundamental tool to provide information on the dynamics of spatial and temporal activity of the animals that produce sound, which is one of the research purposes in the emerging field of Ecoacoustics. For designing studies it is relevant to know the device detection space. The evaluation of this range distance is a rather complex task, given that in the sound transmission there are multiple factors related to: acoustic attributes of the signal of interest, characteristics and configuration of the recording equipment, as well as some elements of the habitat and the environment (humidity, temperature, wind, precipitation, vegetation, topography, etc.). In the present project, using an experimental approach, we evaluated the range of scope of the omnidirectional microphone integrated in an automated recorder. Particularly, we identified the maximum distance at which the animals' sounds, contrasting in frequency and call structure, are captured. Additionally, we analysed the effect of distance, terrain slope, tree density and canopy cover on the loss of signals.

## INTRODUCTION

Acoustic monitoring offers an efficient and effective method to assess biodiversity (Riede 1993). Automated Recording Digital Systems (ADRS) constitute the fundamental equipment to record the sound environment at a specific site (Acevedo and Villanueva-Rivera 2006). Although there is a variety of acoustic sensors, it is necessary to improve the technique to achieve greater representation of biodiversity and to know the resolution of the study, useful to predict and spatialize the patterns of acoustic activity. The probability of detecting an animal typically depends on its distance to the observer or the sensor (Marques et al. 2013). However, few studies have mentioned the maximum range or the area covered by the recording devices (Llusia, Márquez, and Bowker 2012). It is relevant to consider that the reaching distance of the devices delimits the *detection space* of the soundscape or the acoustic community of interest. Sound energy, measured in decibels (dB) as amplitude and that is commonly understood as sound intensity, decreases or attenuates when sound waves propagate in the medium. The sound attenuation phenomenon is due to three main factors: distance spreading, absorption of the medium (heat conduction, viscosity or losses due to molecular relaxation), and other phenomena of wave dispersion (reflection, refraction, diffraction, and absorption by changes in the impedance of the medium) (Sueur 2018). The absorption of the medium and the dispersion phenomena are difficult to model since they depend on several parameters such as frequency, humidity, temperature, pressure and physical properties of the obstacles that generate dispersion; on the contrary, spreading losses are easier to predict if there is a *reference intensity* and a *reference distance* (Sueur 2018).

The amplitude of the signal at the source (*source level*) can be extremely different between species

and cause marked differences in detection distances (Llusia, Márquez, and Bowker 2012). In addition, the sound loses power according to its frequency (measured in Hz); high-pitched tones (higher frequency) fade faster with distance, because these signals contain less pressure or energy and easily degrade with obstacles; in contrast, low-pitched tones (lower frequency) can travel longer (Marten, Quine, and Marler 1977; Sueur 2018). The structure and density of vegetation, topography and climatic variables (such as precipitation, wind speed, air temperature and ambient humidity), are some of the attributes of the site that can affect the transmission of sounds in the environment (Aylor 1972; Marten, Quine, and Marler 1977). On the other hand, among the characteristics of the microphone of the recorder that can intervene in the reception of the signal of interest are: the height above ground level, the orientation and/or the detection angle, as well as the microphone gain or level of recording.

Therefore, the evaluation of the recording range is a fairly complex task, since many factors are involved in the transmission of the sounds, from the acoustic nature of the signal of interest and the geophysical attributes of the site to the characteristics and configuration of the recording equipment. This study has applications in the field of Ecoacoustics research, which studies the ecological relevance of wildlife sounds.

In this project, we evaluated through an experimental approach, the detection range of the omnidirectional microphone integrated into the automatic recorder *SWIFT*.

In particular, we aimed: - to identify the maximum distance at which all the sounds of animals of different frequencies are captured, - to compare the attenuation of each tested signal according to its frequency category and its expected attenuation, and - to analyze the effect of the distance, the terrain slope, the canopy cover and the density of arboreal vegetation on the loss of the signals.

Since the intensity of the sounds decreases with distance and this attenuation is favored in the presence of barriers such as vegetation, we expected a greater loss of amplitude occurring in closer distances and in sites with higher canopy coverage and tree density. On the other hand, given the inverse relationship between the distance and the frequency of the signal, we expect that the sounds with high dominant frequency will be attenuated in closer distances.

