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RESEARCH ARTICLE

# Climate complexity in the migratory cycle of Ammodramus bairdii

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## **Abstract**

One way to understand the ecology of bird migration is to analyze how birds use their ecological niche during their annual cycle. Ammodramus bairdii is a grassland specialist sparrow that breeds in southern Canada and the northern U.S.A. and winters in the Chihuahuan Desert. A continuous and alarming decrease of its populations has been observed over the last 50 years, and studying its seasonal distribution and associated climatic niches could help improve strategies for its conservation. We analyzed the temporal use of its Grinnellian niche (GN) -set of environmental conditions under which a species can establish and persist; in this case the climatic attributes-. We modeled the GN for the reproductive and winter seasons and projected them onto each other (inter-prediction), and also onto transient migratory periods. To measure niche breadth and their overlap, minimum convex polygons (MCP) were calculated for the climatic space. The niches of each of the two seasons were tested for similarity using the PCA axes of climatic variables. The geographic areas with optimal, suboptimal and marginal conditions were identified, based on the distance to the centroid of the GN. The models for each season revealed no geographic inter-prediction among them, with the exception of winter to migratory seasons. The niche breadth of the winter was greater than that of the reproductive season, with an overlap of 22.47% and 45.18%, respectively. The similarity analyses showed a value of zero between seasons. The climate conditions for the records during the migratory months corresponded with suboptimal and marginal conditions of the sparrow's winter niche. These results suggest that A. bairdii uses different climate conditions within ecological niches of each season during its migratory cycle.

# Introduction

The Grinnellian niche is defined as the multidimensional set of environmental conditions that allows a species to establish and persist [1-4]. Maguire [5] suggested that within the niche there is a structure created by variations in the combination of conditions that make it possible



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to identify distinct ecological regions; those closest to the niche centroid are considered optimal, since theoretically, correspond to higher values of the species breeding success, abundance and survival. The intermediate regions would be considered suboptimal and, while those located on the periphery of the niche are considered marginal. Unfortunately, in spite of the knowledge we have about the existence of the internal structure of niches and its effect on different aspects of species biology [6-10], the information on conditions used by migratory species during their non-breeding seasons is too limited.

Most migratory birds spend more than half of the year in non-breeding areas [11–15]; however, there is a marked bias in the studies on their biology, natural history, habitat selection, etc. toward the areas where these birds breed, at the northern extreme of their distribution [16–20]. This has resulted in gaps of information on migration and over-wintering population parameters for these species, which are essential since directly affect their annual survival and reproductive success [21–25].

It has been suggested that there are two basic patterns in the way migratory birds use climate conditions throughout their annual cycle. Some utilize the same conditions in breeding and wintering grounds (niche followers), while others change their use of conditions between seasons (niche switchers; [24,26–29]); although these definitions do not consider migratory transitional grounds. To understand the dynamics of use of the macro-climatic conditions of the reproductive and wintering areas, it is necessary to understand the relationship between the geographic areas used by a species throughout its annual migratory cycle and its environmental space, i.e. its Grinnellian niche [30–32]. Understanding this is essential to both, increase our understanding of migration and to aid in the definition and preservation of transitional areas and climates used only temporarily by these species [27,33–36].

Ecological niche modeling (ENM) is a technique that correlates the location records of a species with environmental conditions, making possible to reconstruct its Grinnellian niche, which is then projected onto the land. This enables the identification of sites with environmental conditions favorable for the potential presence of the species [37–39], even if records are scarce, since ENM is assumed to be accurate and reduce biases by fulfilling information gaps from non-sampled areas and periods [40]. ENM has also been used widely and with reliable results to analyze the niches of migratory bird species, for both their reproductive and wintering seasons [27,28,32,34,41–46].

Baird's sparrow (*Ammodramus bairdii*) is a migratory species and a grassland specialist, whose population has been continuously decreasing over the last five decades [47,48]. It is assumed that such trend is associated with the loss of up to 80% of its reproductive and wintering habitat mostly due to agricultural activities [49–55]. It breeds in mixed-grasslands and fescue prairies of the northern U.S.A. and southern Canada, and winters in the grasslands of the Chihuahuan Desert in southern U.S.A. and northern Mexico. There is fine scale information about the natural history, ecology, and specifically habitat of *A. bairdii* for the breeding grounds [18,56–59]; however, studies addressing its winter ecology are scarce despite the fact it spends more than 50% of its annual cycle in these southern locations [12,60,61]. Knowledge on its migratory routes and habitats is even scarcer and limited to a reduced number of observational/curatorial records during this periods [62,63]. In addition, macro-climatic conditions have not been described throughout its annual cycle, and represent indispensable information to better understand and attenuate threats to this declining population due to climate change [22,47,64–66].

The objectives of the present study were to: 1) characterize the climate niches of the reproductive and winter seasons of *A. bairdii* through ENM; 2) analyze the use of these Grinnelian niches during the migratory stages, according to its internal structure (marginal, suboptimal and optimal conditions); 3) define and compare Grinnelian niche breadth for the reproductive and winter seasons; and 4) determine the climatic similarity between the two seasons.



Given that *A. bairdii* is a grasslands specialist and its environmental requirements during the reproductive and winter seasons are highly specific [18,56,60,61,67], we hypothesized that the climate conditions described for the different stages throughout its annual cycle will remain the same (niche follower, *sensu* Nakazawa [27]. It was therefore predicted that the reproductive and wintering niches will show a high degree of overlap (greater than 50%), their projection of the optimal zones during migratory season will coincide with the species known distributional records, and climatic niches will not be dissimilar.

## Material and methods

### Presence and environmental data

We obtained monthly presence data for the species from electronic gazetteers, such as the Global Biodiversity Information Facility (GBIF); ORNIS, via VertNet (http://www.ornisnet.org/); unpublished databases curated by Bird Conservancy of the Rockies (BCR); Universidad Autónoma de Nuevo León (UANL); and the Integrated Monitoring in Bird Conservation Regions (IMBCR) Program. We only used records that were spatially and seasonally unique. We also verified localities and dates, based on the species known range, and eliminated any dubious (imprecise or unverifiable) records. As with most species [68], too few observations and specimens were available, and may be biased by site accessibility. Besides, Baird's sparrow, as many other species of conservation concern, has low occurrence information to cover satisfactorily their entire range; particularly during the migratory and winter seasons.

We compiled a total of 246 records for the reproductive (May to July) and 83 for the winter (December to February). We separated both, records and climate variables per month, since it has been proved its usefulness to describe the climatic conditions used by migratory birds due to the changing and transitional nature of the migration periods [31,34,69–71]. We gathered 28, 20, 33 and 15 records for April, September, October, and November, respectively. March and August were excluded from the analysis because are transitional months between seasons and record assignation to a particular period was not possible with confidence. These records; however, did help to delimit the reproductive, and migratory records.

To characterize the niches, three monthly climate cover layers (geospatial climate data) were used: maximum and minimum temperature and precipitation, with a resolution of  $0.0416^{\circ}$  ( $\sim$ 5 km²), which were created by monthly interpolations of meteorological data from around the world from 1950 to 2000, and are known as WorldClim project [72]. Each layer is a raster (pixel or cell based file) with values of the corresponding climate variable assigned on each cell.

Of the 329 occurrence data points used for the model, 39 were obtained previous to 1950 and 217 from 2001 to 2013; thus only 73 records coincided with the climate data period. However, we used the whole set of data with confidence, considering that, global average increase in surface temperature from 1951 to 2010, was of approximately 0.6°C to 0.7°C [73], fluctuations in the species distribution are "short-term" (1890–2013), and that scenopoetic variables have slow dynamics, and can be considered static over many decades or more [38].

# **Ecological niche models**

We analyzed and generated two independent ENM for the reproductive and winter seasons [27,32,35,36,41,42,74–76], given that migratory bird can experienced different climatic conditions during their annual cycle [74,77,78] and most of them have distinct extent-of-occurrence (i.e. geographic distributions).

