

Long-term monitoring of the European roller (*Coracias garrulus*) in Ukraine: is climate behind the changes?

Tetiana Shupova¹ , Volodymyr Tytar² 

¹ Institute of Evolutionary Ecology, NAS of Ukraine (Kyiv, Ukraine)

² I. I. Schmalhausen Institute of Zoology, NAS of Ukraine (Kyiv, Ukraine)

article info

key words

Coracias garrulus, species distribution modelling, ecological niche, climate change, velocity of climate change.

correspondence to

Volodymyr Tytar;
I. I. Schmalhausen Institute of
Zoology, NAS of Ukraine; 15
Bohdan Khmelnytsky Street, Kyiv,
01601 Ukraine;
Email: vtytar@gmail.com;
orcid: 0000-0002-0864-2548

article history

Submitted: 27.11.2022. Revised:
01.12.2022. Accepted: 30.12.2022.

cite as

Shupova, T., V. Tytar. 2022. Long-term monitoring of the European roller (*Coracias garrulus*) in Ukraine: is climate behind the changes? GEO&BIO, 23: 154–171.

abstract

The European range of the roller was formerly more extensive, but since the 1980s there has been a long-term decline in numbers and in range, particularly towards the north, including much of north-western Ukraine. Our specific goals were to reconstruct the environmentally suitable range of the species in Ukraine before the 1980s, gain better knowledge on its requirements, compare the past and current suitable areas, infer the regional and environmental variables that best explain its occurrence, and quantify the overall range change in the country. For these purposes we created a database consisting of 584 findings made in Ukraine, based on a lengthy record of occurrences extending back to 1851: 203 for the period prior to 1980, 91 for records made between 1985 and 2009, and 290 records made between 2010 and 2020. We employed a species distribution modelling (SDM) approach to hind-cast changes in the suitable range of the roller during historical times across Ukraine and to derive spatially explicit predictions of environmental suitability for the species under current climate and a set of factors that were hypothesised to be of importance to roller presence and securing a sufficient food base. SDMs were created for three time intervals (before 1980, 1985–2009, 2010–2020) using corresponding climate data. SDMs show a decline of suitable for rollers areas in the country from around 86 to 44%. Several factors, including land cover and land use, human population density etc. that could have contributed to the decline of the species in Ukraine, were considered. For example, the loss of area of ‘short vegetation’ appears detrimental, although recent gains in this respect have favoured the bird in the Chornobyl Exclusion Zone and around, where Landsat images show the change from a previously vibrant agricultural and forestry economy, when crops have been replaced by grasslands. Threats posed to the roller by habitat and land use change are also likely to be compounded by the effects of global climate change. In summary, we suggest climate change, in particular velocity, have been responsible for shaping the contemporary home range of the European roller in Ukraine and perhaps beyond.

Довготривалий моніторинг євразійської сиворакші (*Coracias garrulus*) в Україні: чи стоїть клімат за змінами?

Тетяна Шупова, Володимир Титар

Резюме. Раніше європейський ареал сиворакші був ширшим, але з 1980-х років спостерігається тривале зниження чисельності виду та скорочення його ареалу, особливо на півночі, включаючи більшу частину пн.-зах. України. Мета дослідження полягала в реконструкції ареалу виду в Україні, який існував до 1980-х років, та склався пізніше. При цьому передбачалось отримання поглиблених знань про екологічні вимоги виду, порівняння географічних меж минулих та сучасних територій, придатних для перебування птахів, проведення аналізу факторів, які пояснюють особливості поширення сиворакші та дати кількісну оцінку загальних змін ареалу виду в країні. Для цього складена база даних, що складається з 584 знахідок птахів, що гніздилися, зроблених в Україні на основі довготривалих спостережень, реєстрація яких починається з 1851 року: 203 реєстрації за період до 1980 року, 91 для записів, зроблених між 1985 і 2009 роками, і 290 записів, зроблених між 2010 та 2020 роками. Ми застосували підхід, заснований на принципах моделювання поширення видів (SDM), також відомий як «моделювання екологічної ніші», для ретроспективного вивчення змін ареалу сиворакші протягом історичного часу по всій Україні та отримання просторових прогнозів екологічно придатних для виду територій як за умов поточного клімату, так і минулого клімату, та впливу низки факторів, які за припущенням мають важливе значення для перебування сиворакші та сприяють забезпеченню достатньої бази для живлення птахів. Моделі були створені для трьох часових інтервалів (до 1980, 1985–2009, 2010–2020) з використанням відповідних кліматичних даних. Моделі показують скорочення екологічно придатних для птахів територій з 86 до 44%. Було розглянуто кілька факторів, які могли сприяти погіршенню ситуації для виду в Україні. Наприклад, втрата площі «низькорослої рослинності» по країні є негативним фактором. Лише у Чорнобильській зоні відчуження та поблизу неї цей процес, як показують знімки Landsat, є зворотній, що сприяло птахам. Загрози, пов'язані зі зміною середовища існування та землекористування, можуть також посилюватися впливом глобальної зміни клімату. Підводячи підсумок, ми припускаємо, що зміна клімату, зокрема її швидкість, спричинила формування сучасного ареалу сиворакші в Україні та, можливо, за її межами.

Ключові слова: *Coracias garrulus*, моделювання поширення видів, екологічна ніші, зміна клімату, швидкість кліматичних змін.

Адреса для зв'язку: Володимир Титар; Інститут зоології ім. І. І. Шмальгаузена НАН України; вул. Богдана Хмельницького, 15, Київ, 01601 Ukraine; Email: vtytar@gmail.com; orcid: 0000-0002-0864-2548

Introduction

The European roller (*Coracias garrulus*) is the only member of the roller family of birds to breed in Europe. Being a bird of warmer regions, its overall range extends into the Middle East, Central Asia, and Morocco. The species is commonly met in dry, open country with scattered trees, preferring lowlands [Cramp 1985]. The European roller is a long-distance migrant, wintering in Africa south of the Sahara. In Ukraine, they arrive at nesting sites in late April–early May. The bird, particularly in Ukraine, is mainly a secondary cavity nester. After egg-laying, chicks start to fly within 26 to 28 days, but still depend on their parents for about 3 weeks more. The diet of adult rollers is dominated by *Coleoptera*, whereas nestlings mostly consume *Orthoptera*, such as grasshoppers and bush crickets [Catry *et al.* 2019]; opportunistically small vertebrates and smaller insects (e.g. winged ants) are also consumed [Sosnowski & Chmielewski 1996; Aviles & Parejo 2002; Kiss *et al.* 2014]. Autumn migration begins in August/September.