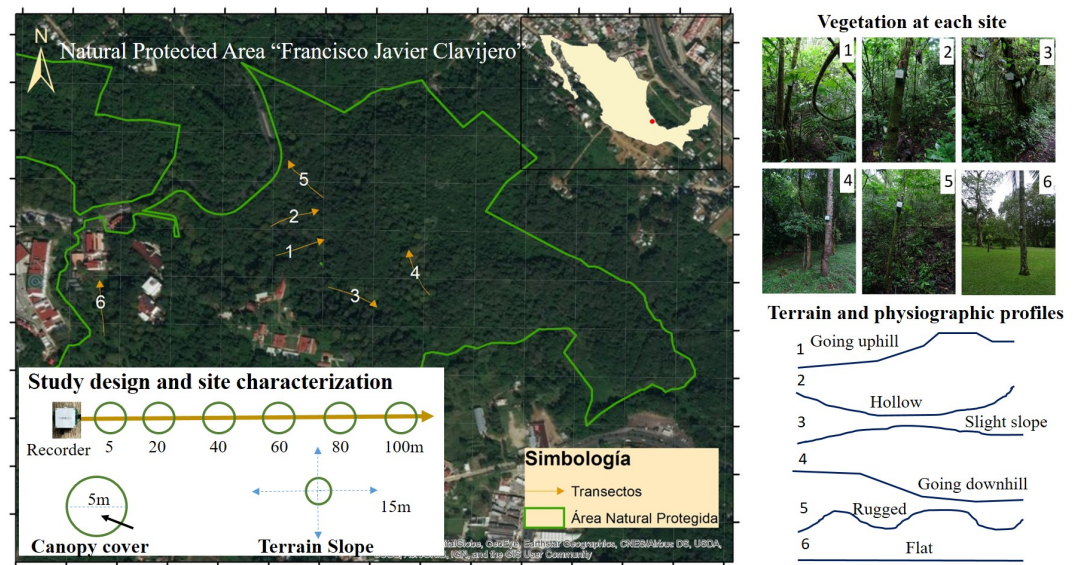
## METHODS

### Experimental design

**Study area.** The experiment was conducted in the Francisco Javier Clavijero Natural Protected Area, which presents secondary vegetation of the cloud forest, located in the southwest of the city of Xalapa, Veracruz. We chose six transects contrasting in tree density, physiographic form, and terrain slope; one of these (transect 6) can approach a control site because of the flat terrain (less than 10° of inclination) and low tree density, located in the Clavijero Botanical Garden. The fieldwork was carried out on May 8, 2018, from 11:00 a.m. to 5:00 p.m.; this schedule with the purpose of avoiding the peaks of activity of the local fauna that as background noise could cause masking of the signal of interest. During this period, the weather was with abundant cloudiness, without precipitation, and no gusts of wind. The air temperature varied between 19.7 and 22.2 °C, while the relative humidity changed between 92.3 and 99.9%; These variables were recorded with a portable meteorological Microstation *Kestrell 4500*.

**Characterization of site.** We estimated the tree density along each the transect, a circular plot of 5m radius was drawn at each test point and within this area (78.5 m<sup>2</sup>) we counted the number of trees with DAP > 10cm. We also shot photographs to estimate the percentage of canopy coverage using the *ImageJ* program. Finally, we calculated the average slope of the terrain using a laser hypsometer *Nikon Forestry Pro*. This topographic variable was recorded pointing at a distance of 15m from the speaker's point to the four cardinal points. This process was repeated in the six points of each transect (Figure 1).

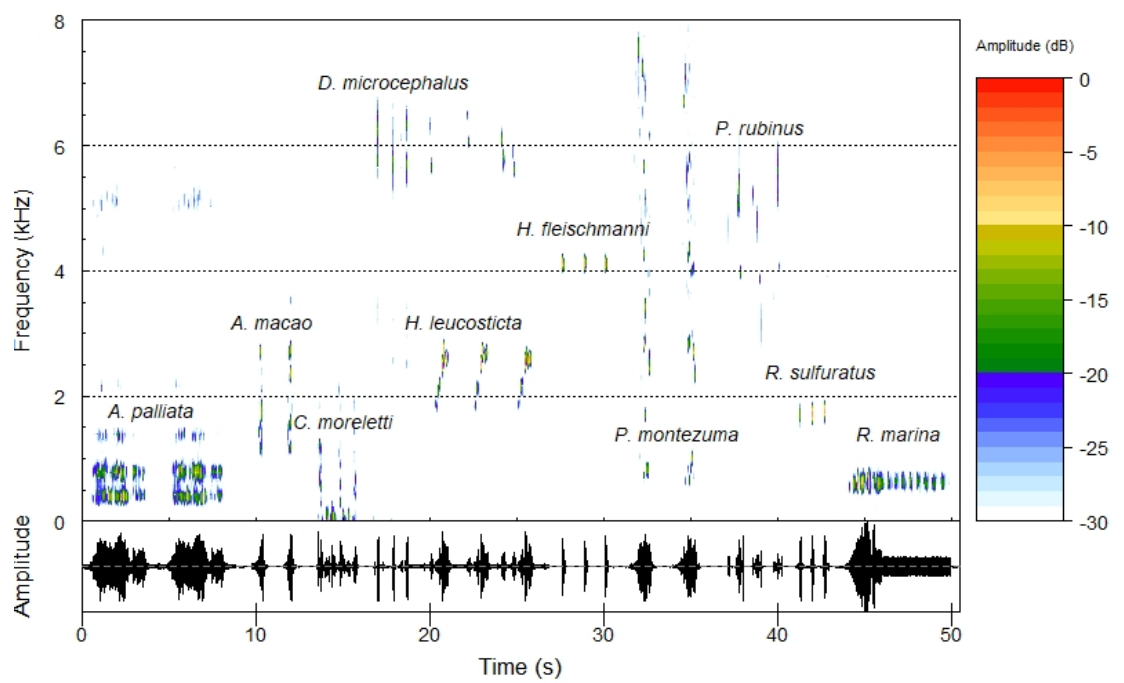
**Recording settings.** We evaluated the automatic recorder *SWIFT* which comes with a PUI Audio integrated microphone with an omnidirectional polar pattern (360° as detection angle) and a frequency response of 50 Hz to 16 kHz (TheCornellLab 2018). We configured the device to record audio continuously, at a recording rate of 48 kHz and with a microphone gain set at 35 dB (default value). We carried an experiment to know the maximum recording distance (m), this consisted of reproducing a and re-recording a soundtrack containing prerecorded animals contrasting in their dominant frequency (that one with the highest energy). The detection space was considered as the reach distance from the signal source, in which its amplitude remains above a minimum detection threshold (Brenowitz 1982).