For the former, we used layers and records from May to June, since these months correspond with the optimal conditions for breeding with the highest vegetation productivity, food



resources availability, and weather suitability [57,63,79–82]. For the second model we used records from December to February, when the species generally uses dense grasses, and depends on a enough seed availability that does not limit its winter survival [62,83–85], and suitable weather, with enough precipitation that optimizes the species' feather molt [86]. No ENM was generated for the migration months because of the low number of records and the uncertainty of the possible models.

To generate the ENM, we used the Genetic Algorithm for Rule-set Production (GARP), which is an evolutionary algorithm based on artificial intelligence that combines groups of rules for the reconstruction of ecological niches [87,88]. GARP uses known localities of species occurrence and environmental variables, to produce a model of the species geographic distribution, by relating the locality records of the species with environmental variables, in an iterative process of random rule selection, evaluation, testing and incorporation or rejection [89]. This algorithm has been found to be more effective during transfer to different scenarios [90,91]. Transferability refers to apply a model developed on one scenario to another scenario or to another time in the same area [38].

Algorithm performance was optimized running 100 replicates, selecting the ten best models based on the lowest rates of omission error (proportion of pixel raster of know presence of the species that are predicted absent by the model; maximum 10%) and intermediate rates of commission error (measured as the median of the pixels that are predicted as presence by the models; this is because we have no true absences of the species) [92]. For both seasons, 80% of the records were used to calibrate the models and 20% to evaluate them; this selection was made randomly and out of the program. The evaluation of the model performance was developed using a variant of ROC curve called partial ROC [93] using the Tool for Partial-ROC V.1.0 [94]. The partial ROC analysis generates proportions or ratios with values that range from zero to two, from the proportions described through the ratios of correct identification of presences against the total area predicted by the algorithm [93]. The ratios with values close to one describe a behavior that is similar to chance, and those closer to two, suggest a perform better than random. The partial ROC utilizes the partial area of distribution, which provides a stronger basis for evaluation of the ecological niche model predictions [93], giving more weight to omission errors than to commission errors; and providing predictions with acceptable levels of the former [93]. In contrast, the traditional ROC curve has been criticized [93,95], since underestimates the models that do not provide predictions across the spectrum of areas proportional to that of the study area, and also produces an inappropriate standardization of the weight of the errors of omission and commission, which is dependent on the total area used for modeling.

The distance from each pixel to the centroid of each niche was used as a measure of the internal structure of the niches (reproductive and winter seasons). Based on Maguire's [5] description, niche structure fitness improves as distance to the centroid decreases; thus, there is an array of environmental regions within each niche that are characterized by optimal, suboptimal and marginal climate. In the present study, in contrast to Maguire's [5] proposal, no measures of fitness were taken because it would represent a very expensive and time consuming effort; thus, we only described the internal structure of the niches with respect to their distances to the centroid, though to do so the description of each region as optimal, suboptimal or marginal was retained, in order to have reference points for the different environmental areas within the structure of the niches for the reproductive and winter seasons. To this end, the ecological distance of each pixel to the niche centroid was calculated for each season, using climate variable values corresponding to the cells predicted as potential presence (modeled niche). In order to unify units, each variable was Z standardized (mean = 0, standard deviation = 1), subtracting the mean from each value of the variable and dividing it by its standard



deviation, where the niche centroid was the value of the variables that were equal to zero. Once the niche centroid was estimated, the multidimensional Euclidian distance from each pixel to the centroid was calculated, using the formula:

$$DC = \sqrt{\sum_{i=j}^{n} (y_{ij} - \bar{y}_j)^2}$$

where DC is distance to the niche centroid,  $y_{ij}$  is the value of variable j in population i, and  $\bar{y}_j$  is the mean of variable j [6,7]. The result was a raster with distance values that was reclassified into the categories of optimal, suboptimal and marginal based on more parsimonious cut-offs: optimal (0.043–1.51), suboptimal (1.52–2.9), and marginal (3–4.4). This process was carried out in ArcView 3.2 [96].

### Niche breadth

We used the range of climate conditions described for the geography, based on the presence of individuals of the species (effective niche; *sensu* Soberón [4], Quintero and Wiens [97]) to determine niche breadth for each season and migratory transient months, following a two-step process. The first was to estimate the polar coordinates based on a climate profile of the areas predicted by the models. The polar coordinates consider the different variables as force vector, so that each polar coordinate, X and Y of each season, would be the equilibrium point of all vectors, in other words, of all variables. The component of each vector would be the value of the variable and the angle of each vector would be an assigned value to each variable. Hence, X and Y coordinates, representing all variables used to define the niche of each season, can be plotted [98]. This was done using the EnvNicheR library [99] from R [100].

The second step was to calculate the Minimum Convex Polygon (MCP) described by the polar coordinates for each stage of the cycle, following the method proposed by Pateiro-López y Rodríguez-Casal [101]. This technique identifies the most convex polygon that avoids overestimating the occupied climate area [102]. The area of each MCP was calculated using the *alphahull* package [103] in R [100], which was considered as niche breadth, such that larger areas were interpreted as wider niches.

## Comparison and similarity of seasonal niches

In order to define the similarity among the seasonal niches of the species, we compare their niches through seasonal inter-projection, overlap, and a similarity test as follows.

**Projections.** Models generated for each season were projected onto each other conditions to test their inter-prediction power and consequently their climatic equivalence. Projections were also made onto migratory months (September, October, November and April).

**Overlap.** Overlap of niche breadth, as previously defined, was measured as a percentage of pixels coinciding for both MCP polygons integrating climatic niche, this was done using the EnvNicheR library [99] from R [100].

Similarity analysis. To analyze whether there were any differences between the winter and reproductive season niches [104,105], we used the niche similarity test proposed by Broennimann et al. [104], running the Ecospat package [105] in R [100] and using the PCA-env (PCA calculated on the climatic space). The principal components were calibrated with modeled conditions from both seasons (breeding and winter) which were then associated with occurrence densities on each season. Once the climatic space area is described by the first two PCA axes, the estimated relative species occurrence densities (from a kernel density function) and the relative frequency of the environmental conditions from each season are mapped onto



it. For the similarity test, the overlap between the niches was measured using an observed value of Schoener's D index [106,107] on the occurrence densities, which ranges from 0 (complete differentiation) to 1 (complete similarity). To contrast and interpret the observed values of D, the test also generates null models by recalculating the D overlap values for randomly selected records from the records available for both seasons 100 times; with this information a histogram of estimated (null) values is plotted to compare them with the observed values.

**Migratory route comparison.** In order to determine the conditions of the niche used by the birds during their migration, climate profiles were created for the existent monthly records during this period. These profiles were compared with those from each modeled season and from the projections onto the migration months.

### Results

The generated models, according to the evaluation with the partial ROC, were statistically better than random for both seasons, reproductive (AUC ratio = 1.26; p = 0.001) and wintering (AUC ratio = 1.30; p = 0.001). There were no overlapping areas in the inter-predictions made for both seasons (Fig 1A and 1B). However, they did showed predictive power for migratory months areas. Winter model predicted larger geographic areas of at least 0.6% on the migratory transient zones, while the reproductive model predicted a maximum of 0.3% (Table 1, Fig 2. S1 Fig). It is also worth noticing that winter conditions showed a pattern of movement from north to south as months approach winter season (Fig 2, S1 Fig).

The climate profiles during and throughout the migration route, described by the locality records for each transition month, had little in common with the areas predicted by the projections for winter; October was the month with the most records predicted (22%), and even less with those for the reproductive season, where no record was predicted. In the cases for which the locality records coincided with the projections—which were mainly those of the winter—the record sites were located in suboptimal and marginal zones of the niche (Fig 2). Comparisons

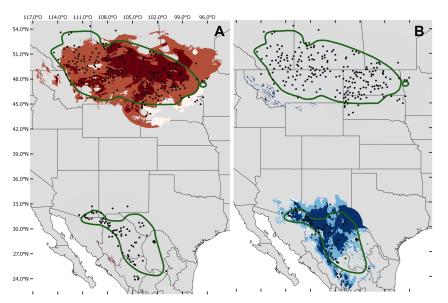


Fig 1. Area predicted for the reproductive season and its projection onto the winter zone (A) and area predicted for the winter season and its projection onto the reproductive zone (B). The green polygons represent the known distribution of Baird's sparrow, according to the IUCN. The northernmost polygon is the reproductive range and the southernmost is the wintering one. Darker colors indicate optimal niche conditions based on their proximity to the centroid.

