Landscape Genetics of Mammals in American Ecosystems

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Since the term was coined in 2003, landscape genetics (LG) is a field that integrates population genetics, landscape ecology, and spatial analytical techniques to quantify the effects of landscape on microevolutionary processes. Despite the growing interest in LG, there is little knowledge about the trends in LG research for America in general and regarding mammals in particular, as well as about which ecosystems are being most studied. Deserts represent nearly one-third of the Earth's surface and are characterized by high heterogeneity and species richness. However, they are underrepresented in the LG literature. Hence, we performed a thorough review of published scientific articles addressing LG of mammals in America, with emphasis on deserts. The objectives were to 1) determine the mammal groups that have been most studied; 2) establish the representation of desert ecosystems; 3) describe the research questions and analytical methods most frequently used; and 4) summarize the key landscape factors and environmental variables associated with genetic diversity and structure patterns of mammals in America. We conducted a comprehensive literature search of published articles between 2003 and 2019 in the Web of Science (http://apps.webofknowledge.com) based on search words specific to the revision subject. We verified and screened the articles recovered, and gathered basic information (species, authors, publication year), together with the research questions addressed and the genetic and statistical methods used. We recovered 36 publications on LG involving mammals in America; of these, only eight were conducted on desert ecosystems (Table 1). Rodentia was the most represented order in all American ecosystems (*n* = 20), while Artiodactyla (*n* = 4) was specifically represented in deserts. Of all studies, the most common research questions focused on estimating 'connectivity' (*n* = 14) and 'genetic structure' (*n* = 12), and the most frequent analytical methods were Mantel and partial Mantel tests. Dispersal capabilities and vegetation cover were the most important variables regarding the genetic structure of desert populations. Most studies evaluated connectivity with simple and partial Mantel tests, but the use of novel methodologies (*i. e.,* genomics) was also identified. Ecological traits of species, particularly for rodents, and vegetation cover were the main factors related to genetic patterns in deserts. Notably, we identified that North America is the most studied region, while LG studies with mammals are scarce in Mexico and South America (one study encompassed North and Central America), as well as in desert ecosystems, hence the urgency to conduct studies in those regions and in deserts.

La genética del paisaje (GP) integra conceptos y herramientas de la genética de poblaciones, ecología del paisaje y estadística espacial, para cuantificar los efectos de la matriz del paisaje en los procesos microevolutivos. Los ecosistemas de desierto están caracterizados por una alta heterogeneidad y riqueza de especies; sin embargo, están poco representados en la literatura de GP. Los objetivos de la presente revisión fueron: 1) conocer los grupos de mamíferos más estudiados, 2) determinar la representatividad de los ecosistemas desérticos, 3) describir las preguntas más frecuentes y los métodos y análisis utilizados, 4) resumir los principales factores del paisaje y del ambiente asociados con la diversidad y estructura genética de los mamíferos de América. Realizamos una búsqueda exhaustiva de estudios publicados sobre GP con mamíferos en ecosistemas de América (2003-2019, en Web of Science). Recopilamos información de referencia (especies, autores, año de publicación), y preguntas de investigación, aproximaciones metodológicas y análisis estadístico-espaciales. Obtuvimos 36 publicaciones, ocho desarrolladas en ecosistemas desérticos (Tabla 1). El orden más representado en ecosistemas de América fue Rodentia (*n* = 20) y en particular en desiertos fue Artiodactyla (*n* = 4). Del total de trabajos, las preguntas enfocadas a estimar 'conectividad' (*n* = 14) y 'estructura' (*n* = 12) fueron las más estudiadas, y los análisis más utilizados se basaron en pruebas de Mantel (simple y parcial). La capacidad de dispersión y la presencia de vegetación fueron variables clave. Aunque predominó la evaluación de conectividad mediante análisis de correlación entre matrices de distancias y pruebas de Mantel, identificamos el uso de metodologías novedosas, como la construcción de redes genéticas y demográficas a partir de matrices de resistencia. Cabe resaltar que las variables ecológicas de las especies, en particular de roedores, y la cobertura vegetal fueron clave en desiertos. Finalmente, identificamos que Norteamérica es la región más estudiada, mientras que existen pocos trabajos de GP con mamíferos en México y Sudamérica (un trabajo abarcó Norteamérica y Centroamérica) y en ecosistemas desérticos, por lo que es urgente realizar estudios en dichas regiones y en desiertos.

Key words: connectivity; gene flow; genetic structure; Mexico; rodents; spatial analysis.

Introduction

Genetic variation is considered to be the basic level of biological diversity (McNeely *et al.* 1990) and is essential for the adaptation and survival of individuals, the viability of populations, and the ability of species to adapt to environmental changes (Frankham *et al.* 2010). Particularly since 1970, genetic variation started being regarded as a key element of conservation (Frankel 1974). On the other hand, the acknowledgment of the impact of human activities on the environment in the 1980s — mainly fragmentation and habitat loss — gave rise to landscape ecology as the discipline that investigates the interactions between spatial heterogeneity and ecological processes (Turner 2005). In 2003, the conceptual and methodological development of

both disciplines laid the foundations for the recognition of Landscape Genetics (LG) as a discipline that evaluates the impact of environmental heterogeneity and the landscape elements on the variation and genetic structure of individuals and populations (Manel *et al.* 2003). LG integrates the concepts and tools of population genetics, landscape ecology, and spatial statistics, to quantify the effects of the landscape matrix (composition, configuration, and quality) on microevolutionary processes such as gene flow, drift and selection, based on neutral or adaptive genetic variation (Manel *et al.* 2003; Holderegger and Wagner 2006; Storfer *et al.* 2007; Balkenhol *et al.* 2015).