**Figure 1.** Study area and experimental design indicating the location of the six transects, some representative photographs of the vegetation, as well as the physiographic forms according to each terrain profile.

### Animal sounds used for tests

We chose representatives of different taxonomic groups with vocalizations in different categories of dominant frequency: low,  $<2000$  Hz; medium,  $>2000$  and  $<3000$  Hz; and high,  $>3000$  Hz. The chosen sounds belong to ten species of vertebrate animals (three amphibians, one reptile, five birds and one mammal) (Figure 2). These audios were reproduced in each transect at six distances (5, 20, 40, 60, 80 and 100 m) from the evaluated microphone. In the original audios, we measured its dominant frequency (Hz) and its reference amplitude (*iref*), measured in dB at a reference distance of 1m (*dref*); these were the base parameters to compare with the outputs from the analysis of the audios rewritten by the *SWIFT* device. In addition, to take into account the spectral complexity of the sound, we estimated the acoustic diversity index (ADI), which measures the signal entropy by measuring the acoustic activity occurring in 500-Hz frequency bands (Villanueva-Rivera et al. 2011). This variable was calculated using “soundecology”, an R library designed for acoustic analysis (Villanueva-Rivera and Pijanowski 2015) (Table1).



**Figure 2.** Spectrogram of the selected audios for the experiment, belonging to the ten species of vertebrate animals.

**Table 1.** Description of animal sounds used for tests.

Sp.	Group	Common name	Scientific name	Sound content	Author of recording	Duration (s)	Amplitude (dB)	Frecuencia (Hz)	Frequency category	ADI value
1	Reptiles	Morelet's Crocodile	<i>Crocodylus moreletti</i>	3 calls	SKPC	2.5	-28.0	<b>387</b>	low	4.76
2	Amphibians	Cane Toad	<i>Rhinella marina</i>	1 trill	ASR	9.0	-3.5	<b>657</b>	low	4.85
3	Mammals	Mantled Howler Monkey	<i>Alouatta palliata</i>	2 calls	ASR	10.0	-16.8	<b>779</b>	low	4.97
4	Birds	Keel-billed Toucan	<i>Ramphastos sulfuratus</i>	3 songs	ASR	2.0	-16.1	<b>1721</b>	low	4.66
5	Birds	White-breasted Wood-wren	<i>Henicorhina leucosticta</i>	3 songs	FGG	8.0	-22.6	<b>2507</b>	medium	4.03
6	Birds	Scarlet Macaw	<i>Ara macao</i>	2 calls	ASR	5.0	-24.6	<b>2701</b>	medium	2.93
7	Birds	Montezuma Oropendola	<i>Psarocolius montezuma</i>	2 songs	ASR	8.0	-22.5	<b>2809</b>	medium	4.97
8	Amphibians	Fleischmann's Glass Frog	<i>Hyalinobatrachium fleischmanni</i>	3 calls	ASR	3.0	-21.4	<b>4062</b>	high	4.92
9	Birds	Common Vermilion Flycatcher	<i>Pyrocephalus rubinus</i>	3 songs	ASR	3.5	-36.4	<b>5057</b>	high	4.31
10	Amphibians	Small-headed Treefrog	<i>Dendropsophus microcephalus</i>	3 calls	ASR	2.0	-30.3	<b>6231</b>	high	2.67

To standardize the intensity of the sounds, these were normalized to -4 dB using the free-use software *Audacity*. The recorder *SWIFT* was placed at a height of 2m above ground level. To play the audios we used a portable loudspeaker *XP8000RD Power&Co* that has a power of 4200 W. The volume was calibrated at an average intensity of 55 dB measured at 1m distance, as reference distance ( $d_{ref}$ ), and at a height of 1m above the ground.

## Assessment of the detection space

In each recording obtained and for the ten signals of interest, the spectrum analysis tool *Plot Spectrum* was used in the *Audacity* program to measure the dominant frequency measured in number of cycles per second or Hertz (Hz), as well as its amplitude in decibels at full scale (dBFS).

Let  $X_{11}, X_{12}, \dots, X_{ij}$  be the measures of observed amplitude in the tested distances ( $i = 6$ ) and sites ( $j = 6$ ), for each signal of interest (or species). We averaged these amplitude values taking into account the logarithmic nature of this variable, using the formula:

$$Amplitude_{obs} = \frac{10^{Amplitude_{dB}*-1}}{10}$$

After transformed, these values were added and divided by the number of observations ( $n = 36$ ) and again transformed back into digital amplitude (dBFS).

$$Amplitude_{obs(mean)} = \frac{X_{obs1} + X_{obs2} + \dots + X_{obsn}}{n} = \frac{1}{n} \sum_i^n Amplitude_i$$

From the reference amplitude value, the acoustic extinction curves were constructed for each distance. The detection threshold occurs when a loss of the signal of interest is identified; that is, when it is no longer displayed on the spectrogram; in this case, we assigned a symbolic value of -100 dBFS.