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Table 1. Percentage of overlap between the minimum convex polygons (PMC) of the bioclimatic conditions models by season and projections to the migration
months of Ammodramus bairdii.

Seasons	Overlap seasons-migration months (%)	Migration Months	Overlap migration months-seasons (%)
Winter	18.14	September	83.5
Winter	58.11	October	55.13
Winter	59.81	November	59.81
Winter	83.75	April	70.33
Reproductive	NA	September	NA
Reproductive	0.24	October	25
Reproductive	0	November	0
Reproductive	1.03	April	10.81

among the climate profiles (for the presence records for each month, for the projections of the reproductive season and winter onto the migratory passage months, and for the models for each season) revealed that the variable that differs the most is precipitation, with the record sites having the highest values except for the month of November (Fig 3; S2 Fig and S3 Fig). Thus, records of *A. bairdii* were denser in climates with more precipitation in the winter and in climates with warmer temperatures during the reproductive season (Fig 3) that in both cases might be correlated with vegetation cover and ultimately favour the species density.

Niche breadth was larger for the winter season (346.6 pixels) than the reproductive one (165.3 pixels). There was an overlap of 45.18% of the climatic niche of the reproductive season with the wintering one, and of 22.47% vice versa (Fig 4).

Niches (winter and reproductive) were not more dissimilar than expected by chance for either the reproductive season niche onto the winter niche, or the winter niche onto the reproductive niche (D = 0; p = 0.44 and p = 0.49, respectively; Figs 5 and 6).

# **Discussion**

It is currently irrefutable that climate exerts a huge effect on the spatial and temporal distribution of species, especially in sites where there are marked seasonal changes throughout the year [108,109]. It has even been suggested that this variability in climate is one of the main reasons, whether direct or indirect, for birds migration, allowing them to live in different climate

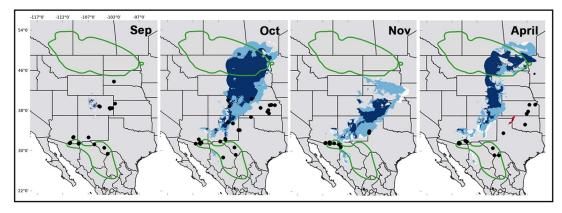


Fig 2. Area predicted by the projection of the conditions of the reproductive season (red) and winter (blue), onto the months of the migratory route of Baird's sparrow. For the month of September the reproductive season conditions were not projected. Darker colors indicate optimal niche conditions based on their proximity to the centroid. Dots correspond to the record localities for each month.

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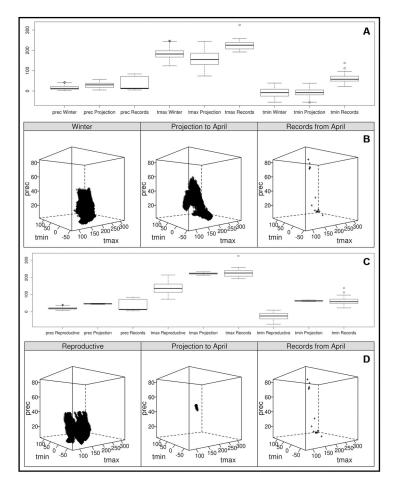


Fig 3. Comparison of the climate profiles of the winter model (panels A and B) and the reproductive season model (panels C and D) for Baird's sparrow, record localities, and projection onto the month of April (prec = precipitation, tmax = maximum temperature, tmin = minimum temperature).

conditions during the reproductive and winter seasons, according to their physiological needs on each one [27,36,110–112].

Our results show that the patterns described for *Ammodramus bairdii* are complex in terms of climate. For example, 77% of winter niche breadths for the reproductive and winter seasons did not overlap, suggesting that *A. bairdii* is a niche switcher (*sensu* Nakazawa et al. [27]); however, their dissimilarity did not perform better than chance (D=0 in both directions). Also, the projection of the winter model toward the transient months revealed a wider climate (and geographical represented) niche. There is an accepted idea that temperate species have wider niches [113] in response to strong climatic seasonality [97]. In contrast, the transfers of the reproductive conditions toward the transition months indicated greater spatial restriction.

Recalling that the niche of the species is the sum of conditions used throughout the annual cycle, it is likely that the niche is greater than the one defined using only breeding and wintering seasons. Migratory transient months showed in all cases exclusive climate conditions, with no overlapping with the optimal conditions of the reproductive nor wintering seasons. In other words, the climate space (Grinnellian niche) used by *A. bairdii* is composed of partially differentiated climatic conditions during each stage of the migratory annual cycle. However due to the climate seasonality, the species only has access to the conditions present in the



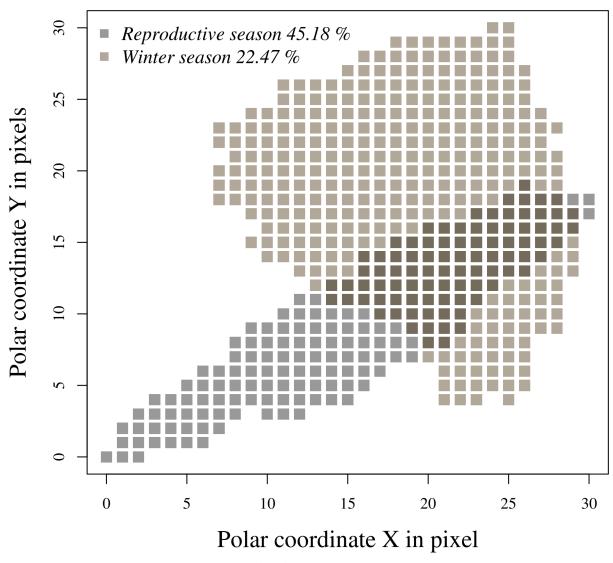


Fig 4. Percent overlap of the minimum convex polygons (MCP) for the polar coordinates of the reproductive season and winter of Baird's sparrow. Polar coordinates were created based on the climate profile for each model.

geographic space [114–116], hence it uses different climatic conditions in each stages (niche switcher).

Based on the structure of the climate niche, the migratory records were mostly associated with predicted marginal conditions. This could result from a directed migration strategy, probably due to characteristics other than climate, such as the wind, which has a huge influence on energy expenditure [117–119], or fine-scale factors (the hypothesis of Eltonian noise [120]), such as areas with vegetation characteristics that offer more feeding resources [56,60–62]] and allows avoidance of potential antagonistic interactions and predation [121–124].

Our results suggest that this species occupies different climate conditions during its annual cycle, although the migratory route has several knowledge gaps. Migratory routes analysis has received little attention in spite of its importance on the individual survival, molt, timing of arrival, reproductive success, population size and dynamics [13,86,125–128]. In fact, the specific geographic migration routes are not known for the majority of species, with only rough



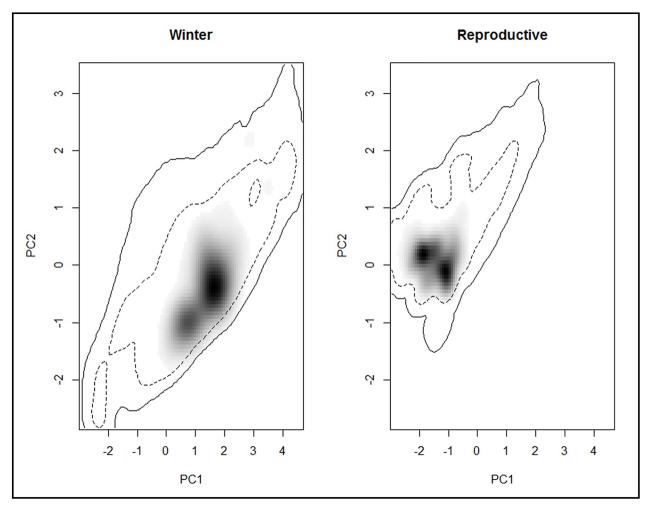


Fig 5. Conditions of each seasons' niche occupied by Baird's sparrow. The niche is represented by the first two PCA axes. Gray shading represents the density of occurrence of individual birds in the climatic space. The dotted line and the solid line represent 50% and 100%, respectively, of all of the environment available to the species.

descriptions of their movements available. Furthermore, in spite of the role that climate could be playing in the process of determining migratory patterns, there are still too few studies describing and analyzing the climate niches for migratory routes [24,31], though this areas are critical for the involved populations, given the high mortality rates that occur along them [129].