The impact of LG in the scientific community has led to a marked increase in the number of publications related to the topic, from 3 to 60 articles per year, over 10 years (Storfer *et al.* 2010). A variety of analytical and methodological approaches have emerged, including the stages that a LG study should follow (Garrido-Garduño and Vázquez-Domínguez 2013; Hall and Beissinger 2014), the consideration of temporal and spatial scales (Anderson *et al.* 2010), the sampling design and selection of molecular markers (Landguth *et al.* 2012), statistical analyses (Balkenhol *et al.* 2009a), and certain limitations and perspectives of LG (Balkenhol *et al.* 2009b; Richardson *et al.* 2016). In this sense, Storfer *et al.* (2010) analyzed empirical studies published up to that date; from their results, five points stand out: 1) there is a taxonomic bias toward vertebrates; 2) most works have been conducted in America; 3) forests are the most studied habitats; 4) the topic most frequently addressed is the identification of barriers affecting gene flow; and 5) deserts are scarcely represented ecosystems, with 3 % of LG studies. Other revisions also point out that vertebrates are the dominant taxonomic group in LG studies at the global level (Garrido-Garduño and Vázquez-Domínguez 2013; Dyer 2015); of these, mammals have prevailed (Montgelard *et al.* 2014). It should be noted that although America is the region most represented in LG studies, there is no information currently available identifying the main topics of research, analytical methods used, and environments studied from an LG perspective.

Deserts are one of the Earth's more widespread environments, occupying approximately one-third of the Earth's surface (Schimel 2010). The environmental characteristics of deserts, such as high temperatures and low rainfall, have favored a variety of microhabitats that, in addition to hosting a large number of taxonomic groups, many of them endemic, also confer temporal and spatial heterogeneity (Whitford 2002; WWF 2019). Temporal heterogeneity emerges from highly variable environmental conditions throughout the day, between seasons of the year, or between years (Polis 1991); for its part, spatial heterogeneity influences species composition, distribution, and abundance (Whitford 2002; Ludwig *et al.* 2005). Thus, heterogeneity renders deserts ideal systems for hypothesis testing within the LG framework (Challenger and Soberón 2008). For instance, in the Chihuahuan desert, vegetation tends to

be distributed in small patches (Grünberger 2004), producing a heterogeneous matrix that allows evaluating structural and functional connectivity (Manel and Holderegger 2013).

It is worth stressing that in the current context of global climate change, it is predicted that change rates toward warmer and more arid environments will rise in deserts relative to other regions. This, coupled with the transformation and loss of natural habitats in desert ecosystems (Mittermeier *et al.* 2003; Zeng and Yoon 2009; WWF 2019), have supported that deserts be presently considered as vulnerable regions, particularly the deserts of North America (Bachelet *et al.* 2016; WWF 2019). Therefore, due to the overall scarce representation of deserts in the literature of landscape genetics (Storfer *et al.* 2010), we deem it essential to determine the state of the art of LG research in American deserts. Its relevance lies in the fact that the persistence of species inhabiting desert ecosystems depends on the dispersal ability of individuals and the movement of genes within and between their populations across the landscape (Scribner *et al.* 2005; Reding *et al.* 2013).

Based on the above arguments, in the present work we conducted a review of the scientific literature aiming to 1) determine the most studied groups of mammals; 2) determine the representativeness of desert ecosystems; 3) describe the research questions most frequently addressed and the methods and analysis used; and 4) summarize the main factors of the landscape and the environment associated with genetic diversity and structure of the mammals of America.

Materials and Methods

Literature review. We surveyed articles about landscape genetics (LG) with mammals in ecosystems of America published between 2003 — when the term was first coined — and May 2019. We used the Web of Science website (http://apps.webofknowledge.com) based on different combinations of terms as keywords: 'landscape genetics', 'functional connectivity' and 'mammals'; 'landscape genetics', 'mammals' and 'desert'; 'landscape genetics', 'mammals', 'desert' and 'America'; 'functional connectivity', 'mammals' and 'desert'. This literature search method has proved to be efficient in different review works (*e. g.*, Storfer *et al.* 2010; Dyer 2015; Rico 2019), which also allows a systematic and repeatable analysis, although it certainly may exclude some works.

Literature validation and analysis. We conducted a detailed revision of the works obtained to the last screen (revision of the title, abstract, and methods), aiming to eliminate duplicated works and confirm that studies matched the search criteria (mammals, America, and desert). We considered only works that reported empirical data and that strictly corresponded to genetic landscape analysis, *i. e.*, including at least one landscape variable and evaluating its relationship with genetic patterns. We collected information on species, authors, year of publication, environments (considering the most represented environment in the study area according to each work), research ques-

tions (classified by 'type'), and statistical-spatial LG analysis used. The research questions were classified according to six types: 'connectivity', 'structure', 'gene flow', 'comparative analysis', 'association analysis' and 'adaptation'.

Results

Taxonomy, geographic region, and diversity of deserts. The results obtained for each combination of terms and search screened were as follows: 'landscape genetics', 'functional connectivity' and 'mammals' ($n = 85$ works); 'landscape genetics', 'mammals' and 'desert' ($n = 78$); 'landscape genetics', 'mammals', 'desert' and 'America' ($n = 38$); 'functional connectivity', 'mammals' and 'desert' ($n = 10$). After a thorough validation of the literature (elimination of duplicates, inclusion of works with empirical data only involving the analysis of landscape variables), a total of 36 publications were obtained (Table 1). We identified six orders of mammals, of which Rodentia was the most represented taxon ($n = 20$; Table 1). The main geographic region studied was North America ($n = 25$), mostly in the United States of America ($n = 19$). For South America ($n = 10$), we identified works conducted in Brazil ($n = 3$), Argentina ($n = 6$), and Uruguay ($n = 1$). We recorded one study that covered countries of North America (Mexico) and Central America (Belize, Costa Rica, Guatemala, and Honduras), which was counted separately. The environments involved included forests ($n = 6$), urban areas ($n = 6$), cropland ($n = 4$), mountains and rivers ($n = 5$), sand dunes ($n = 5$), and shrub steppe ($n = 2$), while desert ecosystems were addressed in eight studies.

Specifically for deserts, Artiodactyla was the order most represented ($n = 4$), although with a single species (the desert bighorn sheep *Ovis canadensis nelsoni*), followed by the orders Carnivora (*Ursus americanus* and *Bassariscus astutus*) and Rodentia (*Dipodomys spectabilis* and *Dipodomys merriami*), with two works each. The deserts of North America (Mojave, $n = 3$; Chihuahuan, n = 3; Sonoran $n = 2$) were the only arid environments where LG studies have been carried out (Table 1). No studies were found addressing the deserts of South America (Atacama and Patagonia). For Mexico, we found only three LG works, two in the tropical deciduous forest of Oaxaca and San Luis Potosí, and the other one the coast of Jalisco; only a single study was conducted in the desert (Chihuahuan; Table 1).