## Attenuation analysis by animal sound type

To study the observed attenuation with respect to distance for each species, and according to its dominant frequency category; the expected attenuation curve was generated according to the theory of sound propagation. The following formula was used to calculate these values:  $Amplitude_{expected} = I_{ref} - 20 * \log(d/d_{ref})$ ; where the expected amplitude ( $Amplitude_{expected}$ ) is obtained from the reference amplitude ( $I_{ref}$ ), the distance of interest ( $d$ ) and the reference distance ( $d_{ref}$ ). Distance attenuation calculator

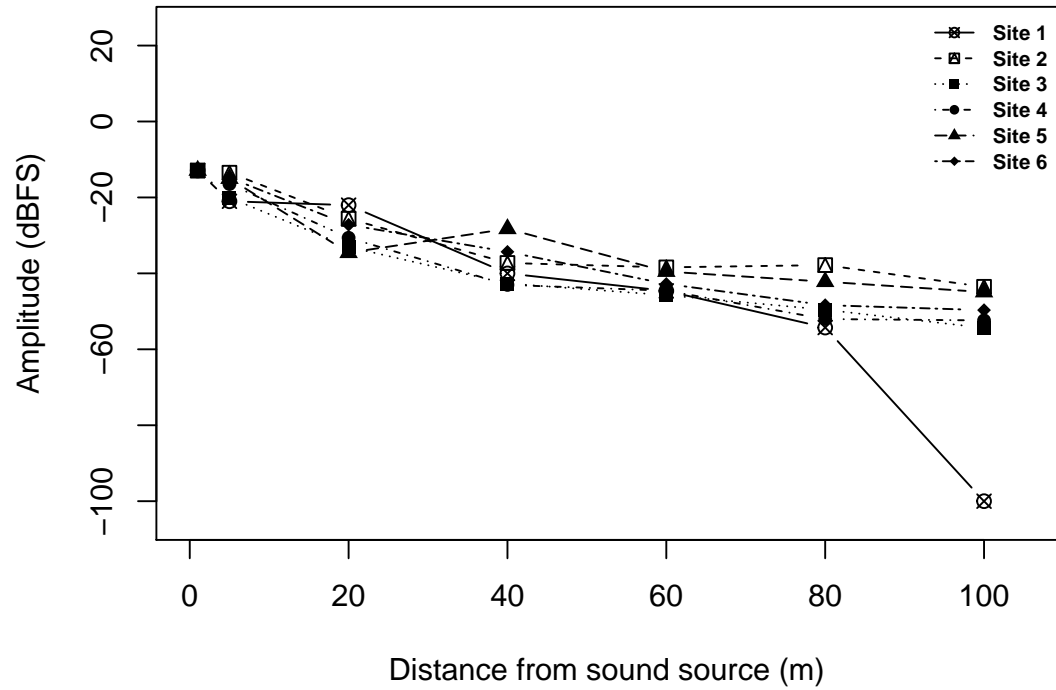
## Effects of topography and vegetation

To study the possible effect of topography and vegetation on signal reception, for each species, we made linear models of the measurements of amplitude observed in full scale (dBFS) in function of the expected amplitude (dBFS), the recording distance (m), the average slope of the site, the density of tree stems with DAP > 10cm and the tree cover percentage. We used the `glmulti` function to find the most appropriate model based on the *corrected Akaike Information Criteria (AICc)*.