Owing to the limited number of records for the transitional months, it is possible that the climate conditions used by this species over the course of its migratory cycle are not fully represented. But again, it highlights the importance of focusing efforts on studying the migratory routes of birds, especially when their habitats are particularly exposed to high rates of transformation and loss, as with the North American grasslands [49–55].

Now, despite there are different specific climate conditions on each of the stages of its migratory annual cycle, *A. bairdii* does maintain its use of grasslands throughout it [56,58,60–63], which is related with its selection of a specific type of vegetation, a component of its niche we did not include in our analyses, but that has been associated with nesting site selection, food availability, and predation risk, among others, and that ultimately affects its reproductive success [18,59] and overwintering survival [41,130,131]. Although the loss of 80% of grasslands

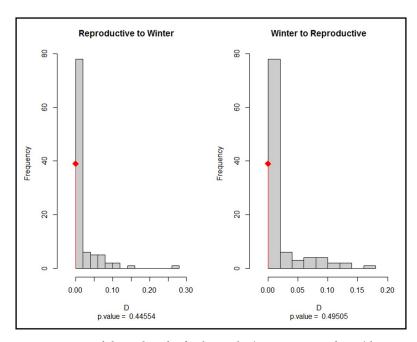


Fig 6. Histograms of observed overlap for the *D* index (Broennimann et al. 2012) between winter and the reproductive season (red lines) data for Baird's sparrow with the null model (gray bars) for the niche similarity test. The histogram corresponding to the niche similarity of the winter niche in the reproductive zone (right) and the similarity of the reproductive season niche in the wintering zone (left).

in the Great Plains of North America [53–55] has played a major role on its population decline over the past five decades [48,66], probably climate change will increase the pressure on this ecosystem and its associated bird species on different aspects. Vegetation cover will be differently affected on the northern (declined in late summer) and southern (increased in autumn and winter) areas [132].

Changes in the precipitation variability will increase stress in plants and change towards a plant community with more xeric-affinity species [133]. Migratory birds are particularly prone to high risk under climate change [134–136], since it will alter migration timing: has been observed that short-distance migrants will arrive earlier in spring and later in autumn, while long-distance migrants will leave earlier on the autumn. For example, it has been report that more than a half of migratory species breeding at the northern Great Plains of North America arrived earlier at their reproductive areas in the last 10 years [137,138].

Climate change also will have an effect on the extent of habitat for birds, some species showing potential losses and other potential gains [132,135]. In the case of *A. bairdii* Peterson [65] have suggested a contraction of its breeding range, to current south-central area. Its winter distribution will also undergo severe changes, with local extinctions predicted for the Chihuahan desert [139], where a decrease of 6–11% of winter moisture is predicted in Mexico [136]. However, these analyses did not consider the seasonality of the climatic conditions, which are key to understand its annual cycle [42,45,69,71,75,78]. Thus is important to analyze the effect of climatic change on each stage of the annual migration cycle of the migratory grassland birds.

It is necessary to increase the knowledge about the biological processes involved, in order to understand species migration, including intra- and inter-specific interactions that intervene differentially depending on season, although mainly in overwintering and transitional areas. There is a lack of information not just for *A. bairdii*, but for most of the migratory grassland birds, with respect to its overwintering and migration areas about, among others, vegetation



structure and composition, diet, survival rates and the factors affecting these [21,140,141]. Analyzing the relationship between the structure of ecological niches (*sensu* Maguire [5]) and the way they are occupied along the migratory routes, is fundamental to improve our understanding of the ecological patterns and processes that define the geographic distribution areas, and to understand the nature of the spatio-temporal relationship of the environment on different migratory species.

# Supporting information

S1 Fig. Percentage of overlap of the minimum convex polygons (MCP) for the polar coordinates of each season and theirs projection to each transition month. The polygons were create from the climate profile of models and projection respectively. (PDF)

S2 Fig. Comparison of the climate profile of each season, their projections to each transition month and records from each month. (pre = precipitation, tmax = max temperature, tmin = min temperature). (PDF)

S3 Fig. Comparison of the climate profiles of both season model, projection onto the month and record localities from each month. (prec = precipitation, tmax = maximum temperature, tmin = minimum temperature). (PDF)

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### **Author Contributions**

**Conceptualization:** Alexander Peña-Peniche, Octavio Rojas-Soto.

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#### References

- Grinnell J. The Niche-Relationships of the California Thrasher. Auk. 1917; 34: 427–433. <a href="https://doi.org/10.2307/4072271">https://doi.org/10.2307/4072271</a>
- Hutchinson GE. Concluding remarks. Cold Spring Harb Symp Quant Biol. 1957; 22: 415–427. https://doi.org/10.1101/SQB.1957.022.01.039
- Pearson RG, Dawson TP. Predicting the impacts of climate change on the distribution of species: are bioclimate envelope models useful? Glob Ecol Biogeogr. 2003; 12: 361–371. <a href="https://doi.org/10.1046/j.1466-822X.2003.00042.x">https://doi.org/10.1046/j.1466-822X.2003.00042.x</a>
- Soberón J. Grinnellian and Eltonian niches and geographic distributions of species. Ecol Lett. 2007; 10: 1115–1123. https://doi.org/10.1111/j.1461-0248.2007.01107.x PMID: 17850335
- 5. Maguire B. Niche Response Structure and the Analytical Potentials of Its Relationship to the Habitat. Am Nat. 1973; 107: 213–246. https://doi.org/10.1086/282827
- Yañez-Arenas C, Martínez-Meyer E, Mandujano S, Rojas-Soto O. Modelling geographic patterns of population density of the white-tailed deer in central Mexico by implementing ecological niche theory. Oikos. 2012; 121: 2081–2089. https://doi.org/10.1111/j.1600-0706.2012.20350.x
- Martínez-Meyer E, Díaz-Porras D, Peterson AT, Yáñez-Arenas C. Ecological niche structure and rangewide abundance patterns of species. Biol Lett. 2013; 9: 20120637. https://doi.org/10.1098/rsbl. 2012.0637 PMID: 23134784
- Lira-Noriega A, Manthey JD. Relationship of genetic diversity and niche centrality: A survey and analysis. Evolution (N Y). 2014; 68: 1082–1093. https://doi.org/10.1111/evo.12343 PMID: 24372193
- Manthey JD, Campbell LP, Saupe EE, Soberón J, Hensz CM, Myers CE, et al. A test of niche centrality as a determinant of population trends and conservation status in threatened and endangered North American birds. Endanger Species Res. 2015; 26: 201–208. https://doi.org/10.3354/esr00646
- Ureña-Aranda CA, Rojas-Soto O, Martínez-Meyer E, Yáñez-Arenas C, Ramírez RL, De Los Monteros AE. Using range-wide abundance modeling to identify key conservation areas for the micro-endemic Bolson tortoise (Gopherus flavomarginatus). PLoS One. 2015; 10: 1–14. https://doi.org/10.1371/ journal.pone.0131452 PMID: 26115482
- 11. Herkert JR, Sample DW, Warner RE. Management of grassland landscapes for the conservation of migratory birds. In: Thompon FR III, editor. Managing Midwest landscapes for the conservation of Neotropical migratory birds General Technical Report NC-187. USA: U.S. Forest Service, North Central Forest Experiment Station, St. Paul, Minnesota; 1996. pp. 89–116.
- Igl LD, Ballard BM. Habitat associations of migrating and overwintering grassland birds in southern Texas. Condor. 1999; 101: 771–782. https://doi.org/10.2307/1370064
- Marra P, Hobson KA, Holmes RT. Linking Winter and Summer Events in a Migratory Bird by Using Stable-Carbon Isotopes. Science. 1998; 282: 1884–1886. https://doi.org/10.1126/science.282.5395. 1884 PMID: 9836637
- Sillett TS, Holmes RT. Variation in survivorship of a migratory songbird throughout its annual cycle. J Anim Ecol. 2002; 71: 296–308. https://doi.org/10.1046/j.1365-2656.2002.00599.x
- Newton I. Population limitation in migrants. Ibis (Lond 1859). 2004; 146: 197–226. https://doi.org/10. 1111/j.1474-919X.2004.00293.x
- 16. Bairlein F. The study of bird migrations—some future perspectives: Capsule routes and destinations have been unveiled but modern techniques offer the chance to explore much more. Bird Study. 2003; 50: 243–253. https://doi.org/10.1080/00063650309461317
- Sanderson FJ, Donald PF, Pain DJ, Burfield IJ, van Bommel FPJ. Long-term population declines in Afro-Palearctic migrant birds. Biol Conserv. 2006; 131: 93–105. https://doi.org/10.1016/j.biocon.2006.02.008
- 18. Wiggings DA. Baird 's Sparrow (Ammodramus bairdii): A technical conservation assessment. 2006.
- Stutchbury BJM, Tarof SA, Done T, Gow E, Kramer PM, Tautin J, et al. Tracking Long-Distance Songbird Migration by Using Geolocators. Science. 2009; 323: 896–896. <a href="https://doi.org/10.1126/science.1166664">https://doi.org/10.1126/science.1166664</a> PMID: 19213909



