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Article

# Changes in the Range of Four Advantageous Grasshopper Habitats in the Hexi Corridor under Climate Change

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Simple Summary: Grasshoppers are the most widely distributed pests in the natural grasslands of the Hexi Corridor, and clarifing the range of distribution and the main influencing factors will provide a basis for monitoring and forecasting grasshoppers in grassland. Therefore, based on the MaxEnt model, this study predicted the distribution of four grasshopper species in suitable area and analyzed the main factors affecting the distribution of the suitable area by combining five environmental variables, such as namely climate, vegetation, soil, topography, and human footprint. Climate was the main environmental variable affecting the distribution of grasshoppers habitats, and the extent of the habitat of four species of grasshoppers either increased or decreased in future.

Abstract: Oedaleus decorus asiaticus, Calliptamus abbreviatus, Angaracris rhodopa, and Myrmeleotettix palpalis are the main grasshoppers that harm the natural grassland in the Hexi Corridor. In this study, the MaxEnt model was employed to identify the key environmental factors affecting the distribution of the four grasshoppers habitats and to assess their distribution under current and future climate change conditions. The aim was to provide a basis for grasshopper monitoring, prediction, and precise control. In this study, 61 occurrences of O. decorus asiaticus, 68 occurrences of A. rhodopa, 58 occurrences of C. abbreviatus, and 92 occurrences of M. palpalis were recorded by GPS, and the distribution of suitable habitats for O. decorus asiaticus, C. abbreviatus, A. rhodopa, and M. palpalis were predicted under current and future climatic scenarios using a MaxEnt model. The average AUC and TSS values of the four grasshoppers were greater than 0.9, and the simulation results were excellent and highly reliable. The mean annual precipitation was the main factor limiting the current range of suitable areas for these four species. Under the current climate, O. asiaticus, C. abbreviatus, and A. rhodopa were mainly distributed in the central and eastern parts of the Hexi Corridor, and M. palpalis was distributed throughout the Hexi Corridor, with a potential distribution area of 1.44×10<sup>4</sup>, 1.43×10<sup>4</sup>, 1.29×10<sup>4</sup>, and 2.12×10<sup>4</sup> km<sup>2</sup>, accounting for 15.3, 15.2, 13.7, and 22.5% of the total area of the grasslands in the Hexi Corridor, respectively. The highly suitable areas of O. asiaticus, C. abbreviatus, and A. rhodopa were mainly distributed in the east-central part of Zhangye City, the western part of Wuwei City, and the western and southern part of Jinchang City, with areas of 0.35×104, 0.29×104, and 0.20×104 km2, accounting for 3.7, 3, and 2.2% of the grassland area, respectively. The high habitat of M. palpalis was mainly distributed in the southeast of Jiuquan City, the west, middle, and east of Zhangye City, the west of Wuwei City, and the west and south of Jinchang City, with an area of 0.32×104 km<sup>2</sup>, accounting for 3.4% of the grassland area. In the 2030s, the range of O. asiaticus, C. abbreviatus, A. rhodopa, and M. palpalis was predicted to decrease.

Keywords: grasshopper; MaxEnt; climate change; suitable areas; Hexi Corridor

#### 1. Introduction

The Qilian Mountains are situated at the center of the Eurasian continent, at the convergence of the Qinghai–Tibet Plateau, the Mongolian Plateau, and the Loess Plateau. The forests and grasslands of the Qilian Mountains collectively form an ecological barrier in the northwest region of China [1–3]. Due to the strong folding uplift of the Qilian Mountains and significant subsidence in the corridor zone, the vegetation and climate in the region exhibit clear patterns of vertical differentiation, resulting in various vegetation types. Among them, natural grasslands are the predominant vegetation type, covering approximately 53% of the total area [4,5]. Influenced by climate and topographical conditions, the grassland ecosystem of the Qilian Mountains is complex and diverse, providing varied and suitable habitat conditions for various locust species [6]. On a small scale, numerous scholars have conducted research on the species composition [7] and quantitative characteristics [8] of grasshoppers in the Qilian Mountains, as well as their relationships with vegetation communities [9], topography [10], temperature, and rainfall [11]. Research on the distribution of suitable habitats for grasshoppers using the aforementioned environmental factors is limited. Lv et al. [12] made predictions about suitable habitats for grasshoppers in the alpine grasslands of the Qilian Mountains.