Research questions and statistical-spatial methods. The classification of the research questions addressed in all the publications reviewed (North America) revealed that those dealing with 'connectivity' and 'structure' were the most common ones ($n = 14$ and 12, respectively), followed by 'gene flow' ($n = 7$). The 'comparative', 'association' and 'adaptation' approaches were represented by one work each. To note, the 'association' and the 'adaptation' approaches were unique to desert environments (Table 1).

All studies analyzed genetic aspects that included assessment of deviations from the Hardy-Weinberg equilibrium and linkage disequilibrium, as well as genetic diversity

measures by estimating allelic richness and observed and expected heterozygosity. Four works performed allocation and structure analyses to define genetic groups and to detect migrants (Figure 1).

Regarding spatial data handling and recording (landscape and environmental variables), all studies used a Geographic Information System (GIS) to represent the study area. In addition, five works estimated the Normalized Difference Vegetation Index (NDVI) to obtain vegetation cover data. A study selected sampling sites based on the method of environmental domains (Figure 1). In the remaining works, the landscape was characterized through a classification based on the literature reported for the area, or from repositories of specific environmental information.

In all the studies at least two analytical methods were used for assessing the genetics-landscape relationship. The methods most commonly utilized were the Mantel and partial Mantel tests, followed by linear regression models and their variants ($n = 14$; Figure 1). Some works addressing 'connectivity' and 'gene flow' questions constructed resistance layers to quantify the effects of landscape through the estimation of effective distances based on least-cost path algorithms ($n = 6$), resistance distance (estimated based on circuits theory; $n = 6$), and both ($n = 4$). One work used species distribution models (SDM) for the construction of these resistance layers (Figure 1).

Landscape factors that determine the genetic structure and diversity. The results obtained for America show that the environmental and landscape characteristics, represented as effective distances, are the ones that best explained genetic structure and diversity patterns in most works (Figure 2a), followed by geographic distance (*i. e.*, with a pattern of isolation by distance). The main landscape variables
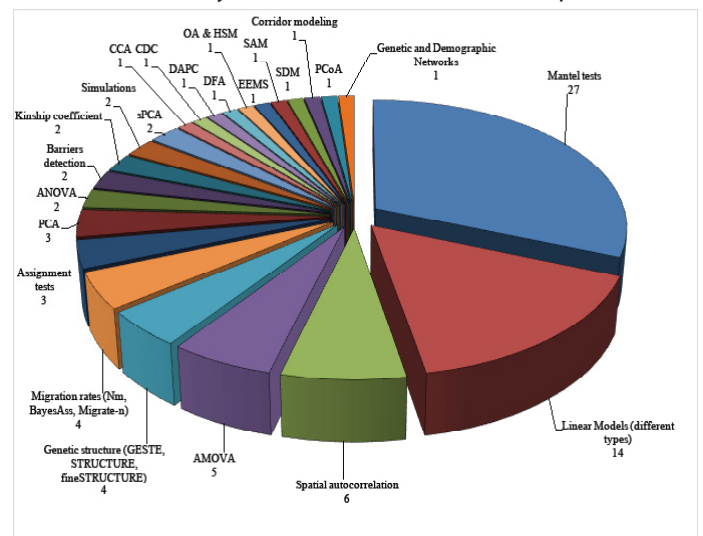

Figure 1. Analytical methods used in landscape genetics studies with mammals in North America. Numbers indicate the number of studies that used each method; all works used more than two methods. Abbreviations: ANOVA = Analysis of variance; AMOVA = Analysis of molecular variance; CEC = Canonical correspondence analysis; CDC = Climatic domain classification; DAPC = Discriminant principal component analysis; DFA = Discriminant functional analysis; EEMS = Estimated effective migration rates; OA and HSM = Occupancy analyses and Habitat suitability model; PCA = Principal component analysis; PCoA = Principal coordinate analysis; sPCA = Spatial principal component analysis; SAM = Spatial autoregressive modeling; SDM = Species distribution models.

included topography, vegetation cover (evaluated as NDVI and extent of available habitat in the landscape), rivers, and water bodies (Figure 2b). Additional relevant factors were anthropogenic constructions (highways and roads) and the ecological characteristics of species, such as dispersal capacity and population density. In particular in deserts, the factors most frequently associated with genetic structure and diversity were vegetation cover, dispersal, and anthropogenic constructions (Figure 2b).
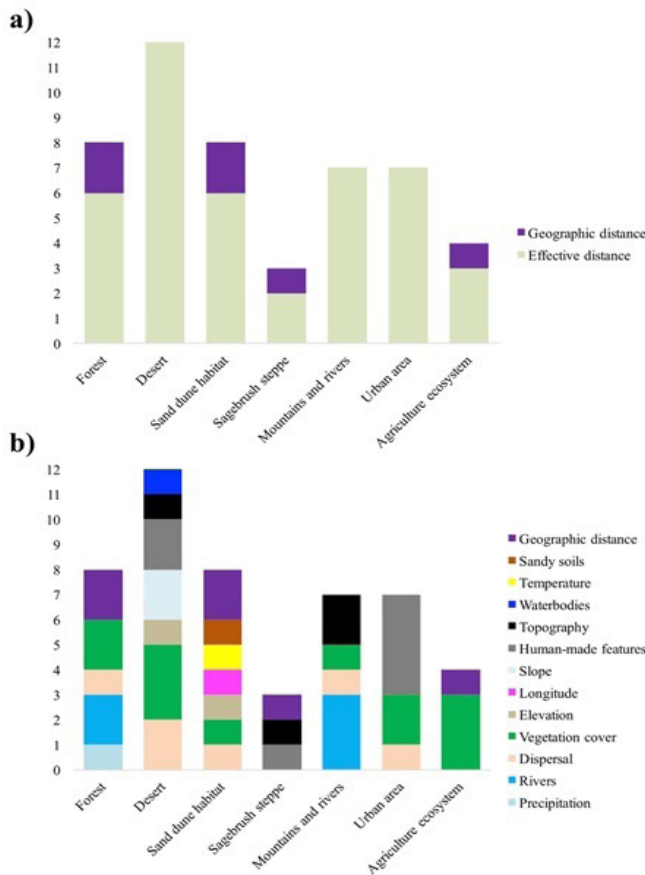

Figure 2. Factors that determine the genetic structure and diversity of mammals, expressed as accumulated frequencies in each of the environments analyzed. "Vegetation cover" includes the different approaches used to assess that characteristic (NDVI, habitat patches), as well as for "anthropogenic constructions" (roads, highways). a) Factors in terms of geographic and effective distance; b) environmental and landscape variables that constitute effective distances in each environment. "Longitude" refers to the geographic position in the coordinate system.