- Wilson S, LaDeau SL, Tøttrup AP, Marra PP. Range-wide effects of breeding- and nonbreeding-season climate on the abundance of a Neotropical migrant songbird. Ecology. 2011; 92: 1789–1798. https://doi.org/10.1890/10-1757.1 PMID: 21939075
- 21. Rappole J, McDonald M. Cause and Effect in Population Declines of Migratory Birds. Auk. 1994; 111: 652–660.
- 22. Fletcher RJ, Koford RR, Seaman D a. Critical Demographic Parameters for Declining Songbirds Breeding in Restored Grasslands. 2006; 70: 145–157. https://doi.org/10.2193/0022-541X(2006)70 [145:CDPFDS]2.0.CO;2
- Norris RD, Marra PP. Seasonal Interactions, Habitat Quality, and Population Dynamics in Migratory Birds. Condor. 2007; 109: 535. https://doi.org/10.1650/8350.1
- 24. Hahn S, Amrhein V, Zehtindijev P, Liechti F. Strong migratory connectivity and seasonally shifting isotopic niches in geographically separated populations of a long-distance migrating songbird. Oecologia. 2013; 173: 1217–1225. https://doi.org/10.1007/s00442-013-2726-4 PMID: 23839267
- 25. Monroe AP, O'Connell TJ. Winter bird habitat use in a heterogeneous tallgrass prairie. Am Midl Nat. 2014; 171: 97–115. https://doi.org/10.1674/0003-0031-171.1.97
- Joseph L, Wilke T, Alpers D. Independent evolution of migration on the South American landscape in a long-distance temperate-tropical migratory bird, Swainson's flycatcher (Myiarchus swainsoni). J Biogeogr. 2003; 30: 925–937. https://doi.org/10.1046/j.1365-2699.2003.00841.x
- Nakazawa Y, Peterson AT, Martínez-Meyer E, Navarro-Sigüenza AG. Seasonal Niches of Nearctic-Neotropical Migratory Birds: Implications for the Evolution of Migration. Auk. 2004; 121: 610–618. https://doi.org/10.2307/4090425
- 28. Deppe JL, Rotenberry JT. Scale-Dependent Habitat Use by Fall Migratory Birds: Vegetation Structure, Floristics, and Geography. Ecol Monogr. 2008; 78: 461–487. https://doi.org/10.1890/07-0163.1
- Marini MÂ, Barbet-Massin M, Lopes LE, Jiguet F. Geographic and seasonal distribution of the Cocktailed Tyrant (Alectrurus tricolor) inferred from niche modeling. J Ornithol. 2013; 154: 393–402. https:// doi.org/10.1007/s10336-012-0903-6
- Joseph L. Preliminary climatic overview of migration patterns in South American austral migrant Passerines. Ecotropica. 1996; 2: 185–193.
- Joseph L, Stockwell D. Temperature-based models of the migration of Swainson's Flycatcher (Myiarchus swainsoni) across South America: A new use for museum specimens of migratory birds. Proc Acad Nat Sci Philadelphia. 2000; 150: 293–300. http://www.jstor.org/stable/4065073
- Martínez-Meyer E, Peterson AT, Navarro-Sigüenza AG. Evolution of seasonal ecological niches in the Passerina buntings (Aves: Cardinalidae). Proc Biol Sci. 2004; 271: 1151–7. https://doi.org/10.1098/ rspb.2003.2564 PMID: 15306365
- **33.** Ruiz-Sánchez A, Renton K, Landgrave-Ramírez R, Mora-Aguilar EF, Rojas-Soto O. Ecological niche variation in the Wilson's warbler Cardellina pusilla complex. J Avian Biol. 2015; 46: 516–527. https://doi.org/10.1111/jav.00531
- Pérez-Moreno H, Martínez-Meyer E, Soberón Mainero J, Rojas-Soto O. Climatic patterns in the establishment of wintering areas by North American migratory birds. Ecol Evol. 2016; 6: 2022–2033. https:// doi.org/10.1002/ece3.1973 PMID: 27099707
- Tobón-Sampedro A, Rojas-Soto OR. The geographic and seasonal potential distribution of the little known Fuertes's Oriole Icterus fuertesi. Bird Conserv Int. 2015; 25: 489–502. https://doi.org/10.1017/ S0959270914000501
- 36. Gómez C, Tenorio EA, Montoya P, Cadena CD. Niche-tracking migrants and niche- switching residents: evolution of climatic niches in New World warblers (Parulidae). Proc R Soc B Biol Sci. 2016; 283: 20152458. doi:rspb.2015.2458
- Peterson AT, Soberón J, Sanchez-Cordero V. Conservatism of ecological niches in evolutionary time. Science. 1999; 285: 1265–1267. <a href="https://doi.org/10.1126/science.285.5431.1265">https://doi.org/10.1126/science.285.5431.1265</a> PMID: 10455053
- **38.** Peterson AT, Soberón J, Pearson RG, Anderson RP, Martínez-Meyer E, Nakamura M, et al. Ecological niches and geographic distributions. Princeton University Press. New Jersey: 2011.
- Soberón J, Peterson AT. Interpretation of models of fundamental ecological niches and species' distributional areas. Biodivers Informatics. 2005; 2: 1–10. https://doi.org/10.17161/bi.v2i0.4
- **40.** Peterson AT, Cohoon KP. Sensitivity of distributional prediction algorithms to geographic data completeness. Ecol Modell. 1999; 117: 159–164. https://doi.org/10.1016/S0304-3800(99)00023-X
- Laube I, Graham CH, Böhning-Gaese K. Niche availability in space and time: migration in Sylvia warblers. J Biogeogr. 2015; 42: 1896–1906. https://doi.org/10.1111/jbi.12565