Insects, as a major group of animals, have a distribution closely correlated with the environment (climate, topography, and soil physicochemical properties) and vegetation [13]. On a large scale, climate is the primary limiting factor for the distribution of insects, and climate change can alter the spatial patterns of insect distribution [14]. For example, warming climates can either increase or decrease the range of an insect's distribution [15,16], leading to the expansion of insect distribution towards higher latitudes and altitudes [17]. Topography and soil primarily influence species distribution on a small scale [18]. Topography redistributes hydrothermal conditions, affecting the distribution of grasshoppers [19]. Furthermore, soil characteristics influence grasshoppers' choice of oviposition sites, egg hatching, and mortality rates [20–22]. Due to variations in study areas, topographical factors, such as altitude, slope, and aspect, differ in their effects on grasshopper distribution [23,24]. Environmental factors also indirectly affect the community and spatial distribution of grasshoppers by influencing the growth and distribution of plant communities [25]. Vegetation, as a key ecological factor, not only provides food resources but also offers suitable habitats for grasshoppers [26].

By utilizing grasshopper geographical distribution data and combining them with environmental variables, establishing multidimensional niche models for grasshoppers enables the monitoring of grasshopper distribution and the assessment of habitat quality on a large spatial scale. This, in turn, facilitates the development of scientifically rational pest control measures [27,28]. Currently, widely used species distribution models (SDMs) include Random Forest (RF) [29], Logistic Regression Model [30], Generalized Linear Model (GLM) [31], Ecological Niche Factor Analysis (ENFA) [32], Bioclimate Analysis and Prediction System (BIOCLM) [33], and Maximum Entropy (MaxEnt) [34,35]. Among them, due to its advantages of being unaffected by sample size, simple operation, and high predictive accuracy [36], MaxEnt is widely applied in different research areas such as the conservation of animal and plant habitats [37,38], protection of endangered species [39], biological invasion [40,41], and disease prevention and surveillance [42–44]. Many scholars have researched the suitable habitats and influencing factors of grasshoppers in China using MaxEnt. Due to variations in the study area, time, and selected environmental variables, the main environmental factors affecting grasshopper distribution differ. However, the predicted results of the models have consistently demonstrated high credibility [45–48].

Both the Hexi Corridor and the Qilian Mountains have complex topography and geomorphology, making grasshopper control difficult. Traditional grasshopper monitoring mainly collects data manually, which is time-consuming and labor-intensive, and grasshoppers are widely distributed, especially in remote areas of the steppe, which makes field investigation difficult.

In this study, the geographic distribution data of grasshoppers combined with MaxEnt were used to determine suitable zones for four dominant grasshoppers, namely *Oedaleus decorus asiaticus*, *Calliptamus abbreviatus*, *Angaricus rhodopa*, and *Myrmeleotettix palpalis*, in the natural grassland of the

Hexi Corridor to compare the relationship between environmental variables and the distribution of the four grasshoppers in suitable zones, to predict the suitable zones for the four grasshoppers in current and future climates. This study will provide theoretical guidance for the monitoring and prediction of grasshoppers in the Hexi Corridor and the northern Qilian Mountains.

# 2. Materials and Methods

#### 2.1. Study Area

This study was conducted in the Hexi Corridor (Figure 1), which is located in the northern foothills of the Tibetan Plateau and the southern edge of the Mongolian Plateau. It is a transitional zone where the two major plateaus of Mongolia and Qinghai are intertwined. Its natural climate is not only affected by the geographic latitude but also by the vertical climate change on the Tibetan Plateau and the continental climate on the Mongolian Plateau, which is diversified and drastically changed [49]. The climate is temperate continental, with an annual precipitation amount of 40–300 mm and an annual temperature of 6.2–9.0°C. The annual evaporation in most areas exceeds 1500 mm. The altitude is 1300–4200 m. Due to the strong folded uplift of the Qilian Mountains and the substantial subsidence of the corridor zone, the area has evident vertical zonation. From low to high altitude, the grassland types include low plain meadow, swamp meadow, temperate desert, temperate grassland desert, temperate desert steppe, temperate steppe, mountain meadow, alpine meadow, alpine scrub meadow, alpine steppe, and alpine desert. The soil types include montane gray calcium soil, montane chestnut calcium soil, montane grey brown soil, scrub meadow soil, and chilly desert soil [50–52].