Discussion

Since the term was first coined to the steady construction of the theoretical, methodological, and analytical frameworks (Manel *et al.* 2003; Holderegger and Wagner 2006; Balkenhol *et al.* 2015), landscape genetics (LG) has been broadly accepted in the scientific community to address questions related to the effect of the environmental variables in the genetic structure and variation of natural populations (Storfer *et al.* 2010; Garrido-Garduño and Vázquez-Domínguez 2013; Dyer 2015). Mammals comprise 6,399 species worldwide (of the 6,495 recognized species, 96 have become extinct); of these, 697 are located in the Nearctic region, which covers North America (Burgin *et al.* 2018). Our results show that this region is the best represented in LG studies

with mammals, covering a great diversity of ecosystems. A study that encompasses North America and Central America is worth mentioning (Wultsch *et al.* 2016), and could be considered as one of the first addressing LG for this region. In addition, we found scarce research efforts done (and published) on landscape genetics involving the mammals of Mexico and South America, as well as in desert ecosystems.

Rodents and carnivores, models in landscape genetics in North America. Rodentia is considered the largest order, with 2,409 species that account for approximately 44 % of the diversity of mammals worldwide (Wilson *et al.* 2017). The characteristics of rodents, namely high species richness, small size (most species), limited dispersal capabilities, and diverse life stories, make them an ideal taxonomic group to address questions at the landscape scale, together with genetics and ecology. It is striking, however, that it was only recently that the qualities of this group were recognized within the context of landscape studies (Waits *et al.* 2015).

Studies involving rodents in America have been conducted mainly in areas with anthropogenic impact, including urban areas (Gardner-Santana *et al.* 2009; Chambers and Garant 2010; Mapelli *et al.* 2012; Munshi-South 2012; Marrotte *et al.* 2014; Anderson *et al.* 2015; Chiappero *et al.* 2016; Combs *et al.* 2018). On the other hand, we found only two works that were conducted with rodents in desert environments, specifically kangaroo rats in the Chihuahuan desert. In the first study, Cosentino *et al.* (2015) evaluated the population genetics of *D. spectabilis* from a spatial perspective, considering the configuration of the landscape matrix; they found that genetic differentiation patterns of its populations are determined by biological aspects of the species, specifically the dispersal capacity and population densities. In the second work, Flores-Manzanero *et al.* (2019) found higher gene flow in a population of *D. merriami* along areas with shrub vegetation, which in turn is associated with the construction of burrows and as a food source (seeds); accordingly, based on a LG approach these authors found a relationship between genetic patterns and ecological processes.

Carnivores were the second most represented order in landscape genetics studies in America, encompassing both medium-sized species such as the fisher (*Martes pennanti*; Hapeman *et al.* 2011) and the "cacomixtle" (ringtail, *Bassariscus astutus*; Lonsinger *et al.* 2015), as well as large species, including the gray wolf (*Canis lupus*; Cullingham *et al.* 2016), the black bear (*Ursus americanus*; Atwood *et al.* 2011; Draheim *et al.* 2018), and the jaguar (*Panthera onca*; Wultsch *et al.* 2016). Notably, carnivores are recognized as the most vulnerable to extinction group of mammals, due to their biological characteristics and anthropogenic impacts (Cardillo *et al.* 2004). The few studies identified in this review highlight the importance of conducting genetic landscape research to explore, among others, the effect of landscape elements (mountains, rivers) and anthropogenic features (habitat fragmentation) on the diversity and genetic structure of this group.

Evaluation of connectivity. Landscape genetics has focused primarily on terrestrial organisms (Storfer *et al.*

Table 1. Summary of landscape genetics studies with mammals analyzed in this review.

ORDER/ Species	F	Region	Environment/ landscape	Research question	Type of question	Statistical-spatial analysis	Genetic structure and diversity drivers
DIDELPHIMORPHIA							
Marmosops incanus	1	Atlantic Plain, Brazil	Forests with different degrees of fragmentation	Comparative landscape genetics Response of genetic diversity to fragmentation	Comparative analysis	ANOVA, regression models, and Mantel tests	Amount of available habitat across the landscape (% patch cover)
PRIMATES							
Leontopithecus rosalia	2	Uniao Biological Reserve, Brazil	Fragmented Atlantic forest	Evaluate the effect of the landscape in gene flow	Gene flow	Spatial autocorrelation, kinship indices, and generalized linear models	The spatial configuration of vegetation cover affects the dispersal of individuals
LAGOMORPHA							
Brachylagus idahoensis	3	Wyoming, Estados Unidos	Shrub steppe	Evaluate whether the spatial genetic structure pattern is due to isolation by distance or by barriers	Structure	Analysis of isolation by distance at individual and population levels	Geographic distance, with a road as a likely barrier
Ochotona princeps	4	Oregon, Estados Unidos	Mountains and rivers	Identify the factors that limit or facilitate gene flow	Gene flow	Genetic distance, resistance distances, simple and partial Mantel tests, simulations	Topographic complexity is the main driver of gene flow
Sylvilagus transitionalis	5	Eastern United States	Fragmented habitat / Urban zone	Assess connectivity	Connectivity	Resistance matrix, partial Mantel tests, Least-cost path and mixed-effect models	Linear anthropogenic constructions and shrub habitats (effective distance)
RODENTIA							
Calomys venustus	6	Córdoba, Argentina	Farming areas with roads	Assess spatial and temporal genetic structures	Structure	Spatial autocorrelation analysis, Mantel and partial Mantel tests. Correlation between genetic and "geographic" distances	Geographic distance only
Ctenomys "chasiquensis"	7	Las Pampas, Argentina	Sand dunes and cropland	Evaluate the environmental factors that shape population structure and those that promote the connectivity between populations	Structure	AMOVA, simple and partial Mantel tests, spatial principal component analysis (sPCA), generalized linear models	Plant cover (NDVI) and Longitude promote gene flow between populations
Ctenomys lami	8	Coxilha Lombas, Brasil	Matrix of rivers, lagoons and cropland	Assess the spatial genetic structure	Structure	Correlation between genetic and geographic distances, Mantel tests, assignment analysis, AMOVA	Geographic distance, probably due to the species limited dispersal
Ctenomys porteousi	9	Buenos Aires, Argentina	Cultivation and farming areas	Evaluate the effect of landscape configuration on genetic structure and connectivity. Migration rates	Connectivity	Connectivity between habitat patches. Correlation between genetic and geographic distances. Mantel and partial Mantel tests, generalized linear model.	Amount of available habitat across the landscape and distance between good-quality patches.
Ctenomys rionegrensis	10	Río Negro, Uruguay	Dune and river systems	Evaluate the geographic factors that shape population structure	Structure	Mixed generalized models	Elevation
Ctenomys sp.	11	Corrientes, northeast Argentina	Flood-prone area including lagoons, marshes, and cropland	Evaluate the geographic factors that shape population structure	Structure	Analysis of structure (GESTE), species distribution models and linear models	The presence of well-drained sandy soils and temperature are the drivers for the distribution and differentiation of populations
* Dipodomys merriami	12	Mapimí, Durango, México	Chihuahuan desert	Evaluate the landscape features that limit or facilitate gene flow	Gene flow	Linear mixed-effect models from resistance surfaces and model evaluation using AIC	Effective distance (NDVI) best explains gene flow patterns, which is favored in areas with vegetation cover
* Dipodomys spectabilis	13	Nuevo México, Estados Unidos	Chihuahuan desert	Evaluate the presence of a founder effect on recolonized sites based on genetic diversity, size, and connectivity between sites	Connectivity	Correlation between genetic and geographic distances. Mantel test, mixed generalized models	Dispersal characteristics associated with population density
Hydrochoerus hydrochaeris	14	Basins of Venezuela, Paraguay, and Argentina	River systems	Assess spatial genetic structure	Structure	AMOVA. Principal Coordinate Analysis and Canonical Correspondence. Resistance distance	Rivers determine the structure pattern
Lagidium viscacia	15	Neuquén, Argentina	Steppe and mountains	Evaluate functional connectivity	Connectivity	Correlation between genetic, geographic and cost distances. Mantel tests	Functional connectivity is influenced by landscape geology

