Precipitation is the dominant driver for bird species richness, phylogenetic and functional structure in university campuses in northern China

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Abstract

Background: Although urbanization is threatening biodiversity worldwide, the increasing green urban spaces could harbor relatively high biodiversity. Therefore, how to maintain the biodiversity in urban ecosystem is crucial for sustainable urban planning and management, especially in arid and semiarid regions with relatively fragile environment and low biodiversity. Here, for the first time we linked species richness, phylogenetic and functional structure of bird assemblages in university campuses in northern China with plant species richness, glacial-interglacial climate change, contemporary climate, and anthropogenic factors to compare their relative roles in shaping urban bird diversity.

Methods: Bird surveys were conducted in 20 university campuses across Inner Mongolia, China. Ordinary least squares models and simultaneous autoregressive models were used to assess the relationships between bird species richness, phylogenetic and functional structure with environmental factors. Structural equation models were used to capture the direct and indirect effects of these factors on the three components of bird diversity.

Results: Single-variable simultaneous autoregressive models showed that mean annual precipitation was consistently a significant driver for bird species richness, phylogenetic and functional structure. Meanwhile, mean annual temperature and plant species richness were also significant predictors for bird species richness.

Conclusions: This study suggests that campuses with warmer and wetter climate as well as more woody plant species could harbor more bird species. In addition, wetter campuses tended to sustain over-dispersed phylogenetic and functional structure. Our findings emphasize the dominant effect of precipitation on bird diversity distribution in this arid and semiarid region, even in the urban ecosystem.

Keywords: Climate, Human factors, Functional structure, Phylogenetic structure, Urban bird diversity, Woody plant diversity

Background

Urban land is one of the most fast growing land-use types, and the worldwide acceleration of urbanization will profoundly threaten the global biodiversity (McDonald 2008; Aronson et al. 2014; Sol et al. 2014). Urbanized habitats always harbor some bird species with certain traits, e.g., generalists, omnivorous, cavities and canopy nesting species, while exclude others species, e.g., specialists,
complex vegetation structure is important for the main-cover in cities (Aronson et al. 2014). In addition, it is also negatively associated with the proportion of urban land-cover in cities across cities of Inner Mongolia, an arid and semiarid region of northern China. Specifically, we hypothesized that contemporary climate would directly and indirectly affect bird diversity through their effects on physiological tolerance and primary productivity, especially for the precipitation in this dry region; glacial-interglacial climate change may mainly affect the phylogenetic structure of bird communities because phylogenetic information is linked with long-term evolutionary history; more plant species would maintain high bird diversity by providing diverse habitat for most species and more food for herbivores; bird diversity may be negatively linked with anthropogenic activities.

Methods

Study area

Inner Mongolia is located at the north and northeast of China, covering 120 million ha. It has great temperature and precipitation gradients, e.g., mean annual temperature and mean annual precipitation range from −2 to 6 °C and about 40 to 450 mm, respectively (Wu et al. 2015). The strong climate differentiation results in zonal distribution of diverse vegetation types (temperate coniferous and deciduous forests, meadow steppe, typical steppe, desert steppe, steppe desert, and desert) in this arid and semiarid region (Wu et al. 2015).

Bird and woody plant surveys

Bird and plant investigation was conducted in twenty university campuses across eight cities in Inner Mongolia between October 2017 and September 2018 (Additional file 2: Figure S1). Birds survey was investigated through both transect line and point count (two to six points according to the campus area) in each campus, and covered all the main habitats (e.g., teaching buildings, lawns, woodlands and ponds) in order to search thoroughly. Each campus was investigated four times by experienced observers during four seasons, one time for each season, and about 2.5 h in a visit. All survey was conducted during 3 h after sunrise and 3 h before sunset on clear weather. Sixty-eight bird species were recorded in total (Additional file 1: Table S1). Species accumulation curve was used to assess the adequacy of bird investigation (sample was adequate, Additional file 2: Figure S2). Migrants were excluded from our analyses because of its possible confounding effect on diversity patterns (Lepczyk et al. 2008). Therefore, only resident birds were used for diversity related analyses and campus with less than three species was excluded. Threatened status of the birds was checked according to a recent publication (Jiang et al. 2016). Woody plant (e.g., trees and shrubs) in all habitats was recorded by experienced observers.
Bird phylogeny and trait data
A distribution of 5000 phylogenies was downloaded from the global phylogeny of birds (Jetz et al. 2012), including all 462 bird species in Inner Mongolia. Five thousand pseudo-posterior distributions were sampled, and the Maximum Clade Credibility tree was constructed using mean node heights by the software TreeAnnonator v1.8.2 of the BEAST package (Drummond and Rambaut 2007). The resulting consensus phylogeny was used for subsequent phylogenetic analyses.