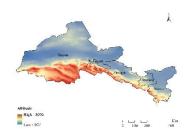
#### 2.2. Data Acquisition and Processing

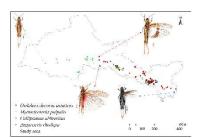
#### 2.2.1. Grasshopper Survey Data

Grasshopper surveys were conducted according to the agricultural industry standard of the People's Republic of China (NY/T1578-2007 Grasshopper investigation specification). From June to August 2021–2023, field surveys were conducted using GPS to record latitude, longitude, and elevation, and four dominant grasshoppers (*O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis*) were selected from the natural steppes of the Hexi Corridor for the study.

Using the "Create Fishnet" tool in ArcGIS 10.2, a grid of 5 km × 5 km was established to ensure that there was only one distribution point within each grid. Ultimately, there were 61 distribution points for *O. decorus asiaticus*, 68 distribution points for *A. rhodopa*, 58 distribution points for *C. abbreviatus*, and 92 distribution points for *M. palpalis*, with a total of 279 distribution points. The geographic information for the four grasshoppers was saved in csv format for MaxEnt modeling.







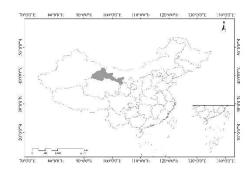


Figure 1. Distribution points of the grasshoppers.

#### 2.2.2. Environmental Variables

Climate data were obtained from the World Climate Database (World Clim version 2.0, http://www.worldclim.org/) for 19 biological variables with a spatial resolution of 1 km. The BCC-CSM2-MR climate model under the Sixth International Coupled Model Intercomparison Program (CMIP6) climate model was selected for the future climate variables, using data from 2021 to 2040 under four Shared Socio-economic Pathways (SSPs) scenarios: SSP126 (low GHG emissions: carbon dioxide emissions fall to net zero around 2075); SSP245 (intermediate GHG emissions: carbon dioxide emissions will remain at current levels through 2050 and then decline but will not reach net zero by 2100); SSP370 (high GHG emissions: carbon dioxide emissions will double by 2100); and SSP585 (very high GHG emissions: carbon dioxide emissions will triple by 2075). BCC-CSM2-MR significantly improved the simulation of the climate distribution of mean annual precipitation in China compared to CMIP5 from the previous generation [53].

The land surface temperature and normalized difference vegetation index (NDVI) were obtained from MODIS (https://modis.gsfc.nasa.gov/), using average values from 2013 to 2022 with a spatial resolution of 1 km. The grassland type from Gansu Provincial Grassland Technology Extension General Station was converted to raster using the ArcGIS 10.2 conversion tool, with spatial resolution resampled to 1 km. The topographic variables were obtained from the elevation downloaded from the Geospatial Data Cloud (https://www.gscloud.cn/) with a resolution of 1 km, and elevation, slope, and slope direction were calculated using ArcGis 10.2. Soil was obtained from the Harmonized World Soil Database (HWSD, https://gaez.fao.org/pages/hwsd), made publicly available by the Food and Agriculture Organization of the United Nations (FOA), at a resolution of 1 km. Human Footprint (hfp) was obtained from the Fig Share repository (https://figshare.com/) at a resolution of 1 km.

Table 1. Environment variables.

Туре	Code	Variable name					
	Bio1	Annual mean temperature					
	Bio2	Mean diurnal range (monthly mean (max temp minus					
	D102	min temp))					
	Bio3	Isother mality (BIO2/BIO7) (×100)					
	Bio4	Temperature seasonality (standard deviation×100)					
Climatic	Bio5	Max temperature of warmest month					
	Bio6	Min temperature of coldest month					
	Bio7	Temperature annual range (BIO5 minus BIO6)					
	Bio8	Mean temperature of wettest quarter					
	Bio9	Mean temperature of driest quarter					
	Bio10	Mean temperature of warmest quarter					

	Bio11	Mean temperature of coldest quarter						
	Bio12	Annual precipitation						
	Bio13	Precipitation of wettest month						
	Bio14	Precipitation of driest month						
	Bio15	Precipitation seasonality (coefficient of variation)						
	Bio16	Precipitation of wettest quarter						
	Bio17	Precipitation of driest quarter						
	Bio18	Precipitation of warmest quarter						
	Bio19	Precipitation of coldest quarter						
	LST	Land surface temperature						
***	NDVI	Normalized difference vegetation index						
Vegetation	GT	Grassland type						
	Elevation	Elevation						
Topographical	Slop	Slop						
	Aspect	Aspect						
	AWC	Soil available water content						
Soil	ST	Soil type						
	PH	T_PH						
Human activity	HFP	Human Footprint Index						

#### 2.2.3. Environment Variable De-correlation

As environmental variables are highly spatially correlated, this may lead to the overfitting of the model and ultimately affect the prediction results [54]. Therefore, 19 biological variables of grasshopper distribution points were extracted using multi-value extraction to points in ArcGIS 10.2. The correlations among the 19 biological variables were tested using Pearson's correlation analysis in SPSS 24, and variables with absolute values of correlation coefficients |r|<0.8 for environmental variables were retained [55].