- Cardador L, Sardà-Palomera F, Carrete M, Mañosa S. Incorporating spatial constraints in different periods of the annual cycle improves species distribution model performance for a highly mobile bird species. Divers Distrib. 2014; 20: 515–528. https://doi.org/10.1111/ddi.12156
- **43.** Marini MÂ, Barbet-Massin M, Martinez J, Prestes NP, Jiguet F. Applying ecological niche modelling to plan conservation actions for the Red-spectacled Amazon (Amazona pretrei). Biol Conserv. Elsevier Ltd; 2010; 143: 102–112. https://doi.org/10.1016/j.biocon.2009.09.009
- Lloyd Penn, Palmer Antony R, Lloyd P, Palmer AR. Abiotic factors as predictors of distribution in southern African Bulbuls. Auk. 1998; 115: 404–411. Available: http://www.jstor.org/stable/4089199
- **45.** Carroll C, Zielinski WJ, Noss RF. Using presence-absence data to build and test spatial habitat models for the fisher in the Klamath region, U.S.A. Conserv Biol. 1999; 13: 1344–1359. https://doi.org/10. 1046/j.1523-1739.1999.98364.x
- Manel S, Dias JM, Buckton ST, Ormerod SJ. Alternative methods for predicting species distribution: an illustration with Himilayan river birds. J Appl Ecol. 1999; 36: 734–747. https://doi.org/10.1046/j. 1365-2664.1999.00440.x
- Sauer JR, Link W a. Analysis of the North American Breeding Bird Survey Using Hierarchical Models. Auk. 2011; 128: 87–98. https://doi.org/10.1525/auk.2010.09220
- Sauer JR, Niven DK, Hines JE, Fallon JE, Pardieck KL, Ziolkowski Jr. DJ, et al. The North American breeding bird survey, results and analysis 1966–2015. Version 2.07.2017. USGS Patuxent Wildlife Research Center, Laurel, MD. 2017. https://doi.org/10.1111/jav.00319
- **49.** Dinerstein E, Olson D, Atchley J, Loucks C, Contreras-Balderas S, Abell R, et al. Ecoregion-based conservation in the Chihuahuan Desert. A Biological Assessment. Nature. 2001; 376.
- 50. Hoyt C a. The Chihuahuan Desert: diversity at risk. Endanger Species Bull. 2002; XXVII: 16–17.
- Macias-Duarte A, Panjabi AO, Pool D, Youngberg E, Levandoski G. Wintering grassland bird density in Chihuahuan Desert grassland priority conservation areas, 2007–2011. 2011; 164.
- Pool DB, Panjabi AO, Macias-Duarte A, Solhjem DM. Rapid expansion of croplands in Chihuahua, Mexico threatens declining North American grassland bird species. Biol Conserv. Elsevier Ltd; 2014; 170: 274–281. https://doi.org/10.1016/j.biocon.2013.12.019
- Samson F, Knopf F. Prairie Conservation in North America. Bioscience. 1994; 44: 418–421. https://doi.org/10.2307/1312365
- Samson FB, Knopf FL, Ostlie WR. Great Plains Ecosystems: past, present, and future. Wildl Soc Bull. 2004; 32: 6–15. https://doi.org/10.2193/0091-7648(2004)32[6:GPEPPA]2.0.CO;2
- 55. White R, Murray S, Rohweder M. Pilot analysis of global ecosystems: grassland ecosystems. [Internet]. World Resources Institute. 2000. https://doi.org/10.1021/es0032881
- **56.** Sutter GC, Troupe T, Forbes M. Abundance of Baird's sparrows, Ammodramus bairdii, in native prairie and introduced vegetation. EcoScience. 1995; 2: 344–348.
- 57. Davis SK, Sealy SG. Nesting biology of the Baird's Sparrow in southwestern Manitoba. Wilson Bull. 1998; 110: 262–270.
- 58. Davis SK, Duncan D, Skeel M. Distribution and habitat associations of three endemic grassland songbirds in southern Saskatchewan. Wilson Bull. 1999; 111: 389–396. Available: <a href="http://cat.inist.fr/?aModele=afficheN&cpsidt=1968054">http://cat.inist.fr/?aModele=afficheN&cpsidt=1968054</a>
- Sutter B, Ritchison G. Effects of grazing on vegetation structure, prey availability, and reproductive success of Grasshopper Sparrows. J F Ornithol. Association of Field Ornithologists; 2005; 76: 345– 351. https://doi.org/10.1648/0273-8570-76.4.345
- **60.** Martínez-Guerrero JH, Wehenkel C, Pereda-Solís ME, Panjabi A, Levandoski G, Corral Rivas J, et al. Relación entre la cobertura de suelo y atributos de la vegetación invernal con Ammodramus bairdi, Audubon 1844, en el Noroeste de México. Agrociencia. 2011; 45: 443–451.
- Pool DB, Macias-Duarte A, Panjabi AO, Levandoski G, Youngberg E. Chihuahuan Desert Grassland Bird Conservation Plan version 1.0. Rocky Mountain Bird Observatory. Brighton, CO. RMBO Technical Report 1-RGJV-11\_01. 2012.
- **62.** Green MT, Lowther PE, Jones SL, Davis SK, Dale BC. Baird's Sparrow (Ammodramus bairdii). Poole A, Gill F, editors. Birds North Am Online. 2002; https://doi.org/10.2173/bna.638
- Luce R, Keinath D. Species assessment for Baids's Sparrow (Ammodramus Bairdii) in Wyoming. Cheyenne; 2003.
- Vickery P, Herkert J. Recent advances in grassland bird research: where do we go from here? Auk. 2001; 118: 11–15. https://doi.org/10.1642/0004-8038(2001)118[0011:RAIGBR]2.0.CO;2
- 65. Peterson AT. Projected climate change effects on Rocky Mountain and Great Plains birds: generalities of biodiversity consequences. Glob Chang Biol. 2003; 9: 647–655. https://doi.org/10.1046/j.1365-2486.2003.00616.x