The European range of the roller was formerly more extensive, but there has been a long-term decline in numbers and in range [Birdlife International 2015], particularly towards the north of the range, e.g. Poland [Sosnowski & Chmielewski 1996] and Estonia [Lüütsepp *et al.* 2011], and much of north-west Ukraine [Havryś 2009]. These marked population declines have been accompanied by local extinctions and overall range contraction due to, as suggested, land use changes [Kovács *et al.* 2008] and/or anthropogenic climate change causing historically unprecedented rates of transformation

[Huntley *et al.* 2006], or, more likely, the interplay between both these gross factors. On the ground the underlying cause of recent and ongoing declines of species is the growth of human populations and associated impacts ranging from habitat loss up to physiological stress responses to variable levels of human activities [Expósito-Granados *et al.* 2020], nest predation and killing or taking of birds [Havrys' 2009; Brochet *et al.* 2016; Belyalova 2020; etc.]. With an overall decline of more than 30%, the roller was classified as 'vulnerable' in Europe [Burfield & van Bommel 2004], although a later assessment reclassified the species as of 'least concern' [Birdlife International 2015]. In the Red Data Book of Ukraine [Havrys' 2009], the species is listed under the category 'Declining.'

According to the 'International Species Action Plan for the European Roller' [Kovacs *et al.* 2008], threats identified as 'critical' to the European roller are: intensification of forest and grassland management, increased habitat homogeneity, conversion of permanent grasslands, land abandonment, and increased insecticide use. Amongst other potential threats climate change has been named. Yet there are large gaps in the study of these threats [Finch 2016]. In summary, they have led to both food and nest-site limitation, suggested as being responsible for the decline of the European roller [Kovacs *et al.* 2008]. Consequently, a key part of many conservation interventions is the provisioning of artificial nest-boxes [Rodriguez *et al.* 2011], a management measure largely missing in Ukraine. The installation of nest-boxes for rollers proved to be an efficient method to replace the lack or the loss of natural nesting sites [Avilés *et al.* 2000], while other studies reported lesser success of nest-box programs [Sosnowski & Chmielewski 1996], indicating most likely the lack of food sources, namely large-bodied insects. A recent study showed that, approximately 10 years before extinction of the local population in southern Poland, European rollers preyed on large beetles and orthopterans, which is typical, but recent agriculture abandonment and natural succession may have reduced the abundance of these prey species and their availability for the birds, thus contributing to their extirpation in the area [Hebda *et al.* 2019]. Over the last few decades, orthopterans, for example, have experienced a considerable decline in Europe, with practices such as insecticide application, intensive cutting and grazing, and the spread of rationalised grass monoculture having detrimental effects [Wilson *et al.* 1999]. In another study employing a species distribution model to explore the effects of potential climate change scenarios on the distribution of the wart-biter bush cricket (*Decticus verrucivorus*), an important food item in the diet of the roller [Hebda *et al.* 2019], a prediction was made that under severe climate change, the cricket will be left with very little suitable habitat in Europe [Carne 2017]. This highlights the threat of climate change to the species and suggests the same may apply to other species in the roller's diet.

In general, recent findings using species distribution models hypothesise that future climate changes will likely amplify the impacts of existing threats on the majority of large roller populations in Europe [Kiss *et al.* 2020]. In our study, we too used a species distribution modelling approach [Austin 2002; Guisan & Thuiller 2005] to hindcast changes in the climatically suitable range of the roller during historical times across Ukraine and to derive spatially explicit predictions of climatic suitability for the species under current climate.

Species distribution models, or SDMs, closely related to ecological niche models, bioclimate-envelope modelling etc. generally correlate species' occurrence patterns with environmental variables. Especially SDMs have shown to be efficient in biodiversity research considering climate changes [Barbet-Massin *et al.* 2011; Visconti *et al.* 2016). As input, SDMs require georeferenced biodiversity observations. Often these occurrence points vary in geography and show significant gaps in the literature, even within one country. Therefore, a prerequisite for our study was to collate published and unpublished data to build a comprehensive dataset of occurrences of breeding pairs of the roller in Ukraine.

The specific goals of this study were to reconstruct the historical climatically suitable range of the species in Ukraine before the 1980s, gain better knowledge on its climatic requirements, compare the past and current climatically suitable areas, infer the regional and environmental variables that best explain its occurrence, and quantify the overall range change ('loss' or 'gain') in the country.

Materials and Methods

Dataset

The building of our dataset was based, besides our personal field work, on a bibliographic search performed using the SciVerse Scopus (<https://www.scopus.com>), ISI Web of Science (<https://webofknowledge.com>), Google Scholar (<https://scholar.google.com>) databases, corresponding databases of the Global Biodiversity Information Facility [GBIF.org 2022] and the European Breeding Bird Atlas (first and second versions) (<https://ebba2.info/maps/species/Coracias-garrulus/ebba1/breeding/>), checking curated repositories of specimens in Ukrainian museums and institutions, employing mailed questionnaire surveys, and holding consultations with fellow ornithologists. To take account and map the retrospective distribution of breeding rollers, we analysed collections of five leading museums in the country. In this case, only those specimens of the collections were considered that were captured during the breeding period. The collection of the Zoological Museum of the National Museum of Natural History (NASU) [Peklo 1997] contains 38 specimens of the roller, coming from 11 regions of Ukraine; the collection of the Zoological Museum of the Taras Shevchenko National University of Kyiv—14 specimens from 7 regions; the collection of the State Museum of Natural History (NASU) in Lviv [Bokotey & Sokolov 2000]—11 individuals from 2 regions of the west of Ukraine; the collection of the Zoological Museum of Uzhhorod National University [Potish & Potish 2006]—1 specimen caught in the Transcarpathian region; the collection of the Museum of Nature of V. N. Karazin Kharkiv National University—25 individuals from 8 regions of the country (information kindly presented by T. M. Devyatko). All specimens of the collections were captured in between 1851 and 1986. In addition to the collections, card files of the Department of Zoology of Taras Shevchenko National University of Kyiv, generously provided by Prof. V. V. Serebryakov, were processed: information from 51 nesting sites from 18 regions of Ukraine for the period of 1850–1986 were used. Questionnaire data of the Ukrainian Society for the Protection of Birds, collected in the frame of the awareness campaign ‘European Roller—Bird of the Year (1995),’ was kindly provided by the secretary of the society T. Mikhalevich: out of 49 completed questionnaires our analysis used data from 43 coming from 16 regions of the country. In terms of bibliography, 379 literature sources on the distribution of the roller in Ukraine were analysed. In this respect, the recently published three volumes of ‘Materials for the 4th Edition of the Red Data Book of Ukraine’ [2018a,b; 2019] and the first volume of ‘Records of Protected Animal, Plant and Fungi Species in Ukraine’ [2020] are an indispensable source of updated information concerning the years 2010–2020. As part of a PhD thesis ‘Ecology of Birds of the Orders *Coraciiformes* and *Upupiformes* in the Ukrainian Steppe,’¹ occurrences of breeding pairs, using conventional methods [Novikov 1953], were collected in the field in 1991–1997. In total, non-duplicate 584 point data records were taken account of, in our opinion sufficient for SDM purposes, even if our database is not exhaustive, which initially has not been the goal of this study.