#### 2.3. MaxEnt Model Runs

Using ArcGIS10.2 to remove the spatial correlation after grasshopper coordinate points, the environmental variables with high correlation were converted into ASCII format and then imported into MaxEnt3.4.4. Of the distribution point data, 75% were used for modeling, and 25% were used for validation. There were 10,000 iterations. The run was repeated 30 times, and the average value was selected as a prediction of the distribution of grasshoppers. The results were exported as logistic models and saved in asc format [56]. The receiver operating characteristic curve (ROC) test simulation prediction results, ROC curve, and horizontal coordinate axis were used to determine the area under the ROC curve (AUC). The accuracy of the AUC value was between 0 and 1. The higher the AUC value, the higher the accuracy of the model. The prediction results were classified as failure (0.5–0.6), poor (0.6–0.7), general (0.7–0.8), good (0.8–0.9), and excellent (0.9–1.0) [57]. The True Skill Statistic (TSS) value was in the range of −1 to 1. The higher the TSS value, the greater the consistency of the observed values with the predicted values, and the better the model. The greater the model effect, the lower the TSS value, the worse the consistency, and the worse the model prediction effect [58]. The potential distribution of grasshoppers obtained from the MaxEnt model was transformed into raster form using ArcGIS10.2, and the simulation results were reclassified (Reclassify) using the natural intermittent point classification method (Jenks). The grasshopper's fitness zone was classified

into non-fitness zone, low fitness zone, medium fitness zone, and high fitness zone, and the fitness zone rank of grasshoppers was obtained using the Arc GIS10.2 distribution map. At the same time, the spatial statistics function of ArcGIS10.2 was utilized to calculate the areas of different suitable zones.

## 3. Results

#### 3.1. Accuracy of the MaxEnt Model

The prediction results of the MaxEnt model showed that the mean AUC values of *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis* were 0.946, 0.949, 0.958, and 0.929, and that the mean TSS values were 0.971, 0.970, 0.972, and 0.954, respectively. The mean AUC and TSS values of the four grasshoppers were greater than 0.9, indicating that the model prediction results had high reliability and could reasonably simulate the distribution of the four locust species (Table 2).

Time	Emission scenarios	O. decorus asiaticus		C. abbreviatus		A. rho	dopa	M. palpalis	
		Training	Test	Training	Test	Training	Test	Training	Test
		AUC	AUC	AUC	AUC	AUC	AUC	AUC	AUC
Current		0.971	0.946	0.970	0.949	0.972	0.958	0.954	0.929
	SSP126	0.973	0.947	0.971	0.944	0.972	0.953	0.955	0.932
2021-	SSP245	0.974	0.950	0.967	0.942	0.973	0.955	0.956	0.933
2040	SSP370	0.974	0.951	0.972	0.943	0.972	0.952	0.956	0.931
	SSP585	0.972	0.946	0.970	0.946	0.972	0.954	0.956	0.929

**Table 2.** Average AUC and TSS values of the model run.

#### 3.2. Effects of Major Environmental Variables on the Distribution of Grasshoppers

Among the five types of variables, namely climate, vegetation, topography, soil, and human footprint, climate made the greatest cumulative contribution to *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis*, accounting for 47.6, 46.9, 53.8, and 42.2%, respectively. Vegetation variables accounted for 18.8, 10.2, 30.8, and 34.7%, respectively, and topography variables accounted for 5.7, 6.8, 4.0, and 8.3%, respectively. Soil variables accounted for 19.0, 16.2, 6.0, and 2.4%, respectively, and human footprint variables accounted for 8.9, 19.9, 5.8, and 12.4%, respectively. Among the climatic variables, the average annual rainfall (Bio12) contributed the most to *O. decorus asiaticus*, *C. abbreviatus*, *and A. rhodopa* (33.6, 33.5, and 35.5%, respectively). The NDVI contributed the most to *M. palpalis*, with 31.8%, while the average annual rainfall (Bio12) contributed to *M. palpalis*, with 9.8%.