- 66. Brennan L a., Kuvlesky WP. North American grassland birds: an unfolding conservation crisis? J Wildl Manage. 2005; 69: 1–13. https://doi.org/10.2193/0022-541X(2005)069<0001:NAGBAU>2.0.CO;2
- 67. Cartwright BW, Shortt TM, Harris RD. Baird's Sparrow. Contrib R Ontario Mus Zool, no 11 Trans R Can Inst, no 46, vol 21, pt. 1937; 2: 153–198.
- **68.** Peterson AT, Navarro-Sigüenza AG, Benítez-Díaz H. The need for continued scientific collecting; a geographic analysis of Mexican bird specimens. Ibis (Lond 1859). 2008; 140: 288–294. https://doi.org/10.1111/j.1474-919X.1998.tb04391.x
- 69. Heikkinen RK, Luoto M, Virkkala R. Does seasonal fine-tuning of climatic variables improve the performance of bioclimatic envelope models for migratory birds? Divers Distrib. 2006; 12: 502–510. https://doi.org/10.1111/j.1366-9516.2006.00284.x
- 70. Frans VF, Augé AA, Edelhoff H, Erasmi S, Balkenhol N, Engler JO. Quantifying apart what belongs together: A multi-state species distribution modelling framework for species using distinct habitats. Methods Ecol Evol. 2018; 9: 98–108. https://doi.org/10.1111/2041-210X.12847
- Williams HM, Willemoes M, Thorup K. A temporally explicit species distribution model for a long distance avian migrant, the common cuckoo. J Avian Biol. 2017; 48: 1624–1636. <a href="https://doi.org/10.1111/jav.01476">https://doi.org/10.1111/jav.01476</a>
- Hijmans RJ, Cameron SE, Parra JL, Jones PG, Jarvis A. Very high resolution interpolated climate surfaces for global land areas. Int J Climatol. 2005; 25: 1965–1978. https://doi.org/10.1002/joc.1276
- 73. IPCC. Climate Change 2013—The Physical Science Basis [Internet]. Intergovernmental Panel on Climate Change, editor. Contribution of working groups I, II and III to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change. In: Core Writing Team, Pachauri RK, Meyer LA (eds) IPCC, Geneva, Switzerland, 151 p. Cambridge: Cambridge University Press; 2014. <a href="https://doi.org/10.1017/CBO9781107415324">https://doi.org/10.1017/CBO9781107415324</a>
- Eyres A, Böhning-Gaese K, Fritz SA. Quantification of climatic niches in birds: adding the temporal dimension. J Avian Biol. 2017; 48: 1517–1531. https://doi.org/10.1111/jav.01308
- **75.** Gschweng M, Kalko EKV, Berthold P, Fiedler W, Fahr J. Multi-temporal distribution modelling with satellite tracking data: Predicting responses of a long-distance migrant to changing environmental conditions. J Appl Ecol. 2012; 49: 803–813. https://doi.org/10.1111/j.1365-2664.2012.02170.x
- 76. Limiñana R, Arroyo B, Terraube J, McGrady M, Mougeot F. Using satellite telemetry and environmental niche modelling to inform conservation targets for a long-distance migratory raptor in its wintering grounds. Oryx. 2015; 49: 329–337. https://doi.org/10.1017/S0030605313001075
- Engler JO, Rödder D, Stiels D, Förschler MI. Suitable, reachable but not colonized: seasonal niche duality in an endemic mountainous songbird. J Ornithol. 2014; 155: 657–669. https://doi.org/10.1007/ s10336-014-1049-5
- 78. Engler JO, Stiels D, Schidelko K, Strubbe D, Quillfeldt P, Brambilla M. Avian SDMs: current state, challenges, and opportunities. J Avian Biol. 2017; 48: 1483–1504. https://doi.org/10.1111/jav.01248
- Rising JD, Beadle DD. A Guide to the identification and natural Hhstory of the sparrows of the United States and Canada [Internet]. Bloomsbury Publishing; 2010.
- Rising J, Marks J. Baird's Sparrow (Ammodramus bairdii). In: el Hoyo J, Elliott A, Sargatal J, C DA., de Juana E, editors. Handbook of the Birds of the World Alive. Lynx Edicions; 2014.
- 81. Ahlering MA, Johnson DH, Faaborg J. Factors associated with arrival densities of Grasshopper Sparrow (Ammodramus savannarum) and Baird's Sparrow (A. bairdii) in the Upper Great Plains. Auk. 2009; 126: 799–808. https://doi.org/10.1525/auk.2009.08154
- **82.** COSEWIC. COSEWIC. Assessment and status report on the Baird's Sparrow Ammodramus bairdii in Canada. 2012.
- Dechant JA, Sondreal ML, Johnson DH, Igl LD, Goldade CM, Nenneman M, et al. Effects of management practices on grassland birds: Baird's Sparrow. USGS North Prairie Wildl Res Cent. 2002; 125: 1–17. Available: http://www.npwrc.usgs.gov/resource/literatr/grasbird/savs/savs.htm
- 84. Macías-Duarte A, Montoya AB, Méndez-González CE, Rodríguez-Salazar JR, Hunt WG, Krannitz PG. Factors influencing habitat use by migratory grassland birds in the State of Chihuahua, Mexico. Auk. 2009; 126: 896–905. https://doi.org/10.1525/auk.2009.08251
- 85. Ruth JM, Stanley TR, Gordon CE. Associations of wintering birds with habitat in semidesert and plains grasslands in Arizona. Southwest Nat. 2014; 59: 199–211. https://doi.org/10.1894/F07-GDS-13.1
- **86.** Voelker G. Can migrants do it faster? Accelerated molt of Baird's Sparrows and further insights into southwestern molting grounds. Condor. 2004; 106: 910–914. Available: isi:000225013200019
- 87. Stockwell DRB, Noble IR. Induction of sets of rules from animal distribution data: A robust and informative method of data analysis. Math Comput Simul. 1992; 33: 385–390. https://doi.org/10.1016/0378-4754(92)90126-2



- Stockwell D, Peters D. The GARP modelling system: problems and solutions to automated spatial prediction. Int J Geogr Inf Sci. 1999; 13: 143–158. https://doi.org/10.1080/136588199241391
- 89. Peterson AT, Ball LG, Cohoon KP. Predicting distributions of Mexican birds using ecological niche modelling methods. Ibis (Lond 1859). 2002; 144: E27–E32. <a href="https://doi.org/10.1046/j.0019-1019.2001.00031.x">https://doi.org/10.1046/j.0019-1019.2001.00031.x</a>
- Peterson AT, Papeş M, Eaton M. Transferability and model evaluation in ecological niche modeling: A comparison of GARP and Maxent. Ecography (Cop). 2007; 30: 550–560. <a href="https://doi.org/10.1111/j.2007.0906-7590.05102.x">https://doi.org/10.1111/j.2007.0906-7590.05102.x</a>
- 91. Tsoar A, Allouche O, Steinitz O, Rotem D, Kadmon R. A comparative evaluation of presence-only methods for modelling species distribution. Divers Distrib. 2007; 13: 397–405. https://doi.org/10.1111/j.1472-4642.2007.00346.x
- 92. Anderson RP, Lew D, Peterson AT. Evaluating predictive models of species' distributions: criteria for selecting optimal models. Ecol Modell. 2003; 162: 211–232. https://doi.org/10.1016/S0304-3800(02) 00349-6
- Peterson AT, Papeş M, Soberón J. Rethinking receiver operating characteristic analysis applications in ecological niche modeling. Ecol Modell. 2008; 213: 63–72. <a href="https://doi.org/10.1016/j.ecolmodel.2007.11.008">https://doi.org/10.1016/j.ecolmodel.2007.11.008</a>
- 94. Barve N. Tool for Partial-ROC. Lawrence: Biodiversity Institute, Lawrence Kansas; 2008.
- Lobo JM, Jiménez-Valverde A, Real R. AUC: a misleading measure of the performance of predictive distribution models. Glob Ecol Biogeogr. 2008; 17: 145–151. https://doi.org/10.1111/j.1466-8238. 2007.00358.x
- 96. ESRI. ArcView GIS, V.3.2. Environmental Systems Research Institute Inc., California; 1999.
- Quintero I, Wiens JJ. What determines the climatic niche width of species? The role of spatial and temporal climatic variation in three vertebrate clades. Glob Ecol Biogeogr. 2013; 22: 422–432. <a href="https://doi.org/10.1111/geb.12001">https://doi.org/10.1111/geb.12001</a>
- Guisande C, Barreiro A, Maneiro I, Riveiro I, Vergara A, Vaamonde A. Tratamiendo de datos. 1st ed. Ediciones Díaz de Santos: 2006.
- Guisande C. EnvNicheR: Niche. Niche estimation. R package version 1.4. <a href="https://CRAN.R-project.org/package=EnvNicheR.">https://CRAN.R-project.org/package=EnvNicheR.</a>; 2014.
- **100.** R Core Team. R. R Core Team. 2015. doi:3-900051-14-3
- 101. Pateiro-López B, Rodríguez-Casal A. Generalizing the convex hull of a sample: the R Package alpha-hull. J Stat Softw. 2010; 34: 1–28. https://doi.org/10.18637/jss.v034.i05
- 102. Edelsbrunner H, Kirkpatrick D, Seidel R. On the shape of a set of points in the plane. IEEE Trans Inf Theory. 1983; 29: 551–559. https://doi.org/10.1109/TIT.1983.1056714
- **103.** Pateiro-López B, Rodríguez-Casal A. The alphahull: generalization of the convex hull of a sample of points in plane. R Package version 2.1. https://CRAN.R-project.org/package=alphahull.; 2015.
- 104. Broennimann O, Fitzpatrick MC, Pearman PB, Petitpierre B, Pellissier L, Yoccoz NG, et al. Measuring ecological niche overlap from occurrence and spatial environmental data. Glob Ecol Biogeogr. 2012; 21: 481–497. https://doi.org/10.1111/j.1466-8238.2011.00698.x
- 105. Di Cola V, Broennimann O, Petitpierre B, Breiner FT, D'Amen M, Randin C, et al. ecospat: an R package to support spatial analyses and modeling of species niches and distributions. Ecography (Cop). 2017; 40: 774–787. https://doi.org/10.1111/ecog.02671
- 106. Schoener TW. Nonsynchronous Spatial Overlap of Lizards in Patchy Habitats. Ecology. 1970; 51: 408–418. https://doi.org/10.2307/1935376
- 107. Warren DL, Glor RE, Turelli M. Environmental niche equivalency versus conservatism: Quantitative approaches to niche evolution. Evolution (N Y). 2008; 62: 2868–2883. <a href="https://doi.org/10.1111/j.1558-5646.2008.00482.x">https://doi.org/10.1111/j.1558-5646.2008.00482.x</a> PMID: 18752605
- 108. Monahan WB. A mechanistic niche model for measuring species' distributional responses to seasonal temperature gradients. PLoS One. 2009; 4: e7921. https://doi.org/10.1371/journal.pone.0007921 PMID: 19936234
- Tingley MW, Monahan WB, Beissinger SR, Moritz C. Birds track their Grinnellian niche through a century of climate change. Proc Natl Acad Sci. 2009; 106: 19637–19643. https://doi.org/10.1073/pnas.0901562106 PMID: 19805037
- 110. Rappole JH. Ecology of migrant birds: a Neotropical perspective. D.C.: Smithsonian Inst. Press.; 1995.
- Somveille M, Rodrigues ASL, Manica A. Why do birds migrate? A macroecological perspective. Glob Ecol Biogeogr. 2015; 24: 664–674. https://doi.org/10.1111/geb.12298