Geographical coordinates were determined using the location details provided in the label, or in the literature source, and employing the GeoCalculator in the DIVA-GIS program [Hijmans *et al.* 2001].

Environmental Data

A severe challenge for modelling the temporal changes concerning suitable ranges of the European roller in Ukraine based on a lengthy record of occurrences extending back to 1851 is the inconsistency or absence of sets of available environmental variables in a GIS format that reflect historical parameters for certain time periods [Cohen *et al.* 2019]. Sometimes the available data is limited in space or of unacceptably coarse resolution. These shortcomings significantly hamper modelling efforts and the search for factors responsible for the decline of roller populations.

¹ Shupova, T. V. 2010. Ecology of the Birds of the orders *Coraciiformes* and *Upupiformes* in the Ukrainian Steppe. Summary of the PhD thesis. Kyiv, 1–18 [In Ukrainian]

Identifying the key environmental variables that determine the niche is one of the most crucial in SDM operations. Organisms usually respond to a complex of interdependent factors that consist of many environmental variables [Rydgren *et al.* 2003]. Long ago Joseph Grinnell [1917] listed the factors that potentially affect the species distribution, such as vegetation, food, climate, soil, breeding and refuge sites, interspecific effects, and species preferences. However, it is often difficult or impossible to find more or less complete sets of those variables, particularly of biotic character. Fortunately, remote sensing and geographical information system (GIS) technologies provide a wide spectrum of spatial information that assist in the evaluation of macro-distribution of species (e.g. climate, land-cover etc.) [Martínez Pastur *et al.* 2016].

Firstly, in this study we used factors such as temperature and precipitation, since they are related to processes and impacts that are central to the persistence of the bird species. Importantly, also they can be assumed to be central to the well-being of the bird's prey.

TerraClimate is a global gridded dataset of meteorological and water balance variables for 1958–present, available on a monthly timestep [Abatzoglou *et al.* 2018]. Its relatively fine spatial resolution, global extent, and long length are a unique combination that fills a void in climate data. These data can be used in species distribution modelling, to approximate local variability and changes where station-based data are lacking or derived variables are preferred, and for climate-impact analyses in ecological systems cases where spatial attributes of climate may be preferred over coarser resolution data².

Using SAGA GIS [Conrad *et al.* 2015], spatial resolution of the original rasters was resampled to ~1 km, as this satisfyingly approximates the home range sizes of nesting rollers [Finch 2016; Finch *et al.* 2019].

We utilised a set of factors that were hypothesised to be of importance to roller presence and securing a sufficient food base.

- 1) Abiotic factors, such as temperature (tmin, tmax) and precipitation (ppt), were employed because they are consistently found to be primary determinants of species distributions at broad scales [Wiens 2011].
- 2) Potential evapotranspiration (pet) can be especially informative for understanding broad-scale ecological patterns [Fisher *et al.* 2011], created by the synergy of temperature, humidity, solar radiation, wind, and biomass [Baltensperger & Joly 2019].
- 3) Actual evapotranspiration (aet) was used in order to assess the dependency on plant resource availability, which was previously described as enabling successful predictions of bird species richness, by replacing the Normalised Difference Vegetation Index (NDVI) with aet measures as the two are significantly correlated [Cohen *et al.* 2019]. Moreover, recent findings support the applicability of NDVI data as a suitable habitat-specific proxy for the food availability of insectivores during spring [Fernández-Tizón *et al.* 2020]. For instance, foliage cover is important for egg laying in the orthopteran *Calliptamus italicus*, one of the most frequent diet items of the roller in Ukraine (unpublished data), as eggs are laid in open areas with bare ground between vegetation patches [Uvarov 1977]. Conversely, medium- to high-growing herbaceous layer provides a good windbreak and reduces the risk of the eggs dehydrating in the soil [Poniatowski & Fartmann 2008].
- 4) Downward shortwave radiation (srad) is a primary energy source in ecosystems [Yang *et al.* 2010], significantly affecting land surface processes (e.g. ecological, hydrological, and biogeochemical) [Liang *et al.* 2010], which interacting with soil moisture (soil) and climatic water deficit (def) shape vegetation patterns [Bonan 1989]. In addition, soil properties such as soil moisture have been shown to influence oviposition, and therefore further offspring viability in grasshoppers [Herrmann *et al.* 2010]. Also solar radiation can affect the performance of insect herbivores [Battisti *et al.* 2013] and

² The raw TerraClimate netcdf files are available for download by clicking on the file link https://climate.northwestknowledge.net/TERRACLIMATE/index_directDownloads.php

their reproductivity [Bale *et al.* 2002]. In grasshoppers, for instance, solar radiation is an important factor for body temperature regulation [Pepper & Hastings 1952].