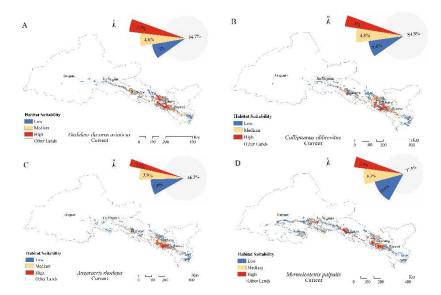
							O	1 1			
O. decorus asiaticus			C. abbreviatus			A. rhodopa			M. palpalis		
varia bles	Percent contribution (%)	Cumul ative contri bution rate (%)	Varia bles	Percen t contri bution (%)	Cumul ative contri bution rate (%)	Varia bles	Percen t contri bution (%)	Cumul ative contri bution rate (%)	Varia bles	Percen t contri bution (%)	Cumul ative contri bution rate (%)
Bio1 2	33.6	33.6	Bio12	33.5	33.5	Bio12	35.5	35.5	NDV I	31.8	31.8
AW C	18.8	52.4	HFP	19.9	53.4	NDV I	30.3	65.8	HFP	12.4	44.2
NDV I	18.6	71	AWC	15.9	69.3	Bio7	8.5	74.3	Bio12	9.8	54
Bio7	9.3	80.3	NDV I	9.7	79	HFP	5.8	80.1	Bio1	9.5	63.5
HFP	8.9	89.2	Bio7	7.3	86.3	AWC	5.4	85.5	Bio2	8.2	71.7
Slop	3.8	93	Slop	4.8	91.1	Bio15	4.1	89.6	Bio7	8.1	79.8
Bio1	2.8	95.8	Bio3	2.7	93.8	Slop	2.8	92.4	Slop	5.9	85.7

**Table 3.** Relative contributions of variables to grasshoppers.

Elev ation	1.5	97.3	Bio15	2	95.8	LST	2.5	94.9	Bio19	5.6	91.3
Bio2	0.9	98.2	Eleva tion	1.3	97.1	Bio2	1.9	96.8	GT	2.9	94.2
Bio1	0.8	99	Bio1	0.9	98	Aspe ct	1.1	97.9	Aspe ct	1.8	96
Aspe ct	0.4	99.4	Aspe ct	0.7	98.7	Bio1	0.7	98.6	AWC	1.4	97.4
GT	0.2	99.6	GT	0.5	99.2	GT	0.5	99.1	ST	0.9	98.3
Bio1	0.2	99.8	Bio2	0.3	99.5	Bio19	0.4	99.5	LST	0.6	98.9
ST	0.1	99.9	ST	0.2	99.7	Bio4	0.2	99.7	Eleva tion	0.6	99.5
PH	0.1	100	PH	0.1	99.8	ST	0.1	99.8	Bio14	0.3	99.8
LST	0	100	LST	0.1	99.9	Eleva tion	0.1	99.9	PH	0.1	99.9
			Bio4	0.1	100	PH	0.1	100	Bio4	0.1	100

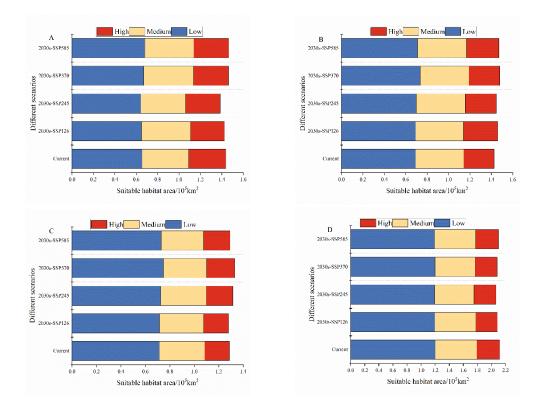
## 3.3. Distribution and Size of Suitable Areas for Grasshoppers in the Current Climate