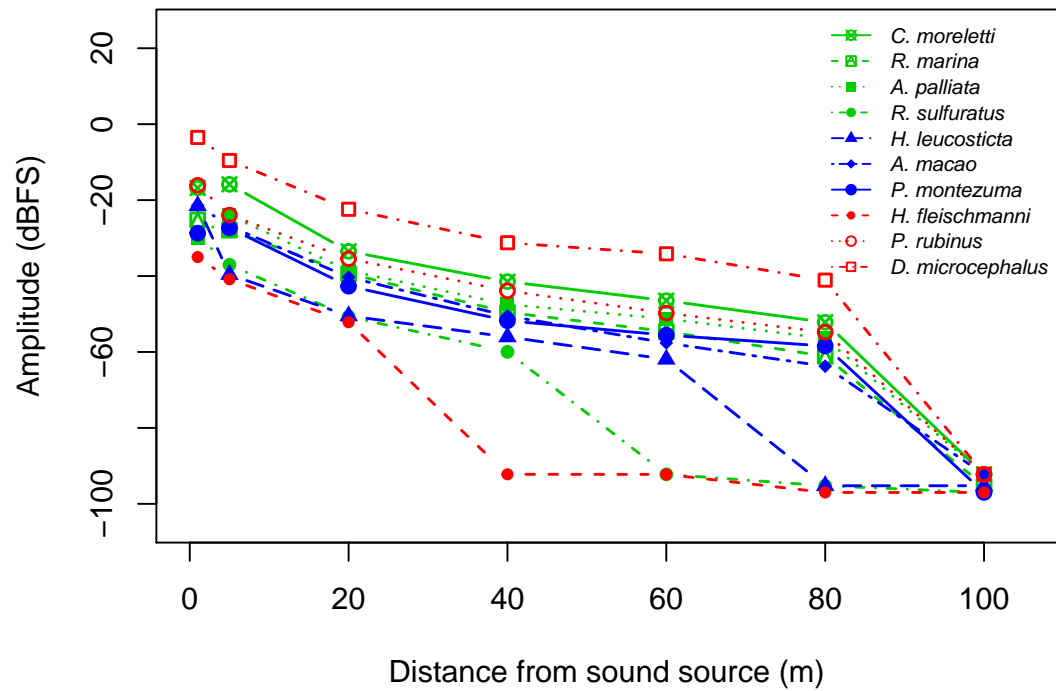
# RESULTS

## Detection space of tested recorder

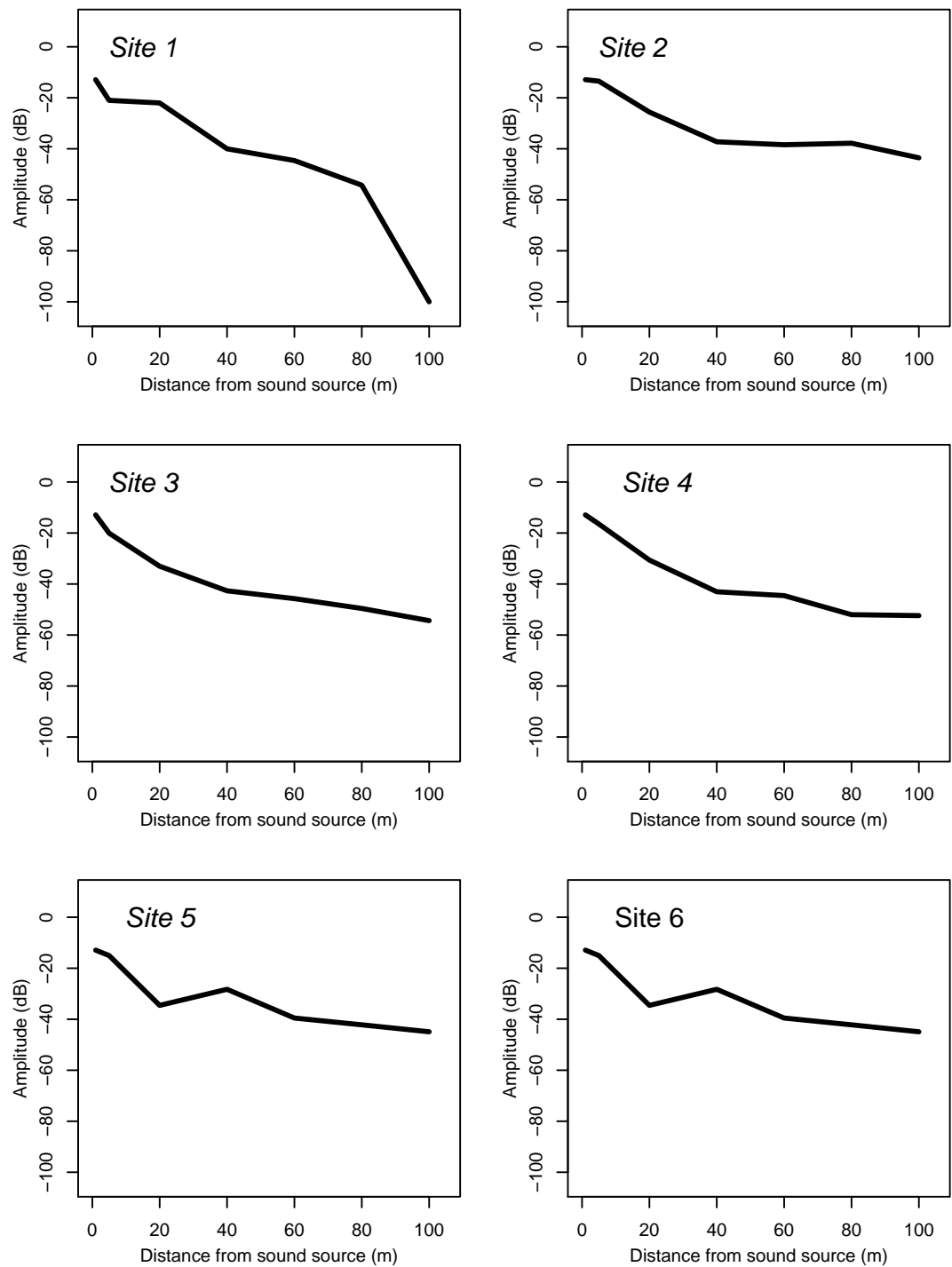
We present the acoustic extinction curves generated for each site (Figure3) and for each species (Figure4) based on their average amplitude values, in decibels at full scale (dBFS), recorded for each distance.



**Figure 3.** Acoustic extinction curves by site with amplitude measured at six distances.



**Figure 4.** Acoustic extinction curves by sound type, with amplitude evaluated at six distances. Colors indicate the corresponding peak frequency category that each animal sound: red (high-pitched), blue (medium), green (low-pitched).