- 5) Finally, from the TerraClimate dataset we extracted wind speed (ws). Wind is a key climatic variable for flying birds [Cornioley *et al.* 2016]. It potentially affects a wide range of activities from foraging to migration [Shepard *et al.* 2013]. In particular, wind influences foraging efficiency of birds by modulating energy expenditure and movement speed [Hedenstrom & Alerstam 1995]. Together with solar radiation, wind speed defines specific microclimates and their effects on water and energy budgets of birds and are of major importance to our understanding of avian thermal biology [Wolf & Walsberg 1996]. Wind speed can also regulate local ambient temperatures, enhance the loss of soil moisture, and facilitate long-distance dispersal of insects that represent potential prey of the roller [Yadav *et al.* 2018].

Besides meteorological and water balance conditions, changes in land cover and land use, including density of human population, significantly affect ecosystem processes including the carbon cycle, water cycle, species diversity, and socioeconomic development. Here too, inconsistent time series representation is a problem. Fortunately, in some way, the Global Land Analysis and Discovery (GLAD) Laboratory in the Department of Geographical Sciences at the University of Maryland (<https://glad.umd.edu/>) has filled this gap. Firstly, by producing a dataset representing a globally consistent cropland extent time-series [Potapov *et al.* 2021]. Cropland expansion is known to have severe adverse effects on natural biodiversity [Pimm & Raven 2000] through loss and fragmentation of habitats [Foley *et al.* 2005]. The crop mapping was performed in five-year intervals (2000–2003, 2004–2007, 2008–2011, 2012–2015, and 2016–2019); however, for our purpose the net cropland extent change from 2003 to 2019 was considered; pixel values (0–100) represent the percent of cropland dynamic (net loss or net gain) per pixel. Secondly, an annual vegetation continuous field product was developed consisting of tree canopy (TC) cover, short vegetation (SV) cover, and bare ground (BG) cover, characterising land change over the past 35 years (1982–2016) [Song *et al.* 2018]. Three global map layers represent net changes in TC, SV, and BG, respectively. Pixel values (–100 to 100) represent net percent change over the 35-year period. Negative values represent loss; positive values represent gain; zero represents no change.

Further, raster layers were employed for characterising human population density known to impact biodiversity [Luck 2007]. In a static case we used the ‘Gridded Population of the World’ Version 4 (GPWv4) [Center ... 2018] for the year 2000, whereas for the study of human population density dynamics a high resolution global gridded data set representing a time series from 1981 to 2014 was employed [Lloyd *et al.* 2017]. In this respect, another issue, maybe more important than human population density itself, could be how this density is distributed between urban and rural environs over time. One can suggest that under enhanced urbanisation most rural areas would have fewer people over more land area and would have a lower population density. Among measures used to quantify the degree of urbanisation, the proportion of built-up area (‘building footprint’) is considered an appropriate proxy [McDonnell & Hahs 2008]. For our purpose, we employed the Global Human Settlement Layer (GHSL) [Florczyk *et al.* 2019] for the years 1975 and 2014/15.

In the end, we considered the velocity of climate change, a surprisingly elegant analytical concept that can be used to evaluate the exposure of organisms to climate change [Loarie *et al.* 2009; Garcia *et al.* 2014; Hamann *et al.* 2015]. The measure is derived by dividing the rate of projected climate change in units of °C per year by the rate of spatial climate variability. The resulting variable is a speed or velocity measured in units of km/year, and represents an initial rate at which species must migrate over the surface of the earth to maintain constant climate conditions. In this study we performed the climate-analogue velocity algorithm developed by Hamann *et al.* [2015] that calculates both distance and speed of the climatic parameter from present to the future climate match, using the aggregated data from the TerraClimate database for the time periods 1961–1990 and 1981–2010.

Modelling

There exists a large suite of algorithms for modelling the distribution of species [Li & Wang 2013; Hallgren *et al.* 2016]. To explore the distribution of the European roller in our study area we employed Bayesian Additive Regression Trees (BART), a machine learning technique consisting of a Bayesian approach to Classification and Regression Trees (CART), capable of producing highly accurate predictions without overfitting to noise or to particular cases in the data. Models of this method estimate the probability of a given output variable (a binary classification of habitat suitability or species presence) based on decision ‘trees’ that split predictor variables with nested, binary rule-sets [Carlson 2020]. Running SDMs with BARTs has recently been greatly facilitated by the development of an R package, ‘embarcadero.’ The algorithm computes habitat suitability values ranging from 0, for fully non-suitable habitat, to 1, for fully suitable habitat. It includes an automated variable selection procedure being highly effective at identifying informative subsets of predictors. Also the package includes methods for generating and plotting partial dependence curves, illustrating the effect of selected variables on habitat suitability. These response curves consist of the specific environmental variable as the x-axis and, on the y-axis, the predicted probability of suitable conditions as defined by the output. Upward trends for variables indicate a positive relationship; downward movements represent a negative relationship [Baldwin 2009].

In terms of discrimination accuracy model performance was evaluated using two commonly used validation indices: the area under a receiver operating characteristic (ROC) curve, abbreviated as AUC, and the True Skill Statistic (TSS). The AUC validation statistic is a commonly used threshold independent accuracy index that ranges from 0.5 (not different from a randomly selected predictive distribution) to 1 (with perfect predictive ability). Models having AUC values > 0.9 are considered to have very good, > 0.8 good and > 0.7 useful discrimination abilities. The TSS statistic ranges from -1 to $+1$ and tests the agreement between the expected and observed distribution, and whether that outcome would be predicted under chance alone. A TSS value of $+1$ is considered perfect agreement between the observed and expected distributions, whereas a value < 0 defines a model that has a predictive performance no better than random [Allouche *et al.* 2006]. TSS has been shown to produce the most accurate predictions [Jiménez-Valverde *et al.* 2011]. Values of TSS < 0.2 can be considered as poor, 0.2 – 0.6 as fair to moderate and > 0.6 as good.

Because of variable sampling intensity, occurrence points required by SDMs often vary in spatial density. As a result, and to avoid overemphasising heavily on sampled areas, the BART algorithm selects points for model calibration using subsampling to reduce sampling bias and spatial autocorrelation, which would produce models of lower rather than higher quality [Beck *et al.* 2013].