Species	#	Location	Landscape	Objective	Category	Methods	Results
Liomys pictus	16	Western Mexico	Tropical deciduous forest	Evaluate the effect of landscape elements on genetic structure and gene flow.	Gene flow	Environmental domains. Womb-soft, Barrier. Correlation between genetic and geographic distances. Effective distance: Least-cost path and circuit theory. Mantel and partial Mantel tests	Effective distance, precipitation and streams
Microtus californicus	17	Jasper Ridge Reserve, California, United States	Grasslands and oak forest	Evaluate gene flow	Gene flow	Principal component analysis, Mantel tests	Only geographic distance, due to the ecological characteristics.
Ondatra zibethicus	18	Sudbury, Ontario, Canada	Watersheds	Evaluate the effect of landscape characteristics on structure and connectivity.	Connectivity	Spatial autocorrelation by sex. Assignment analysis. Correlation between genetic, linear and resistance distances (least-cost path). PATHMATRIX. Partial Mantel tests	Roads and anthropogenic elements seem to facilitate the movement of organisms
Peromyscus leucopus	19	New York, United States	Urban zone	Evaluate the landscape characteristics that foster connectivity between populations in an urban environment	Connectivity	Migration rates (Nm, BayesAss and Migrate-n). Linear, effective (least-cost) and resistance distances. Mantel and partial Mantel tests	Effective distance (based on vegetation cover)
P. leucopus	20	Montérégie, Quebec, Canada	Farming land with rivers and roads	Evaluate the effect of the landscape characteristics on genetic structure and connectivity.	Connectivity	Correlation between genetic and ecological distances. Mantel tests. Multiple regression analysis between ecological and linear distances. Connectivity between patches with resistance distance	Forest fragments facilitate the movement of individuals
Rattus norvegicus	21	Baltimore, Maryland, United States	Urban zone	Characterize the genetic structure and evaluate gene flow	Gene flow	Genetic distance, kinship relations, and Mantel tests	Habitat fragmentation (urban area); the ecology of organisms contribute to homogenize diversity and genetic structure
R. norvegicus	22	New York, United States	Urban zone	Explore spatial genetic structure patterns	Structure	Spatial autocorrelation, Mantel tests, PCA, sPCA, estimated effective migration surfaces (EEMS), population structure (fineSTRUCTURE)	Closely related individuals and ecological characteristics of the species
Tamias striatus	23	south Quebec and Ontario, Canada	Forested areas, rivers, and urban areas	Explore the geographic factors that shape population structure; sex-biased dispersal	Structure	Correlation between genetic and geographic distances Mantel test. Identification of barriers (Barrier). AMOVA	The river is the main barrier, as well as sex-biased dispersal (males)
T. striatus	24	Indiana, United States	Patches of forest and farmland	Evaluate functional connectivity	Connectivity	Assignment analysis. Correlation between genetic and geographic distances. Mantel test. Coverage distances. Regression models	Vegetation cover promotes gene flow
Zapus trinotatus	25	Olympic Peninsula, Washington, United States	River systems, presence of mountains and forest	Assess connectivity among rivers using three environmental distances. Migration rate	Connectivity	Spatial autocorrelation analysis. Mantel test. Estimation of migration rates	Effective distance (topographic and riparian landscape features) and limited species dispersal

CARNIVORA

Species	#	Location	Landscape	Objective	Category	Methods	Results
* *Bassariscus astutus*	26	Southwest United States	Desert and mountains Chihuahuan	Assess connectivity patterns associated with genetic structure: IBD, IBR, IBE	Connectivity	Partial Mantel tests. Discriminant function analysis. ANOVAs	Environmental characteristics: elevation, slope, and vegetation type (IBE-effective distance)
Canis lupus	27	Rocky Mountains, Canada	Mountains	Evaluate gene flow between herds considering the landscape characteristics	Gene flow	Regression between genetic and geographic distances (resistance model and coverage distance). Multiple regressions of distance matrices. Partial Mantel tests	Effective distance (based on vegetation cover)
Martes pennanti	28	Northeast United States	Mountains and rivers	Characterize genetic structure and its association with landscape features and human disturbance	Structure	Correlation between genetic, geographic and barrier distances. Mantel and partial Mantel tests. Recent migration rates	Orographic and hydrological characteristics (i.e. river and great lakes)
Panthera onca	29	In Mexico: Sierra Mixe, Oaxaca, and Sierra de Abra-Tanchipa, San Luis Potosí. In Central America: Belize, Costa Rica, Guatemala, Honduras	Tropical deciduous forest and medium tropical forest	Evaluate genetic structure at different spatial scales	Structure	Analysis of population structure, PCA, AMOVA, spatial autocorrelation, and Mantel tests.	Geographic distance, probably due to habitat fragmentation