**Figure 5.** Attenuation curves with amplitude evaluated at six distances for six sites.



140 **Attenuation by animal sound type**

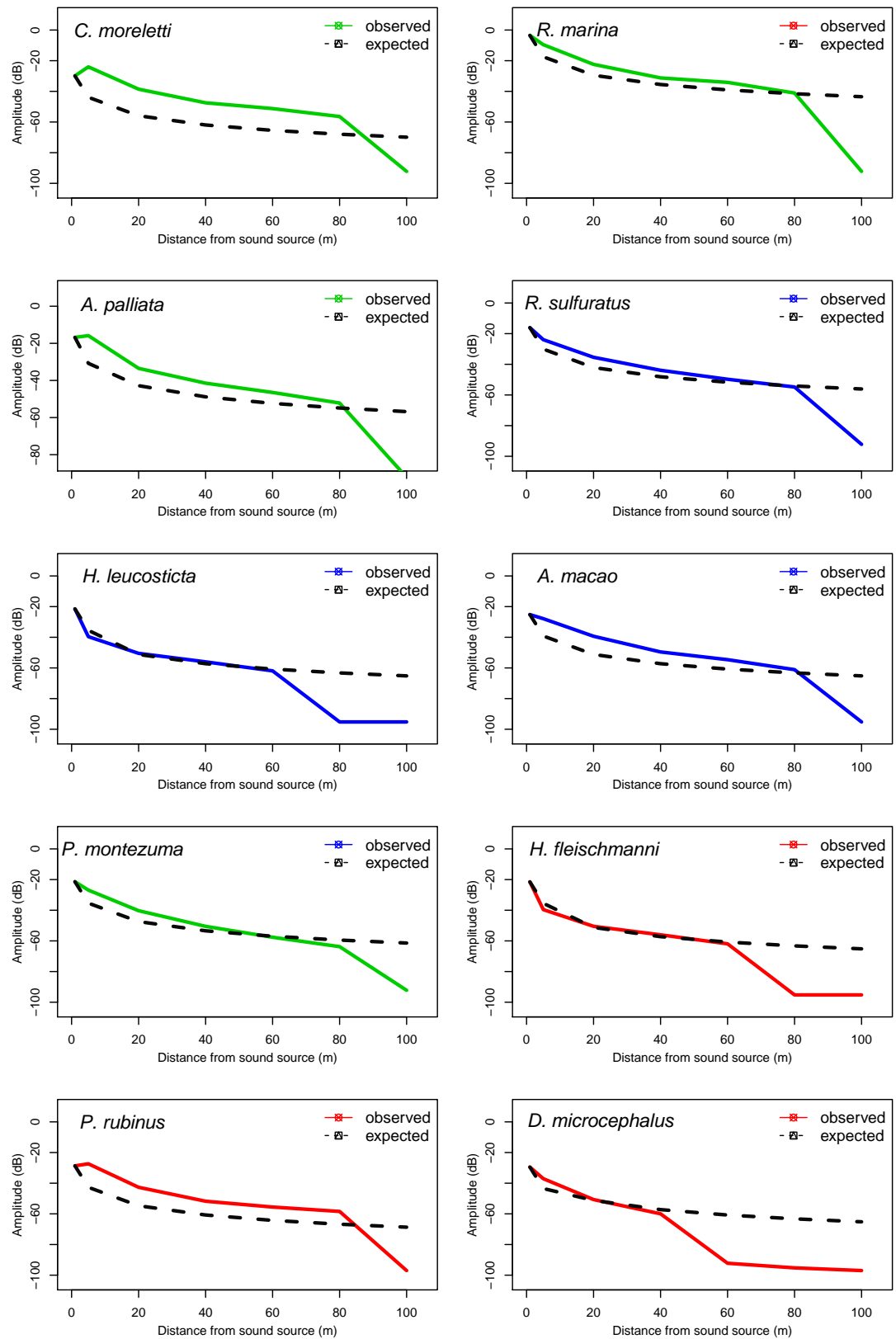
141 The loss of signal by sound type or species depending on the expected attenuation was very variable  
142 among the different types of sounds. In most species, the attenuation observed was greater than the  
143 expected curve in the distances closest to the sound source (Figure6).

144 **Effects of topography and vegetation**

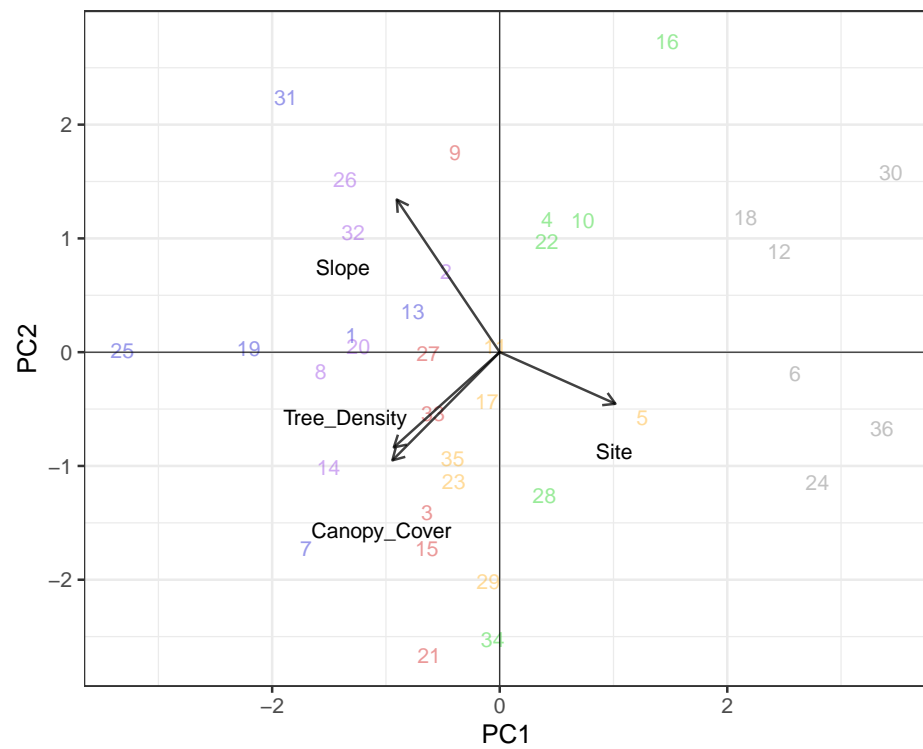
145 We studied the detection distance of the recorder in 36 locations (6 by site) which are contrasting in tree  
146 density, canopy cover and terrain slope (Figure7).