We used the 10th percentile training presence threshold value to generate binary maps [Liu *et al.* 2005]. This threshold value provides a better ecologically significant result when compared with more restricted threshold values [Phillips & Dudík 2008] or more liberal ones. Based on the probability value, we divided the study area into two classes: unsuitable and/or marginal area below the threshold value; in other words, where the species has predominantly gone extinct (also known as extirpation area), and an area where suitability is above the threshold value (chiefly habitation area).

Maps of habitat suitability in the GeoTIFF format were processed and visualised in SAGA GIS, statistical data was analysed using the PAST software package [Hammer *et al.* 2001] and/or the R environment [R Core Team 2020]. If necessary, raw data was log-transformed or the Box-Cox transformation was applied.

Results

Presence records

The update of published and unpublished data yielded a total of 584 of non-duplicate records geo-referenced occurrences: 203 for the period prior to 1980 (Fig. 1), 91 for records made between 1985 and 2009 (Fig. 2), and 290 records made between 2010 and 2020 (Fig. 3).

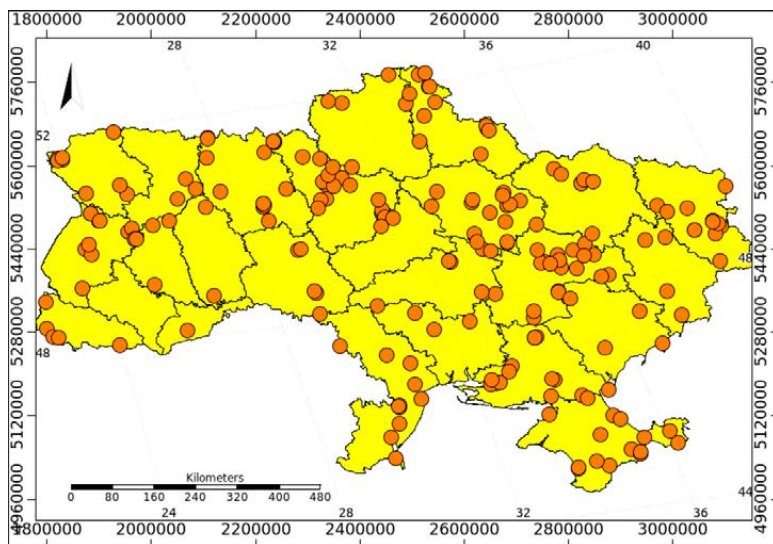


Fig. 1. Point data records of the European roller made in Ukraine before 1980 (red dots).

Рис. 1. Точкові реєстрації сиворакши, зроблених до 1980 р. (червоні кружечки).

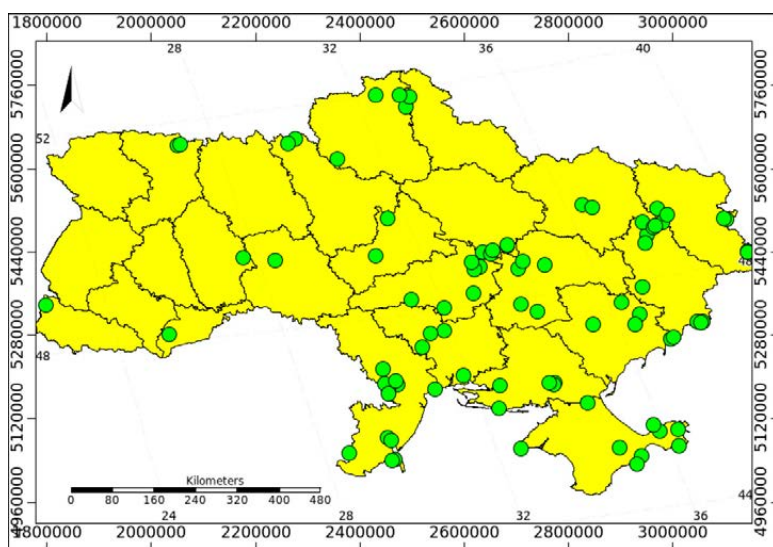


Fig. 2. Point data records of the European roller made in Ukraine between 1985 and 2009 (green dots).

Рис. 2. Точкові реєстрації сиворакши, зроблених між 1985 та 2009 рр. (зелені кружечки).

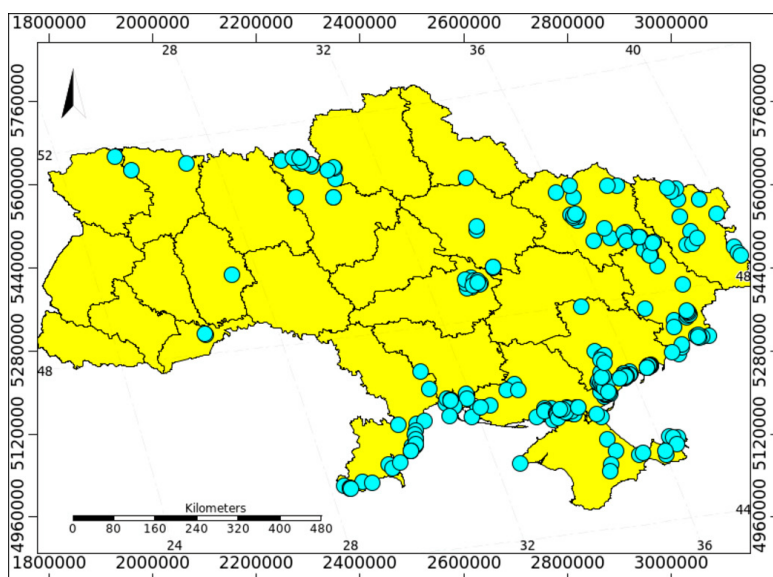


Fig. 3. Point data records of the European roller made in Ukraine between 2010 and 2020 (blue dots).

Рис. 3. Точкові реєстрації сиворакши, зроблених між 2010 та 2020 рр. (блакитні кружечки).