*Ursus americanus	30	Arizona, United States	Mountains and Sonoran and Chihuahuan deserts	Evaluate connectivity and identify potential corridors	Connectivity	Analysis of occupation based on landscape characteristics (e.g. coverage). Habitat availability model. Resistance layers and corridor modeling	Fragmentation/barrier associated with the construction of the border wall
U. americanus	31	Michigan, United States	Cultivation and farming areas	Evaluate the effect of landscape changes on spatial genetic structure through time.	Structure	Simple and partial Mantel tests, resistance distances, FRAGSTATS, autoregressive spatial model, selection of models based on AIC	Vegetation cover showed a better relationship with genetic distance, while variables associated with environmental heterogeneity better predicted the genetic change over time
ARTIODACTYLA							
Odocoileus hemionus	32	Southern California, United States	Mountains and urban areas	Assess connectivity	Connectivity	Genetic structure (STRUCTURE and DAPC), genetic distances between individuals, habitat accumulated cost distance (HAC), least-cost path, generalized linear mixed-effect models	Highways restrain the connectivity between populations and individuals
*Ovis canadensis nelsoni	33	Southeast California, United States	Mojave and Sonoran deserts	Assess connectivity between populations, considering the effect of slope and anthropogenic presence	Connectivity	Migration rates. Correlation between genetic and geographic distances. Least-cost path. Partial Mantel test	Effective distance (based on topography)
*O. c. nelsoni	34	Southwest United States	Mojave desert	Combine connectivity by landscape resistance models and network theory to prioritize patches or corridors for conservation purposes	Connectivity	Effective resistance distance (least-cost path). Partial Mantel tests. Genetic and demographic network models. Correlations	Effective distance (based on maximum dispersal)
*O. c. nelsoni	35	Southwest United States	Mojave desert	Implementing NDVI as a predictor of food quality and genetic diversity	Association	Linear quadratic regression models to measure the association between NDVI and genetic diversity (response variables). Connectivity metrics as an additional predictor variable	Patches with high NDVI values
*O. c. nelsoni	36	Southwest United States	Mojave desert	Explore the effects of landscape on the spacing of adaptive genetic variation	Adaptation	Linear regression models from resistance (least-cost) surfaces and simulations	Effective distance (terrain slope, water bodies, and roads determine gene flow)

Abbreviations: IBD= isolation by distance (Isolation by Distance), IBR= isolation by barrier (Isolation by Barrier), IBE= isolation by ambient (Isolation by Environment); ANOVA = Analysis of variance; AMOVA= analysis of molecular variance; PCA = Principal component analysis.

*= study explicitly conducted in a desert.

F= Source. 1: Balkenhol *et al.* (2013); 2: Moraes *et al.* (2018); 3: Thimmayya and Buskirk (2012); 4: Castillo *et al.* (2014); 5: Amaral *et al.* (2016); 6: Chiappero *et al.* (2016); 7: Mora *et al.* (2017); 8: Lopes and De Freitas (2012); 9: Mapelli *et al.* (2012); 10: Kittlein and Gaggiotti (2008); 11: Gómez Fernández *et al.* (2016); 12: Flores-Manzanero *et al.* (2019); 13: Cosentino *et al.* (2015); 14: Byrne *et al.* (2015); 15: Walker *et al.* (2007); 16: Garrido-Garduño *et al.* (2016); 17: Adams and Hadly (2010); 18: Laurence *et al.* (2013); 19: Munshi-South (2012); 20: Marrotte *et al.* (2014); 21: Gardner-Santana *et al.* (2009); 22: Combs *et al.* (2018); 23: Chambers and Garant (2010); 24: Anderson *et al.* (2015); 25: Vignieri (2005); 26: Lonsinger *et al.* (2015); 27: Cullingham *et al.* (2016); 28: Hapeman *et al.* (2011); 29: Wultsch *et al.* (2016); 30: Atwood *et al.* (2011); 31: Draheim *et al.* (2018); 32: Fraser *et al.* (2019); 33: Epps *et al.* (2007); 34: Creech *et al.* (2014a); 35: Creech *et al.* (2014b); 36: Creech *et al.* (2017)

2010; Garrido-Garduño and Vázquez-Domínguez 2013; Dyer 2015), where the development of tools, like geographic information systems (GIS), has allowed a more real representation of terrestrial landscapes (Waits *et al.* 2015). In this review, we found that one of the LG questions most frequently addressed globally (America) was the connectivity between populations, and all studies evaluating this topic used GISs to represent the landscape. These studies also used different analytical methods to relate the landscape with the genetic structure of populations, including the correlation between genetic distances and different geographic distances, since just the linear (Euclidean) distance does not represent the true distance between populations (Vignieri 2005). The so-called effective distance or functional distance represent ecological measures of distance commonly used in LG studies, the most used being the least-cost path and the resistance distance (Storfer *et al.* 2007; McRae *et al.* 2008). Also, the Mantel and partial Mantel

tests were the approaches most frequently used to evaluate the correlation between these distances. Although the use of Mantel tests has been questioned (see Guillot and Rousset 2013), they are considered appropriate methods when setting hypotheses that explicitly involve distance (Legendre and Fortin 2010; Legendre *et al.* 2015), while also favoured as models that are easy to interpret and serve as starting points for the parameterization of resistance matrices (Storfer *et al.* 2010). For example, Munshi-South (2012) evaluated the connectivity between populations of the white-footed mouse (*Peromyscus leucopus)* in an urban area using estimates of migration rates and correlating these with cost and resistance distances, supported on the resolving power of GISs and Mantel and partial Mantel tests. Also, in an environment with anthropogenic impact, Amaral *et al.* (2016) assessed the connectivity between populations of the gray rabbit (*Sylvilagus transitionalis*) from cost and resistance distances, which were optimized using correlations through

partial Mantel tests. Likewise, Draheim *et al.* (2018) implemented simple and partial Mantel tests to correlate genetic distances between paired individuals with geographic (linear) and resistance distances, to evaluate whether changes in the landscape over time influenced the spatial genetic structure of the black bear (*Ursus americanus*).