Three traits (body size, trophic level, and habitat specificity) were selected to construct the functional dendrogram including all 462 bird species in Inner Mongolia for subsequent functional analyses. Traits data was compiled from the third and fourth volumes of Fauna of Inner Mongolia (Xu 2007, 2015). Trophic level was assigned as omnivores, granivores, frugivores, nectarivores, insectivores, piscivores and carnivores, and habitat specificity was coded according to the number of Chinese habitats that a bird inhabited (Wang et al. 2018). Distances of the three traits among all species were generated using Gower’s distance. The functional dendrogram was then constructed by hierarchical clustering using ‘complete’ method.

Climate and anthropogenic variables
Contemporary climate data, including mean annual temperature (MAT) and mean annual precipitation (MAP), was collected from worldclim (average for the years 1960–1990; Hijmans et al. 2005). For palaeoclimate, we used glacial-interglacial MAT velocity and glacial-interglacial MAP velocity, which were the ratio between the rate of climate change across time and space (Loarie et al. 2009; Feng et al. 2016). Campus age and area, as well as the population density around the campus were used as anthropogenic factors. Population density data in the year 2017 was extracted by campus coordinates from the History Database of the Global Environment (http://www.pbl.nl/this, Goldewijk et al. 2011).

Statistical analyses
Bird species richness of each campus was the number of all resident birds recorded in the four visits. Phylogenetic and functional structure were represented by Net Relatedness Index (NRI) (Webb et al. 2002). NRI is computed as:

\[ NRI = \frac{-1 \times MPD_{obs} - meanMPD_{rnd}}{sdMPD_{rnd}} \]

\( MPD_{obs} \) is the observed mean pairwise phylogenetic distance (MPD) of birds in a campus; \( meanMPD_{rnd} \) is the mean MPD of the null models (null model = "taxa labels" and were run 999 times), and \( sdMPD_{rnd} \) is the standard deviation of MPD of the null models. Positive NRI means birds in a campus are more closely related/similar than expected (clustered), while negative NRI means birds in a campus are more distantly related/dissimilar than expected (over-dispersed) (Webb et al. 2002).

To compare the regression coefficients, all dependent and independent variables were standardized (standard deviation = 1 and mean = 0) before analyses. Single-variable ordinary least squares (OLS) models were used to estimate the relationships between bird species richness, phylogenetic structure, functional structure and each associated variable. To account for spatial autocorrelation in regression residuals, simultaneous autoregressive (SAR) models were also used for single-variable analyses. In addition, climate variables and human factors could indirectly affect bird diversity through their effects on plant species richness. To assess the direct and indirect effects of these variables on bird diversity, structural equation models (SEM) were also implemented.

In addition, glacial-interglacial MAP velocity was highly correlated with MAT (−0.72), glacial-interglacial MAT velocity (0.65) and Area (0.69), thus glacial-interglacial MAP velocity was excluded for SEM models (Additional file 1: Table S2). Also, since some variates were weakly associated with bird diversity indices, only the five variables with the highest associations with bird diversity were included in the SEM models. Lastly, because of the high correlations between MAT and campus area (−0.60), we divided them into two groups for SEM models (Additional file 1: Table S2, Fig. 2; Additional file 2: Figure S3). All analyses were conducted in R (R Core Team 2016), and packages of vegan (Oksanen et al. 2015), spdep (Bivand et al. 2015) and lavaan (Rosseel 2012) were used.

Results
Twenty-nine resident bird species were recorded in the 20 university campuses, accounting for 26% of the resident birds in Inner Mongolia. Resident bird species richness in these campuses ranged from 4 (Manzhouli College of Inner Mongolia University) to 11 (Inner Mongolia University and Inner Mongolia University of Finance and Economics). Notably, there were one near threatened (Sitta villosa), one data deficient species (Rhodopechys obsoletus) in IUCN red list catalogue, and one Chinese endemic species (Garrulax davidii).