The trend of the 1980s was the shift in the concentration of nesting sites of the roller to the east and south (from the south of Poltava, Kharkiv, and Kirovograd oblasts to Luhansk, Donetsk in the east and the coastal areas of the Black and Azov seas in the south). In Central Ukraine, in the north and west of the country, sporadic registrations of the species are observed, periodically not proven, but supposed to be of nesting of birds [Franchuk & Zhuravchak 2016], or nesting once in a few years [Gashchak 2018]. During this period, the roller has disappeared from some regions of Rivne [Novak & Savchuk 1991; Novak 1994], Kyiv [Peheta 1991], Sumy [Knysh & Matvienko 1995; Knysh 2007], Zakarpattia [Lugovoi & Potish 2004], and Poltava [Klestov *et al.* 2016] oblasts. For many regions, the roller is characterised as a migrant and vagrant species [Kozlovsky *et al.* 1994; Pohranychnyi *et al.* 1994; Guziy 1996; Redinov 2006; Klestov *et al.* 2014].

By 2020, a clear picture of the localisation of nesting birds in the eastern and southern regions of Ukraine appears, with the highest density in areas adjacent to the Black and Azov seas, eastern Crimea, and Kharkiv, Donetsk, and Luhansk oblasts. A small nesting locality of the roller remains on the border of Kirovograd and Poltava oblasts (Fig. 3). Thus, the main part of the Ukrainian population of the roller is concentrated in the steppe natural-geographical zone. Whether single records of roller in Volyn, Chernivtsi, and Khmelnytsky oblasts are a residual occurrence of the species in these regions or centres of restoration of local populations can be checked in 10–20 years.

By 2020, a clear sub-population of the roller has been formed in the Chernobyl Exclusion Zone. In the 1980s and 1990s, the roller practically disappeared from Kyiv Oblast [Peheta 1991; Gashchak 2018]. This is confirmed by the data in Fig. 2. It is possible that the population that until 1980 nested around Kyiv moved to a region that is safer in terms of anthropogenic pressure. Gashchak [2018] suggests that the lack of logging, the low level of the disturbance factor, and rich foraging lands should contribute to an increase in the nesting group of rollers within the exclusion zone.

BART model performance

SDMs were created for the three time intervals (before 1980, between 1985–2009, and 2010–2020) using the corresponding climate data extracted from the TerraClim database for both the breeding season (May–August) and year-round conditions.

All BART models did a good job of differentiating known localities from background points ($0.83 \leq \text{AUC} \leq 0.94$; $0.52 \leq \text{TSS} \leq 0.76$). Similarity between habitat suitability models accounting for breeding season and year-round conditions was high (the coefficient of determination, R^2 , varying from 78.8% to 88.8%; $p < 0.05$); however, based on expert knowledge we considered the breeding season models to give a closer representation of both the past and current niche of the European roller in Ukraine, and, moreover, in neighbouring areas (see below). Correspondingly, three habitat suitability maps were produced: for the period prior to 1980 ($\text{AUC} = 0.83$, $\text{TSS} = 0.52$) (Fig. 4), for the period 1985–2009 ($\text{AUC} = 0.89$, $\text{TSS} = 0.68$), and the years 2010–2020 ($\text{AUC} = 0.94$, $\text{TSS} = 0.76$). Since there was a close similarity between the 1985–2009 and 2010–2020 models ($R^2 = 75.9\%$; $p < 0.05$), we decided to pool the data and build a joint habitat suitability model for this whole time period ($\text{AUC} = 0.92$, $\text{TSS} = 0.70$) (Fig. 5).

The obtained SDMs were reclassified as unsuitable areas (0–40%), low potential habitat suitability (40–50%), medium potential habitat suitability (50–70%), and high potential habitat suitability (70–100%). We defined these thresholds based on Martínez Pastur *et al.* [2016] proposals. In total, potentially suitable for the roller areas in Ukraine before the decline of the species comprised around 86%, whereas after the decline it was reduced to 44%. Areas with a potential exceeding 50% suffered noticeable losses, 73 and 35%, respectively. However, there was a gain in areas with a high potential (>70%) for accommodating the roller—from 4.6% up to 13.4%, primarily in the east and south of the country, including Crimea (but with the exception of the majority of the southern coast and adjoining mountains). Despite this gain, the overall average habitat suitability in the country has fallen from 0.55 to 0.39 ($p < 0.05$).

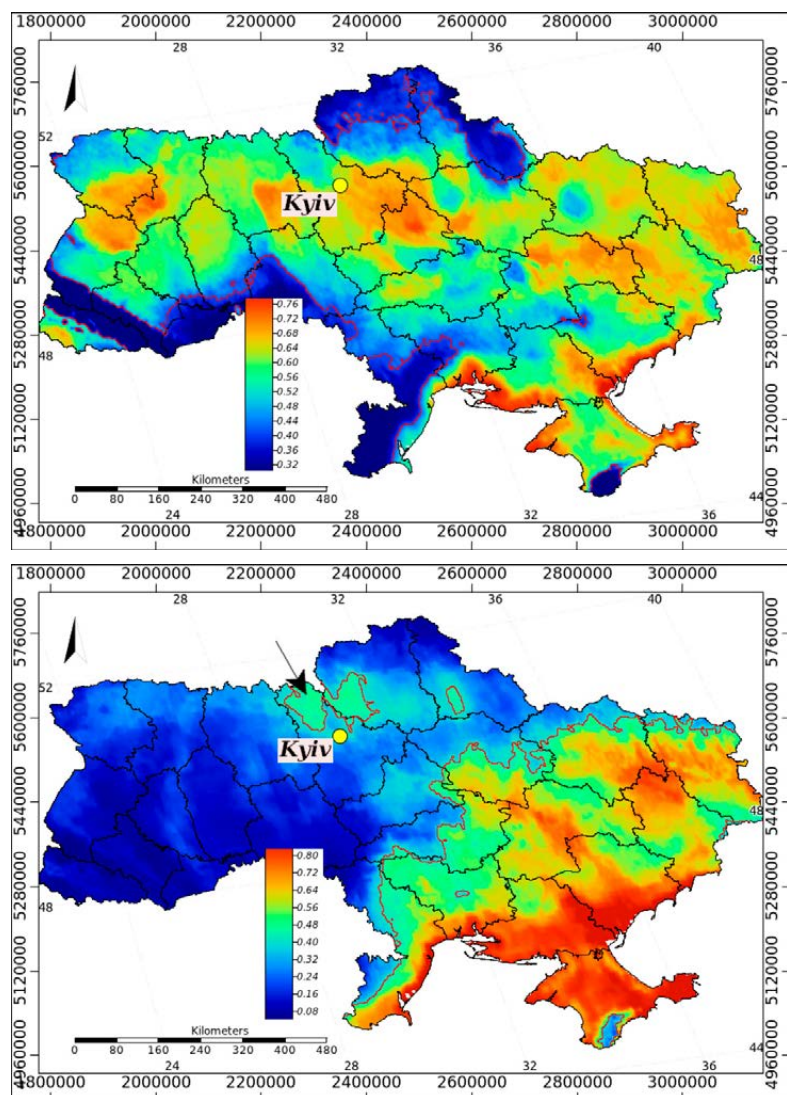


Fig. 4. Habitat suitability map for the European roller in Ukraine built for the period prior to 1980; the legend shows habitat suitability ranging from high (red) to low (blue); the red line depicts the 10th percentile threshold boundary.