An aspect worth mentioning is the development of additional methods to assess connectivity in terms of the relationship between effective and genetic distances, like the generalized linear models, which prevailed in studies with rodents (Kittlein and Gaggiotti 2008; Mapelli *et al.* 2012; Marrotte *et al.* 2014; Cosentino *et al.* 2015). We should also highlight the use of species distribution models for the construction of connectivity hypotheses in landscape genetics, as these combine presence data (localities where the species has been recorded) and climate data associated with that locality, also considering vegetation cover, topography, and other environmental variables (Rolland *et al.* 2015). For instance, Gómez Fernández *et al.* (2016) modeled the distribution of the tuco-tuco (*Ctenomys* sp.), taking into consideration the environmental variables available for the flooded area where it thrives, which allowed determining that permeable sandy soils and temperature are the factors significantly associated with its population genetic structure. Notably, the use of species distribution models in LG studies is restrained by the geographic scale, since most of the variables used for constructing these models are available at large scales (for example, the WorldClim layers have 1 km² resolution; Hijmans *et al.* 2005) and, therefore, their use is restricted to considering large areas.

Finally, we highlight the construction of genetic and demographic networks from resistance matrices. As an example, Creech *et al.* (2014a) combined resistance models with the network theory and evaluated their correlation with partial Mantel tests to identify patches and corridors that facilitate the connectivity between populations of the bighorn sheep (*Ovis canadensis nelsoni*). Thus, this analytical approach can be useful for identifying corridors, particularly in conservation studies.

Not surprisingly, connectivity is one of the topics most commonly addressed in landscape genetics, particularly under the current context of global changes that currently affect (and will continue to affect) the habitat of multiple species (Manel and Holderegger 2013).

Genomics, gene flow, and local adaptation. The work in landscape genetics has been based largely on the use of neutral genetic markers, such as microsatellite loci. However, given the accelerated transformation of natural environments, it is increasingly important to be able to assess the patterns derived from adaptive genetic variation, especially because there lies the potential of species to respond to these changes (Manel *et al.* 2003; Balkenhol *et al.* 2015). In this sense, the use of molecular markers such as SNPs (Single Nucleotide Polymorphisms) has made it possible to multiply the number of loci by the thousands, increasing the statistical power of landscape genetic analyses (Combs *et al.* 2018). Also, since these markers are distributed throughout the genome, it is feasible to identify those that correspond to genes subject to selection. Therefore, the movement of these variants through gene flow between individuals and populations is largely determined by the characteristics of the landscape (Creech *et al.* 2017). In this review we found that Combs *et al.* (2018) used thousands of markers (61,400 SNPs) to explore the patterns of spatial genetic structure of the Norway rat (*Rattus norvegicus*) in New York. The authors proved the existence of genetic structure at a fine spatial scale, attributed to the elements of the urban matrix and the ecological characteristics of the species. Also, these authors mention that previous studies, with the same species and using microsatellites, did not detect genetic structure patterns, highlighting the resolving power of SNPs in LG studies. On the other hand, Creech *et al.* (2017) explored the effects of landscape elements in gene flow from the optimization of resistance models, using simulations in populations of the bighorn sheep (a species that inhabits desert environments). Their results from simulations based on loci subject to selection show a higher gene flow of variants (loci) with adaptive potential in habitats with a continuous distribution of vegetation cover, among other variables. The above is particularly relevant in the context of the vulnerability of desert ecosystems (Bachelet *et al.* 2016; WWF 2019) and, therefore, the species that inhabit these systems, because their persistance will depend on the movement of genes with adaptive potential through an environment with scarce vegetation.

Remote sensing. One of the most powerful tools that has contributed to the generation of spatially explicit predictive variables is the information obtained from satellites, *i. e.*, remote sensing (He *et al.* 2015). With our revision we evidence that one of the most innovative aspects in landscape genetics studies is the use of remote sensing information to achieve a more realistic interpretation of the landscape studied. For instance, Mapelli *et al.* (2012) used Landsat ETM+ sensor images to identify habitat patches in their study area and extract reflectance values of each, which were used to generate predictive variables. Thereby, the distance between good-quality patches was determined to be the most significant factor associated with the genetic structure patterns in *Ctenomys porteousi*. An additional sensor used to obtain satellite images is LiDAR, which has a higher resolution than Landsat, particularly for retrieving information on vegetation (Lefsky *et al.* 2002). Thus, Amaral *et al.* (2016) used LiDAR images to generate resistance layers used to assess the connectivity across populations of the rabbit *Sylvilagus transitionalis* and showed that patches of shrub vegetation facilitate gene flow in this species. As to its use in desert environments, Creech *et al.* (2014b) used MODIS (Moderate Resolution Imaging Spectroradiometer) images to extract reflectance values for vegetation and to estimate the NDVI, which is significantly associated with genetic diversity values in *Ovis canadensis nelsoni*; that is,

vegetation determines the functional connectivity in this species. Flores-Manzanero *et al.* (2019), using Landsat 8 images, also calculated the NDVI for detecting the vegetation cover at a fine spatial scale, which produced various resistance models; the NDVI turned out to be the best predictor of gene flow for *Dipodomys merriami*. This strongly supports the conclusion that remote sensing is an excellent tool for landscape genetics studies, particularly in deserts, where the fine-scale definition of the various aspects of the landscape may be a complex issue.

Factors that determine genetic structure and diversity in mammals. The theoretical and methodological framework of population genetics is useful for inferring the patterns that govern the genetic structure and diversity of populations (Freeman and Herron 2002). Landscape genetics allows testing these inferences through hypothesis in a spatially explicit context (Manel *et al.* 2003; Holderegger and Wagner 2006; Balkenhol *et al.* 2015). The studies reviewed tested different environmental and landscape variables associated with genetic patterns in mammals. Geographic distance was the most significant variable and was best represented in rodents (California vole, *Microtus californicus*, Adams and Hadly 2010; pygmy rabbit, *Brachylagus idahoensis*, Thimmayya and Buskirk 2012; tuco tuco, *Ctenomys lami*, Lopes and De Freitas 2012; Córdoba vesper mouse, *Calomys venustus*, Chiappero *et al.* 2016), and in one carnivore (*Panthera onca*, Wultsch *et al.* 2016). Although in most studies anthropogenic impacts (fragmentation associated with agricultural land or roads) and low dispersal ability of species were identified as the drivers of the genetic patterns, we emphasize the importance of considering the greatest amount of environmental or ecological variables possible.