The grassland area of the Hexi Corridor is about 9.4×10<sup>4</sup> km². The suitable areas of *O. decorus asiaticus*, *C. abbreviates*, and *A. rhodopa* were mainly located in the middle and eastern parts of the Hexi Corridor, with total suitable areas of 1.44×10<sup>4</sup>, 1.43×10<sup>4</sup>, and 1.29×10<sup>4</sup> km², respectively. The suitable area of *M. palpalis* was located throughout the Hexi Corridor, with a total suitable area of 2.12×10<sup>4</sup> km² (Figure 3). Under the current climatic background, suitable areas for *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis* accounted for 15.3, 15.2, 13.7, and 22.5% of the grassland area, respectively (Figure 2). The highly suitable areas for *O. decorus asiaticus*, *C. abbreviates*, and *A. rhodopa* were mainly distributed in the central and eastern parts of Zhangye City, the western part of Wuwei City, and the western and southern parts of Jinchang City, with areas of 0.35×10<sup>4</sup>, 0.29×10<sup>4</sup>, and 0.20×10<sup>4</sup> km², respectively, accounting for 3.7, 3, and 2.2% of the grassland area, respectively. The highly suitable area for *M. palpalis* was mainly located in the southeastern part of Jiuquan City, Zhangye City, the western, central, and eastern part of Wuwei City, and the western and southern part of Jinchang City, with an area of 0.32×10<sup>4</sup> km², accounting for 3.4% of the grassland area.



**Figure 2.** Distribution of suitable areas and proportion of suitable habitats for (A) *Oedaleus decorus asiaticus*, (B) *Calliptamus abbreviates*, (C) *Angaricus rhodopa*, and (D) *Myrmeleotettix palpalis* under the current climate scenario.

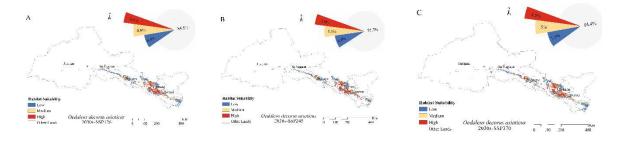




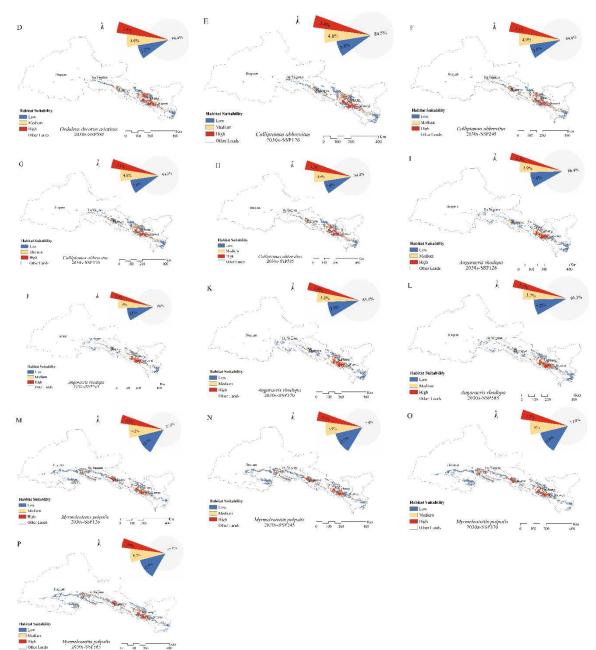
**Figure 3.** Changes in the size of suitable areas for (A) *Oedaleus decorus asiaticus*, (B) *Calliptamus abbreviates*, (C) *Angaricus rhodopa*, and (D) *Myrmeleotettix palpalis* under current and future climate scenarios.

# 3.4. Potential Distribution of Grasshoppers under Future Climates

The extent of the main habitats of the four grasshoppers did not change under future climate changes. Over time, the fitness zones of *O. decorus asiaticus*, *C. abbreviates*, and *A. rhodopa* all increased, and the range of *M. palpalis*' fitness zone decreased. Under future climate change, the total area of the suitable zone of *O. decorus asiaticus* under SSP126, SSP245, SSP370, and SSP585 accounted for 15.2, 14.7, 15.6, and 15.6% of the grassland area, respectively. Compared to the area of the current suitable zone, the area of *O. decorus asiaticus* under SSP126 decreased, and the area of *O. decorus asiaticus* under SSP245, SSP370, and SSP585 increased. *Calliptamus abbreviates* increased its suitable area under SSP126, SSP245, SSP370, and SSP585, which accounted for 15.5, 15.4, 15.7, and 15.6% of the grassland area, with the largest increase of 1.48×10<sup>4</sup> km<sup>2</sup> under SSP370. The fitness zone of *A. rhodopa* decreased in size under SSP126, increased in size under both SSP245 and SSP370 and did not change in size under SSP585. *Myrmeleotettix palpalis* had the largest suitable area, which was reduced under SSP126, SSP370, and SSP585, accounting for 22.2, 22.0, 22.1, and 22.3% of the grassland area, with the largest reduction under SSP245, which was reduced by 0.5 × 10<sup>4</sup> km<sup>2</sup>.