Рис. 4. Карта придатності територій для перебування сиворакши; складена за період до 1980 р.; легенда показує придатність середовища існування в діапазоні від високого рівня (червоний) до низького (синій); червона лінія показує порогове значення 10-го процентиля.

Fig. 5. Habitat suitability map for the European roller in Ukraine built for the period 1985–2020; the arrow points to enclaves north of Kyiv (including portions of the Chornobyl Exclusion Zone); legend as in Fig. 4.

Рис. 5. Карта придатності територій для перебування сиворакши; складена за період 1985–2020 рр.; стрілка вказує на анклав на північ від Києва (включаючи частини Чорнобильської зони відчуження); легенда як на рис. 4.

The four most significant variables affecting the distribution of the roller in its Ukrainian range before the decline were in order of decreasing magnitude, average downward shortwave radiation (srad), average actual evapotranspiration (aet), average soil moisture (soilm), and average maximum temperature (tmax); partial dependence plots (i.e. response curves) for each of these are depicted in Figs 6. Other variables, like wind speed (ws), were dropped from the model by the BART algorithm as insignificant. Not very surprisingly, the same set of variables are responsible for forming the bioclimatic niche of the roller in its contemporary area of habitation in Ukraine and their corresponding partial dependence plots appear to be of similar shape. From these response curves conclusions can be made that breeding rollers in Ukraine prefer a habitat of a fairly narrow spectrum of heat influx, areas of short and/or sparse vegetation, dry soil, average breeding season maximum temperature reaching around 22°C, after which habitat suitability shows a steep drop (Fig. 6d).

Changes in land cover and land use

Using the 10th percentile threshold, we made a distinction between the extirpation area (predominantly in the north-west of the country) and the area of contemporary habitation (mainly in the south-east), and compared land cover and land use dynamics, both within their boundaries and/or between them, focusing on the surroundings of roller breeding sites as they were prior to 1980, after when the decline of the roller in the study area began.

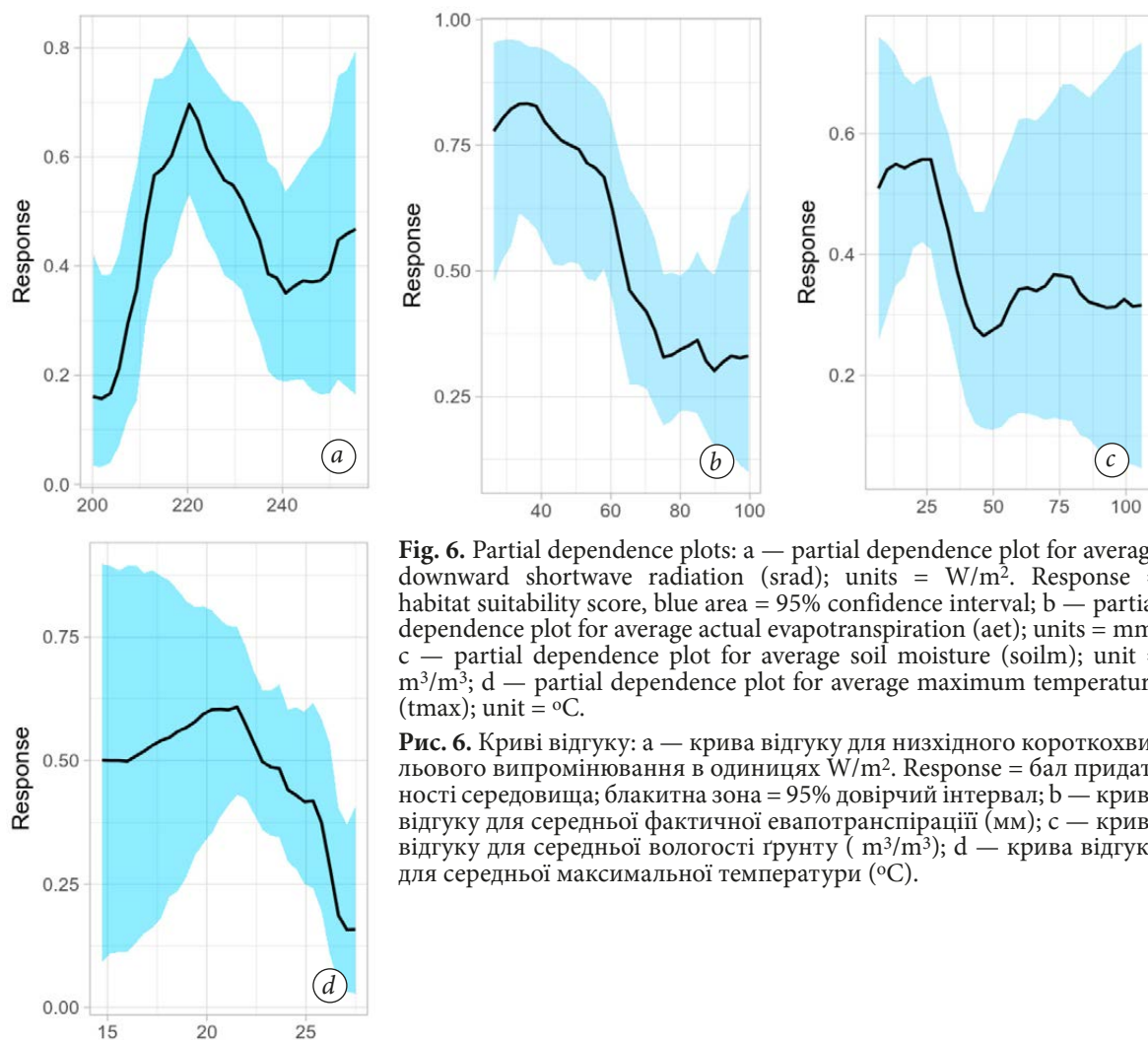


Fig. 6. Partial dependence plots: a — partial dependence plot for average downward shortwave radiation (srad); units = W/m^2 . Response = habitat suitability score, blue area = 95% confidence interval; b — partial dependence plot for average actual evapotranspiration (aet); units = mm; c — partial dependence plot for average soil moisture (soilm); unit = m^3/m^3 ; d — partial dependence plot for average maximum temperature (tmax); unit = $^{\circ}C$.