Single-variable ordinary least square and simultaneous autoregressive models showed similar association patterns (Table 1). Specifically, bird species richness significantly increased with higher precipitation, while phylogenetic and functional structure significantly decreased with precipitation (Fig. 1; Table 1), indicating there were less birds with more clustered structure of...
bird communities in dry regions. In addition, bird species richness also significantly increased with higher temperature and plant species richness (Fig. 1; Table 1).

Moreover, structural equation models also showed that bird species richness was positively correlated with temperature and precipitation (Fig. 2a). Temperature could directly and indirectly affect phylogenetic structure of bird communities (Fig. 2b). Precipitation was also negatively associated with functional structure, again indicating a more clustered functional structure of bird communities in dry regions (Fig. 2c).

Discussion

Being the first study for urban bird diversity across Inner Mongolia, we found 29 resident bird species in 20 university campuses. Notably, mean annual precipitation consistently played an important role in determining bird species richness (positive), phylogenetic (negative) and functional structure (negative), suggesting the dominant effect of water on bird diversity patterns in this arid and semiarid region, even in the urban ecosystem. Meanwhile, the positive relation between woody plant species richness and bird species richness provides important implication guidance for biodiversity conservation in urban ecosystem.

Effect of contemporary climate

Many studies have shown that contemporary climate is one of the important factors affecting bird species richness (Currie 1991; van Rensburg et al. 2002; H-Acevedo and Currie 2003; Hawkins et al. 2005; Li et al. 2013). The productivity hypothesis predicts that the increase in ambient energy could provide food resources for more animals by increasing net primary productivity, thus indirectly affect biodiversity (Brown 1981). A recent study of bird diversity in Chinese university campuses finds a significant increase of bird species richness with precipitation (Zhang et al. 2018). Another study in South Africa also suggests that bird species richness has a significantly positive relationship with precipitation (van Rensburg et al. 2002). Consistent with these studies, our analyses also found a significant and positive correlation between bird species and precipitation (range from 142 to 396 mm). In arid and semiarid regions, the limiting effect of rainfall on primary productivity may lead to this strong correlation (van Rensburg et al. 2002). Higher precipitation could promote higher primary productivity, thereby supporting more bird species.

Furthermore, we also found significant and negative correlations between precipitation and both phylogenetic and functional structure. In other words, relative dry university campuses tended to have lower bird species richness and relatively clustered/similar phylogenetic and functional structure. This result further confirms the finding of a previous study in natural environments of Inner Mongolia, i.e., regions with lower bird species richness have more clustered phylogenetic structure (Liang et al. 2018). This may suggest that environmental filtering leads to the accumulation of closely related species in dry regions. The phylogenetic niche conservatism hypothesis predicts that species in a colder or drier region tend to be closely related to each other (Qian et al. 2013). According to the phylogenetic conservatism of traits, closely related species tend to be similar in ecological characters, thus harsh environments may also harbor groups of species with similar functional traits. Another study also concludes that severe drought sustains a subset of species with particular functional traits (Olden et al. 2004).

In addition, the ambient energy hypothesis predicts that energy may directly affect the geographical pattern
Fig. 1 Scatter plots of bird species richness, phylogenetic structure (Phylo NRI) and functional structure (Funct NRI) against their three most associated variables assessed by ordinary least squares (OLS) models, which were mean annual temperature (MAT), plant species richness (Plant SR) and mean annual precipitation (MAP) for species richness, glacial-interglacial velocity in MAP (Velo MAP), glacial-interglacial velocity in MAT (Velo MAT), and campus age (Age) for Phylo NRI, MAP, campus area (Area) and Velo MAP for Funct NRI, respectively. Linear regression fits and $r^2$ were given. Dashed lines represented that the correlations were not significant. *$p<0.05$

Fig. 2 Results of structural equation models examining the direct and indirect effects of mean annual temperature (MAT), mean annual precipitation (MAP), glacial-interglacial velocity in MAT (Velo MAT), campus population density (Population) and age (Age), and plant species richness (Plant SR) on bird species richness (Bird SR, a), phylogenetic structure (Phylo NRI, b), and functional structure (Funct NRI, c). Standardized regression coefficients were given, and the strength of the effects was proportional to line width. *$p<0.05$, **$p<0.01$
of species richness in a region through the physiological limitations of animals (Currie 1991; Turner 2004). A study in British shows that summer and winter migratory birds are related to summer temperatures and winter temperatures respectively, while resident birds are related to both summer temperatures and winter temperatures (Turner et al. 1988). Consistently, our results also showed that bird species richness was significantly and positively correlated with the mean annual temperature, that is, bird species richness was lower in colder campuses. It is possible that regions with low temperatures are limiting more bird species to live in. It is also possible that low temperature could lead to limited food resources, such as plants and insects, resulting in low bird species richness. A study for terrestrial birds concludes that temperature and precipitation might influence bird diversity pattern via productivity (Hawkins et al. 2003).