**Figure 4.** Distribution of suitable areas and proportion of suitable habitats for (A–D) *Oedaleus decorus asiaticus*, (E–H) *Calliptamus abbreviates*, (I–L) *Angaricus rhodopa*, and (M–P) *Myrmeleotettix palpalis* in the 2030s.

# 4. Discussion

# 4.1. Selection of Distribution Points and Variables for the MaxEnt Model

The MaxEnt model is based on the ecological niche principle, which predicts the potential distribution of a species from its occurrence record and environmental variables [57]. In this study, the MaxEnt model was run 30 times, and the average AUC and average TSS of *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis* were greater than 0.9, indicating that the model had high accuracy for the simulation of the fitness zones of four grasshopper species. Since grasshopper population size and distribution are in a state of dynamic change throughout the life history and because the MaxEnt Model assumes that the species are in equilibrium, the accuracy of the model may be reduced [45]. With the expansion of human activities, some grassland areas have been reclaimed for farmland or building land, leading to changes in grasshopper distribution. Therefore,

the human footprint was selected to explain the effects of human activities on grasshoppers, and increasing human activity variables improved the model predictions [59].

#### 4.2. Influence of Environmental Variables on Grasshopper Distribution

Climate is a major factor influencing the large-scale distribution patterns of species [60]. As a result of climate change, which causes changes in global rainfall patterns, these changes directly or indirectly affect the growth, development, and survival of insects [61]. There are significant spatial variations in annual precipitation in the Hexi Corridor, and the degree of aridity generally increases gradually from the southeast to the northwest [62]. The MaxEnt model showed that the cumulative contribution of climate to O. decorus asiaticus, C. abbreviatus, A. rhodopa, and M. palpalis were highest, at 47.6, 46.9, 53.8, and 42.2%, respectively. This indicates that climate is the main factor affecting locust distribution. Among them, the mean annual precipitation (Bio12) contributed the most to O. decorus asiaticus, C. abbreviatus, and A. rhodopa, with contributions of 30.3, 40.1, and 43.6%, respectively, while the mean annual temperature (Bio1) had a lower contribution. It has been shown that grasshopper infestations are highly correlated with precipitation and have a very weak correlation with temperature; grasshopper population densities increase dramatically in the following year or in the following years in dry, cooler climates [63]. In addition, grasshoppers are prone to forming plagues under extreme climatic conditions, especially during dry and warm years [64]. Stunting occurs in the eggs of certain grasshoppers in response to adverse environmental conditions that are inadequate for the survival of more grasshoppers [65]. During the investigation period of this study, the Hexi Corridor was dry for three consecutive years, and grasshopper colonies were more abundant only on a small regional scale. Therefore, it is hypothesized that a major grasshopper outbreak may occur after the drought ends. Ambient temperature is a critical factor for grasshopper growth and development, and deviation from the optimum temperature affects all biological functions in grasshoppers [66]. The low contribution of mean annual temperature and land surface temperature to grasshoppers in this study may be related to the high temperature and drought during the study period.

Changes in the growth of grassland vegetation and its habitat vegetation caused by seasonal and climatic conditions can alter the grasshopper community structure [67]. The occurrence of grasshoppers is synchronized with changes in vegetation growth [68]. In this study, NDVI and grassland type were used as vegetation variables, and the vegetation variables, which were second only to climate variables, contributed 18.8, 10.2, 30.8, and 34.7% to *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis*, respectively. Among them, NDVI contributed 18.6, 9.7, 30.3, and 31.8% to *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis*, respectively, and was the main vegetation factor influencing the distribution of grasshoppers. The NDVI values for the distributions of *O. decorus asiaticus*, *C. abbreviates*, and *M. palpalis* ranged from 0.3 to 0.8, and the distribution probability of *A. rhodopa* increased after the NDVI value was greater than 0.4. Therefore, vegetation growth directly influences grasshopper habitat selection.