Also, most studies evaluated the effective distance from variables like topography (Vignieri 2005; Epps *et al.* 2007), vegetation cover (Munshi-South *2012*; Lonsinger *et al.* 2015; Cullingham *et al.* 2016), precipitation and water bodies (Chambers and Garant 2010; Hapeman *et al.* 2011; Garrido-Garduño *et al.* 2016), available habitat, extent of fragmentation (Mapelli *et al.* 2012; Balkenhol *et al.* 2013), and anthropogenic impact (Gardner-Santana *et al.* 2009; Atwood *et al.* 2011; Amaral *et al.* 2016). Interestingly, some studies identify the ecological characteristics of species, in addition to environmental variables, as those that govern genetic diversity and structure patterns, particularly dispersal. For example, Chambers and Garant (2010) showed in the eastern chipmunk *Tamias striatus* that male-biased dispersal produces the structure pattern. Dispersal capability was also key in deserts, particularly for small mammals like *Dipodomys spectabilis*, since by incorporating population density data allowed detection of patterns that otherwise could have beeb attributed to geographic distance alone (Cosentino *et al.* 2015). In addition, one of the most significant factors for the bighorn sheep was maximum dispersal distance (i.e., effective distance), in addition to topography and food quality (estimated from the NDVI; Epps *et al.* 2007; Creech *et al.* 2014b). In fact, considering the maximum

dispersal distance significantly improved the connectivity models, thus highlighting the importance of considering this little-used variable (Creech *et al.* 2014a). Finally, for large carnivores such as *Ursus americanus*, anthropogenic impact is the most important factor; for instance, the wall along the Mexico and USA border, is a significant barrier to dispersal and gene flow across populations (Atwood *et al.* 2011). Among medium-sized mammals like cacomixtle (*Bassariscus astutus*), the environment is the primary driver represented by the combination of vegetation type, slope, and elevation (Lonsinger *et al.* 2015).

North America… without Mexico? North America is the geographic region with the largest number of landscape genetics studies (Storfer *et al.* 2010). However, when Mexico was considered separately in our review, our analysis revealed the scarcity of studies despite its status as a megadiverse country that hosts a great variety of ecosystems (Mittermeier *et al.* 1997) and a high mammal richness, amounting to 496 species (Ramírez-Pulido *et al.* 2014). Although studies about genetics of the mammals of Mexico have been previously evaluated (Vázquez-Domínguez and Vega 2006), such assessment has not been done for landscape genetics. In this regard, it is important to mention that Rico (2019) recently published a review of landscape genetics studies conducted in Mexico to 2017, including 20 studies, with plants as the most studied taxonomic group (65%), while only two studies focused on mammals. This finding is consistent with our results, since we identified three studies for Mexico, two on rodents; of these, only one was conducted in a desert area. Garrido-Garduño *et al.* (2016) evaluated the effect of the landscape elements on the genetic structure and gene flow of *Liomys pictus* in a tropical deciduous forest, while Flores-Manzanero *et al.* (2019) determined the landscape features that influence gene flow of *Dipodomys merriami* in a region of the Chihuahuan desert. In Mexico, the tropical deciduous forest occupies 11.26 % of the national territory, mainly along the Pacific coast, while deserts represent 40% of the territory, distributed to the north and northwest (Challenger and Soberón 2008). Both ecosystems contain high levels of biodiversity and endemisms, particularly of animals (CONANP 2006; Ceballos *et al.* 2010); this, together with spatial and temporal heterogeneity, makes them suitable systems for hypothesis testing in a landscape genetics context.

Prospects for landscape genetics studies: the case of Mexico. From our review outlined here, we can assert that it is imperative in Mexico to conduct research addressing the effects of landscape and the environment on the distribution of genetic variation and structure of wild populations, through a spatially explicit approach. However, since rodents were the order of mammals most represented in this review, highlighting the studies conducted in Mexico, we believe landscape genetics studies with rodents will likely increase in the near future. This is based on the diversity of studies conducted with rodents in different environments in Mexico focused on aspects of genetic structure

and diversity (Vega *et al.* 2007; Castañeda-Rico *et al.* 2011; Espindola *et al.* 2014), taxonomy and systematics (Arellano *et al.* 2006; Álvarez-Castañeda *et al.* 2009; Fernández *et al.* 2012), phylogeography (Espinoza-Medinilla *et al.* 2006; Gutiérrez-García and Vázquez-Domínguez 2012; Álvarez-Castañeda and Murphy 2014), diversification and speciation (Castañeda-Rico *et al.* 2013; Pérez-Consuegra and Vázquez-Domínguez 2015), and even the development of molecular markers (Munguía-Vega *et al.* 2007; Vázquez-Domínguez and Espindola 2013), to mention a few. In addition, the development of environmental and climatic layers with better resolution for Mexico (Téllez-Valdés *et al.* 2010; Cuervo-Robayo *et al.* 2014) will be key for the development of these studies in the country, in combination with remote sensing data that are currently freely accessible (Landsat 8; http://landsat.usgs.gov/). Finally, deserts cover a large part of the national territory (*ca.* 70 million hectares; Challenger and Soberón 2008) and in some cases, as in the Chihuahuan desert, vegetation is patchily distributed (Grünberger 2004). It is worth highlighting that, although deserts can be thought of as relatively homogeneous systems, in reality the spatial distribution of the elements of the desert landscape renders a heterogeneous matrix that allows evaluating the structural and functional connectivity (Manel and Holderegger 2013), making deserts ideal ecosystems to conduct landscape genetics studies.

Some of the most significant advances for the study of landscape genetics in Mexico and elsewhere are worth mentioning, including the use of remote sensing data and species distribution models, which yield a better representation of the landscape and help to set hypotheses considering structure and connectivity within a spatially explicit context. The use of genomic tools (markers, bioinformatics methods, and analyses) and adaptive approaches will allow addressing questions not only regarding the effect of the landscape on genetic patterns but also about how individuals respond in terms of adaptation and selection.

Acknowledgments

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