Effect of woody plant species richness

On a broad scale, species richness of plants and animals has strong covariance with climate change and both increase with productivity (Waide et al. 1999). Meanwhile, plant species richness may directly and indirectly affect birds species richness (H-Acevedo and Currie 2003; Hawkins et al. 2003). Our results showed a significant and positive correlation between species richness of woody plants and birds in university campuses, that is, campuses with more woody plants supporting more bird species. A study in Mexican also concludes that insectivorous birds are more abundant in larger green space with taller trees, more tree and shrub species, and more vegetation cover in adjacent landscape in winter (Carbo-Ramírez and Zuria 2011). It has been suggested that retaining remnant trees can help to increase bird species richness and abundance, and even scattered vegetation also has important impacts on bird diversity in urban landscapes (Barth et al. 2015). Complexity of vegetation structure and woody plant species richness could provide shelter and food for diverse birds, therefore promote higher bird species richness, and are key factors of urban planning for bird species conservation (Evans et al. 2009; Aronson et al. 2014; Huang et al. 2015).

Moreover, although both ordinary least square and simultaneous autoregressive showed weak association between plant species richness and bird phylogenetic structure, structural equation models showed a significant and positive correlation between these two variables, which may be biased by the strong correlation between temperature and plant species richness. Although a study in Beijing shows that the coverage of deciduous trees could increase the evolutionary distinctiveness of bird communities in urban parks (Morelli et al. 2017). In this study, higher values of phylogenetic NRI in Chifeng College and Manzhouli College were found, which supported the largest and smallest plant species richness respectively, indicating that plant species richness maybe not the key factor that affecting bird phylogenetic structure.

Effect of human factors

Previous studies have indicated that size, age and population density of green spaces could affect urban bird diversity (Fernández-Juricic 2000; Carbo-Ramírez and Zuria 2011; Gagné et al. 2016). Generally, larger area could provide more food and habitat resources, and vegetation cover and complexity would increase over time, both of which would benefit bird diversity (Fernández-Juricic 2000). In contrast, human induced disturbance, habitat loss and fragmentation have negative effects (Gagné et al. 2016). However, recent studies for birds in Chinese urban parks and university campuses have reported that climate is more important than anthropogenic impacts on bird diversity at broad scales (Zhang et al. 2018; Liu et al. 2019). Consistently, we also found that the three anthropogenic factors had no significant effects on bird diversity. Probably because that the kinds of birds that inhabit urban greenspace generally are either human commensals (e.g., pigeons, starlings, sparrows, swallows) or the kinds of birds that rapidly get used human activity in return for food (e.g., many frugivores). Therefore, our results again indicate the important role of precipitation in shaping bird diversity in this arid and semi-arid region.

Conclusions

Being the first study on bird diversity in university campuses in arid and semi-arid Inner Mongolia, we find that precipitation is the dominant driver for taxonomic diversity, phylogenetic and functional structure of bird communities, even in the urban ecosystem. In addition, woody plant species richness is also important for bird species richness, suggesting that vegetation structure should be considered to protect bird diversity in city planning.

Supplementary information

Supplementary information accompanies this paper at https://doi.org/10.1186/s40657-020-0212-x.

Additional file 1: Table S1. List of abundance of all 68 species in 20 university campuses. Table S2. Correlations among explanatory variables. Additional file 2: Figure S1. Location of university campuses. Figure S2. Species accumulation curve of University campus birds. Figure S3. Results of structural equation models examining the direct and indirect effects of campus area (Area), age (Age), population density (Population), mean annual precipitation (MAP) and plant species richness (Plant SR) on bird functional NRI.
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Authors’ contributions
GF designed the study, CL, JL, NW and BP collected the data; GF and CL analyzed the data and wrote the paper. All authors read and approved the final manuscript.

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Availability of data and materials
The raw data that we collected are available upon request.

Ethics approval and consent to participate
Not applicable.

Consent for publication
Not applicable.

Competing interests
The authors declare that they have no competing interests.

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