Topographic and soil factors are important in the study of small scale patterns of species [69,70]. Among them, topography is a multidimensional variable that includes factors such as elevation, slope direction, slope gradient, slope shape, and slope position, which not only determine the spatial distribution of light, heat, water, and soil but also directly affect the distribution of plant and animal communities and the formation of population patterns [71]. The northern Qilian Mountains are steep and have an overall slope. In this study, the four grasshoppers were mainly distributed at a slope of about 71°, and the slope contributed 3.8, 4.8, 2.8, and 5.9% to the distribution of *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis*, which was an important topographic factor influencing the distribution of the four grasshoppers in suitable areas. Elevation contributed less to *O. decorus asiaticus* and *C. abbreviatus* but was more important than slope and direction. It also contributed less to *A. rhodopa* and *M. palpalis*, both in terms of contribution and importance. At an altitude of about 2700 m, the distribution probability of all four grasshoppers was higher. The environment is wetter and colder above an altitude of more than 3000 m, and below an altitude of 1500 m, it is mostly desert, with drastic changes in heat and cold, dryness, and little rain, being windy and sandy, which are all

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unfavorable for grasshopper survival. Soil texture, water content, salinity, and pH affect grasshoppers' choice of spawning sites, egg development, and hatching. In addition, soil indirectly affects grasshopper distribution by influencing vegetation type and growth [72,73]. In this study, soil moisture contributed 18.8, 15.9, 5.4, and 1.4% to the distribution of *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis*, respectively, and was the main soil variable affecting grasshopper distribution.

The Global Human Footprint mapped by eight variables—built environment, population density, night lighting, cropland, pasture, roads, railroads, and navigable waterways—were used in this study to reflect the impact of human activities on grasshopper distribution. Livestock grazing is one of the most important human activities affecting grasshopper distribution, and grazing alters the grasshopper community structure [74,75]. Hao et al. [76] found that grazing reduced the diversity of grasshopper species in arid regions but significantly increased the number of dominant species. Cease et al. [77] also found that overgrazing promoted outbreaks of grasshoppers. In this study, the human footprint contributed 8.9, 19.9, 5.8, and 12.4% to the distribution probabilities of O. decorus asiaticus, C. abbreviatus, A. rhodopa, and M. palpalis, respectively, and the distribution probabilities of the four grasshoppers increased significantly as the intensity of the human footprint increased. Thus, scientific grassland management can reduce grasshopper outbreaks. It has been found that nighttime lights attract grasshoppers [78]. With the development of the economic zone in the Hexi Corridor, the nighttime lighting brought about by infrastructure construction has also become a factor affecting the distribution of grasshoppers. Nighttime lights may prolong the photoperiod and affect grasshopper spawning. Hiroshi [79] found that grasshopper females laid non-dormant and dormant eggs under long and short photoperiods. Thus, human activities have a significant impact on grasshopper growth, development, reproduction, and habitat selection.

The importance of individual environmental factors varied for different grasshoppers, and there was prioritization among environmental variables. Moreover, grasshoppers generally tend to be distributed in grasslands in the form of swarms. Therefore, when predicting grasshopper occurrence, the main environmental factors affecting grasshopper occurrence should be prioritized, and the dominant species of the swarm should be the main monitoring object.

#### 4.3. Changes in the Distribution of Grasshopper Habitat Areas under Future Climate Scenarios

The MaxEnt model was used to predict the distribution ranges of the fitness zones of *O. decorus asiaticus*, *C. abbreviatus*, *A. rhodopa*, and *M. palpalis* under four emission scenarios (SSP126, SSP245, SSP370, and SSP585) in the 2030s. The results showed that under the four discharge scenarios, the size of the suitable area for *O. decorus asiaticus*, *C. abbreviatus*, *and A. rhodopa* expanded relative to the current situation, while *M. palpalis'* suitable area decreased in all scenarios. Meynard et al. [80] predicted that the distribution area of *Schistocerca gregaria* would change under extreme climate change scenarios, with a decrease in the range contraction of the northern subspecies *Schistocerca gregaria gregaria* and an increase in the range contraction of the southern subspecies *Schistocerca gregaria flaviventri*. Among all variables, climatic variables, especially precipitation, were closely related to grasshopper distribution. The MaxEnt model predicted the geographic distribution of dominant grasshoppers in the Hexi Corridor under the future climate change context, which can help monitor grasshopper occurrence and provide a reference for prevention and control in key areas.

# 5. Conclusions

In this study, we predicted the distribution of the dominant grasshopper niche in grasslands of the Hexi Corridor under current and future climates based on the MaxEnt model. The main environmental variables affecting the distribution of the grasshopper niche was rainfall, followed by vegetation, soil, and topography. The range of the grasshoppers niche will be altered under future climate change.

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**Data Availability Statement:** The data are not publicly available because the data need to be used in future work.

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