147 ***Linear Model***

148 For each one of the species, we present the linear models that were selected using the “glmulti” function  
149 (Table2).



**Figure 6.** Observed vs expected attenuation curves of the ten animal sounds, with amplitude measured at six distances. Colors indicate the corresponding category of peak frequency: green for low-, blue for medium- and red for high-pitched sounds.



**Figure 7. PCA.**

**Table 2.** Linear model results

Sp.	Common name	Frequency (Hz)	$r^2$	Model	$\alpha$	$\sigma_\alpha$
1	<i>Morelet's Crocodile</i>	387	0.671	$\alpha + \text{Distance}$	-18.072	3.054
2	<i>Cane Toad</i>	657	0.710	$\alpha + \text{Distance} + \text{TreeDensity} : \text{Distance}$	-28.141	2.936
3	<i>Mantled Howler Monkey</i>	779	0.690	$\alpha + \text{Distance}$	-26.021	2.662
4	<i>Keel-billed Toucan</i>	1721	0.793	$\alpha + \text{Distance} + \text{CanopyCover} : \text{Distance} + \text{Slope} : \text{TreeDensity}$	-32.339	3.288
5	<i>White-breasted Wood-wren</i>	2507	0.750	$\alpha + \text{Distance} + \text{TreeDensity} : \text{Distance}$	-37.984	2.899
6	<i>Scarlet Macaw</i>	2701	0.804	$\alpha + \text{Distance} + \text{Slope} : \text{CanopyCover}$	-25.266	2.562
7	<i>Montezuma Oropendola</i>	2809	0.724	$\alpha + \text{Distance} + \text{CanopyCover} : \text{Distance}$	-27.746	3.096
8	<i>Fleischmann's Glass Frog</i>	4062	0.718	$\alpha + \text{Distance} + \text{CanopyCover}$	-19.877	7.200
9	<i>Common Vermilion Flycatcher</i>	5057	0.740	$\alpha + \text{Distance} + \text{Slope} : \text{Distance}$	-23.489	2.555
10	<i>Small-headed Treefrog</i>	6231	0.668	$\alpha + \text{Distance} + \text{Slope} : \text{Distance} + \text{Slope} : \text{CanopyCover}$	-17.170	5.262

### Model selection and fitting: theoretical vs empirical model

The main signal is caught by the intercept, which contains the *offset* term and it is clearly different from zero. In order to know the *offset* effects, we plotted the intercept with its confidence intervals at 95%. It is clear that there is a certain common arrangement for the attenuation of all calls, and the only one that separates the most is that one with a dominant frequency of 2500 Hz, which is attenuated apparently more than everyone (Figure8). In all cases, we found a small effect of distance with the same sign as the offset, so we could actually add it to the previous estimate. Then, there are the secondary effects of tree density, terrain slope and canopy coverage, which as explanatory variables have small effects compared to the size of the *offset*.

### Model contrast approach

We proposed a *complete model* as a reference, which contains theoretical attenuation as a term plus an “empirical” component constructed with the main effects of distance and of site conditions including its first-order interactions. From this reference model, the non-significant terms are removed to get a “minimum adequate model”. Based on the estimates of the “additive explanatory” effect of the “empirical” components, we assessed the improvement that the empirical model can bring to the theoretical model (Table3). We see no significant improvements, except in the case of *White-breasted Wood-wren*.

**Table 3.** Contrast of the theoretical vs empirical model

Sp.	Common name	Frequency (Hz)	Model	$r^2_{theoretical}$	df residual	df model	F	P
1	<i>Morelet's Crocodile</i>	387	theoretical vs empirical	0.754	27	7	1.103	0.389
2	<i>Cane Toad</i>	657	theoretical vs empirical	0.724	27	7	1.222	0.325
3	<i>Mantled Howler Monkey</i>	779	theoretical vs empirical	0.770	27	7	1.187	0.343
4	<i>Keel-billed Toucan</i>	1721	theoretical vs empirical	0.810	27	7	2.287	0.058
5	<i>White-breasted Wood-wren</i>	2507	theoretical vs empirical	0.787	27	7	5.224	0.001
6	<i>Scarlet Macaw</i>	2701	theoretical vs empirical	0.845	27	7	1.814	0.125
7	<i>Montezuma Oropendola</i>	2809	theoretical vs empirical	0.734	27	7	1.647	0.165
8	<i>Fleischmann's Glass Frog</i>	4062	theoretical vs empirical	0.758	27	7	1.847	0.119
9	<i>Common Vermilion Flycatcher</i>	5057	theoretical vs empirical	0.780	27	7	1.772	0.134
10	<i>Small-headed Treefrog</i>	6231	theoretical vs empirical	0.710	27	7	1.851	0.118

We can also explore the convenience of adding some of the site characterization variables or an additional distance effect. The principal effects of these variables plus the term of *theoretical attenuation*. Using the *stepwise* strategy but without incorporating any interaction in order to make slight improvements that may more clearly have the contextual effect of the site's characteristics on the sound behavior.