- 112. Zink RM, Gardner AS. Glaciation as a migratory switch. Sci Adv. 2017; 3: 1–9. https://doi.org/10.1126/sciadv.1603133 PMID: 28948216
- 113. Janzen DH. Why Mountain passes are higher in the Tropics. Am Nat. 1967; 101: 233–249. https://doi.org/10.1086/282487
- 114. Colwell RK, Rangel TF. Hutchinson's duality: The once and future niche. Proc Natl Acad Sci. 2009; 106: 19651–19658. https://doi.org/10.1073/pnas.0901650106 PMID: 19805163
- 115. Soberón J, Nakamura M. Niches and distributional areas: Concepts, methods, and assumptions. Proc Natl Acad Sci. 2009; 106: 19644–19650. https://doi.org/10.1073/pnas.0901637106 PMID: 19805041
- 116. Soberón J, Arroyo-Peña B, Bykova O, Cramer M, Chuine I, Gerstner E-M, et al. Are fundamental niches larger than the realized? Testing a 50-year-old prediction by Hutchinson. PLoS One. 2017; 12: e0175138. https://doi.org/10.1371/journal.pone.0175138 PMID: 28403170
- 117. Gauthreaux SA. The Flight Behavior of Migrating Birds in Changing Wind Fields: Radar and Visual Analyses. Am Zool. 1991; 31: 187–204. https://doi.org/10.1093/icb/31.1.187
- 118. Alerstam T. Detours in bird migration. J Theor Biol. 2001; 209: 319–331. <a href="https://doi.org/10.1006/jtbi.2001.2266">https://doi.org/10.1006/jtbi.2001.2266</a> PMID: 11312592
- Nilsson C, Klaassen RHG, Alerstam T. Differences in speed and duration of bird migration between spring and autumn. Am Nat. 2013; 181: 837–845. https://doi.org/10.1086/670335 PMID: 23669545
- 120. Araújo MB, Luoto M. The importance of biotic interactions for modelling species distributions under climate change. Glob Ecol Biogeogr. 2007; 16: 743–753. <a href="https://doi.org/10.1111/j.1466-8238.2007.">https://doi.org/10.1111/j.1466-8238.2007.</a>
- **121.** Hutto RL. Habitat selection by nonbreeding, migratory land birds. Habitat Sel Birds. 1985; 455–476. https://doi.org/10.1038/134152a0
- **122.** Hutto RL. On the imporance of en route periods to the conservation of migratory landbirds. Stud Avian Biol. 2000; 20: 109–114.
- **123.** Petit DR. Habitat use by landbirds along Nearctic- Neotropical migration routes: implications conservation of stopover habitats. Stud Avian Biol. 2000; 15–33.
- 124. Newton I. The migration ecology of birds. London: Academic Press; 2008.
- 125. Sillett TS, Holmes RT, Sherry TW. Impacts of a global climate cycle on population dynamics of a migratory songbird. Science. 2000; 288: 2040–2. <a href="https://doi.org/10.1126/science.288.5473.2040">https://doi.org/10.1126/science.288.5473.2040</a> PMID: 10856216
- 126. Heglund PJ, Skagen SK. Ecology and Physiology of En Route Neartic-Neotropical Migratory Birds: A Call for Collabaration. Condor. 2005: 107: 193. https://doi.org/10.1650/7806
- 127. Tottrup AP, Thorup K, Rainio K, Yosef R, Lehikoinen E, Rahbek C. Avian migrants adjust migration in response to environmental conditions en route. Biol Lett. 2008; 4: 685–688. https://doi.org/10.1098/rsbl.2008.0290 PMID: 18700199
- **128.** Hostetler JA, Sillett TS, Marra PP. Full-annual-cycle population models for migratory birds. Auk. 2015; 132: 433–449. https://doi.org/10.1642/AUK-14-211.1
- **129.** Moore FR. Stopover ecology of Nearctic-Neotropical landbird migrants: habitat relations and conservation implications. Stud Avian Biol. 2000; 20: 133.
- 130. Alerstam T, Hedenstrom A, Akesson S. Long-distance migration: evolution and determinants. Oikos. 2003; 103: 247–260. https://doi.org/10.1034/j.1600-0706.2003.12559.x
- 131. McKinnon L, Smith PA, Nol E, Martin JL, Doyle FI, Abraham KF, et al. Lower Predation Risk for Migratory Birds at High Latitudes. Science. 2010; 327: 326–327. https://doi.org/10.1126/science.1183010 PMID: 20075251
- 132. Hufkens K, Keenan TF, Flanagan LB, Scott RL, Bernacchi CJ, Joo E, et al. Productivity of North American grasslands is increased under future climate scenarios despite rising aridity. Nat Clim Chang. 2016; 6: 710–714. https://doi.org/10.1038/nclimate2942
- 133. Knapp AK. Rainfall Variability, Carbon Cycling, and Plant Species Diversity in a Mesic Grassland. Science. 2002; 298: 2202–2205. https://doi.org/10.1126/science.1076347 PMID: 12481139
- 134. Lemoine N, Bohning-Gaese K. Potential impact of global climate change on species richness of long-distance migrants. Conserv Biol. 2003; 17: 577–586. https://doi.org/10.1046/j.1523-1739.2003.01389.x
- 135. Matthews SN, Iverson LR, Prasad AM, Peters MP. Changes in potential habitat of 147 North American breeding bird species in response to redistribution of trees and climate following predicted climate change. Ecography (Cop). 2011; 34: 933–945. https://doi.org/10.1111/j.1600-0587.2011.06803.x
- 136. Culp LA, Cohen EB, Scarpignato AL, Thogmartin WE, Marra PP. Full annual cycle climate change vulnerability assessment for migratory birds. Ecosphere. 2017; 8: 1–22. <a href="https://doi.org/10.1002/ecs2.2052">https://doi.org/10.1002/ecs2.2052</a>



- 137. Swanson DL, Palmer JS. Spring migration phenology of birds in the Northern Prairie region is correlated with local climate change. J F Ornithol. 2009; 80: 351–363. https://doi.org/10.1111/j.1557-9263. 2009.00241.x
- 138. Travers SE, Marquardt B, Zerr NJ, Finch JB, Boche MJ, Wilk R, et al. Climate change and shifting arrival date of migratory birds over a century in the northern Great Plains. Wilson J Ornithol. 2015; 127: 43–51. https://doi.org/10.1676/14-033.1
- 139. Peterson AT, Ortega-Huerta MA, Bartley J, Sánchez-Cordero V, Soberón J, Buddemeier RH, et al. Future projections for Mexican faunas under global climate change scenarios. Nature. 2002; 416: 626–629. https://doi.org/10.1038/416626a PMID: 11948349
- **140.** Studds CE, Marra PP. Nonbreeding habitat occupancy and population Pprocesses: an upgrade experiment with a migratory bird. Ecology. 2005; 86: 2380–2385.
- 141. Rushing CS, Marra PP, Dudash MR. Winter habitat quality but not long-distance dispersal influences apparent reproductive success in a migratory bird. Ecology. 2016; 97: 1218–1227. https://doi.org/10.1890/15-1259.1 PMID: 27349098