### Do all calls fade in the same way: does the same model apply to all?

We adjusted a model including theoretical attenuation in interaction with the species and of course, the main effects of both. For convenience, the type of contrast used in R is *treatment*, which means that one of the conditions is chosen as a reference and all others are then expressed as the difference from that reference. Usually, the first treatment is taken as a reference, but anyone that interests may be chosen.

Almost all species could be modeled similarly, except for the sound of species 5 (*Henicorhina leucosticta*).

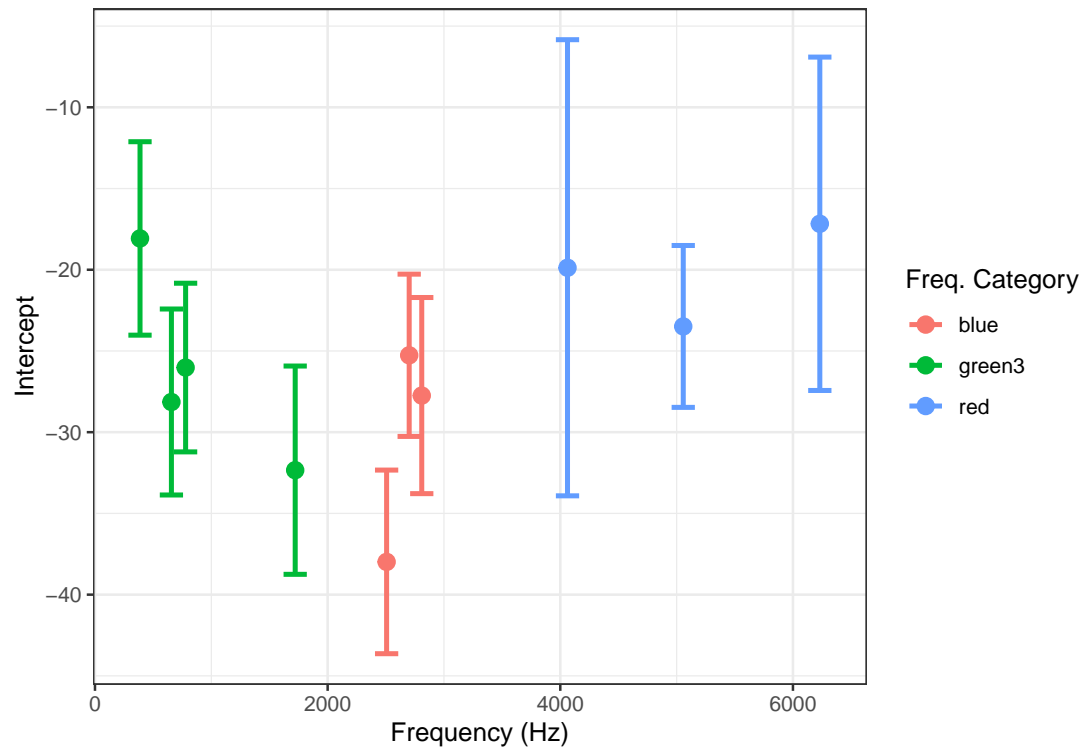
This model shows that there is no statistically significant change in relation to the “original complete model”. All species behaved similarly to each other, in terms of attenuation in relation to distance. The species differ in the initial condition from which the attenuation process begins.

This simplified model seems to account for the data almost as well as the “original complete model”; so, in spite of everything, in the case tested we could even simplify the model a little more since several species seem not to differ either when initial condition: Sp1 == Sp3 == Sp7 == Sp10. When making this change, the explanatory capacity of around 0.5% is lost.

## DISCUSSION

The maximum average distance at which most of the animal sounds of different frequencies are detected is 80 m, some sounds are attenuated and lost at 40m. As we expected, the high-frequency signals resulted in a greater loss as the distance increases.

The detection space may vary according to weather conditions such as temperature, humidity, wind, and precipitation, in the field is not possible to control these environmental variables.



**Figure 8.** Intercepts showing attenuation by species.

The evaluated site variables of terrain slope and vegetation had no significant effect *per se* on attenuation. It would be interesting to study the effect of other topographic variables such as the terrain roughness, the orientation and the physiographic form of the site.

In the wildlife, animals emit vocalizations at different heights and some of them move or change orientation while there are calling.

The main purpose of this project was to estimate the detection distance of the recorder which is especially relevant for studies in which it is intended to record the sound remotely and autonomously. On the contrary, it was not the objective of this project to evaluate the transmission of sounds, which could require another type of experimental design.

#### Considerations: ...

1. The issue of “identifiability of the call” is pending, in the sense how much distortion occurs to degrade the characteristics that allow differentiating the animals studied?
2. There is no reference control signal (pure tone of 1kHz at 94 dB SPL which is the pressure of 1 Pascal), based on this normalization would be performed.
3. Review the frequency response of the horn, you may amplify certain frequencies further.
4. Consider the sensitivity of the microphone (frequency response and gain).

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