Рис. 6. Криві відгуку: а — крива відгуку для низхідного короткохвильового випромінювання в одиницях W/m^2 . Response = бал придатності середовища; блакитна зона = 95% довірчий інтервал; б — крива відгуку для середньої фактичної евапотранспірації (мм); с — крива відгуку для середньої вологості ґрунту (m^3/m^3); d — крива відгуку для середньої максимальної температури ($^{\circ}C$).

Cropland dynamics

Both within the extirpation area and area of contemporary habitation and between them cropland dynamics seem to have remained more or less constant and at a fairly low level (in the range from 4.1 to 5.6%), with loss and gain apparently compensating one another.

Vegetation field dynamics

Dynamics of the annual vegetation continuous field products mentioned above are presented in Table 1.

Table 1. Dynamics (1985–2016) of annual vegetation continuous field products in areas of extirpation of the roller (since 1980) and its contemporary habitation

Таблиця 1. Динаміка (1985–2016 рр.) щорічної безперервної вегетаційної продукції в районах, де сиворакша зникла (з 1980 р.), та її сучасних місць проживання

| Vegetation field | Extirpation area | Habitation area | Student's t ($p < 0.05$) |
|------------------|------------------|-----------------|----------------------------|
| Bare ground | -0.77 | -1.58 | 2.4 |
| Short vegetation | -10.53 | -0.51 | 7.4 |
| Tree canopy | +11.97 | +2.65 | 6.7 |

Looking at the 'bare ground' category, one can see losses have occurred in both considered areas. More striking changes have affected the other two categories, showing a noticeable reduction of 'short vegetation' and significant gain of 'tree canopy' cover in the area today mainly abandoned by breeding rollers.

Human density and urbanization

According to the census of the year 2000, human population density in the surroundings of nesting rollers was higher in the contemporary habitation area of the species, 113.9 against 100.5 ind. per sq. km in the extirpation area (Student's $t = 2.1$; $p < 0.05$). In terms of the dynamics of human population densities recorded from 1981 to 2014, no growth has taken place within the breeding sites of the roller from which the bird today is absent (Student's $t = 1.0$; $p > 0.05$), whereas in the contemporary habitation area of the species human population densities have increased (regression slope 7.14 ± 1.12 , Student's $t = 2.8$; $p < 0.05$). Between 1975 and 2014/15, urbanization, as assessed by the 'building footprint', has enhanced in the extirpation area by 53%, whereas in the contemporary habitation area of the species only by 38% ($p < 0.05$).

Velocity of climate change

Various climate surfaces can be used to generate estimates of the velocity of climate change, and include various biologically relevant temperature and precipitation variables, as well as extremes, growing and chilling degree days, various dryness and indices and growing season descriptors such as frost-free days [Hamann *et al.* 2015]. We used the average maximum temperature for the breeding season, a seemingly crucial factor in the biology of the roller (see above). Once again, focusing on breeding sites as they were prior to 1980, we found a faster change of this factor in the extirpation area than in the area inhabited by the species today, 0.142 against 0.105, respectively (Student's $t = 3.6$; $p < 0.05$).

Discussion

There is strong evidence showing that birds, as other animals [Parmesan & Yohe 2003], are shifting their ranges in response to climate change. Both range expansions and contractions are occurring worldwide, although some bird species may remain unaffected by climate change; however, range contractions are expected to be more frequent than range expansions [Wormworth & Mallon 2006]. Here the European roller is just one example of such range contraction presumably due to climate change. Between 1970 and 1990, the roller was declining in a majority of European countries [Tucker *et al.* 1994] and this pattern continued throughout the next decade. However, in 2000–2010 the roller's decline looked to have decelerated [Finch 2016]. Our modelling exercises seemingly support this view: a comparison of the model created using occurrences recorded prior to 1980 with the model for the 1985–2009 time period shows low similarity ($R^2 = 22.4\%$), whereas similarity between the latter and model for the years 2010–2020 appears to be notably higher ($R^2 = 72.7\%$), meaning fewer changes have taken place within this time period regarding the distribution and parameters of bioclimatic habitat suitability of the species in Ukraine. Saying 'fewer' does not, of course, mean that there were zero changes. Fortunately or not, they are continuing and climatic predictions show that things can become worse.

In the meantime, the European roller in Ukraine has retreated to the south-west of the country and today its northern range boundary (as defined by the 10th percentile threshold) closely follows ($R^2 = 99.94\%$ for longitude and 98.36% for latitude, respectively) the boundary of the Steppic biogeographical region [Cervellini *et al.* 2020], therefore characterising the species in Ukraine as 'steppic' is largely justified.

As common practice, we assessed the predictive performance of our SDMs by randomly splitting the dataset into training and testing, and fitting the model on the training dataset and validating it on the testing dataset using the area under the curve (AUC) and the true skill statistic (TSS). In our case these two metrics revealed good results. However, discrimination accuracy metrics may suggest a very good model while of poor transferability [Torres *et al.* 2015] and/or lead to relationships without a biological meaning [Santini *et al.* 2021]. Using only Ukraine-based records, we tested our models by extrapolating predictions of occurrence and habitat suitability to neighbouring areas, for instance

to Krasnodar Krai of the Russian Federation (Fig. 7). These extrapolations showed close to excellent predictive power by pointing out sites most favourable for the roller, namely the Taman and Yeysk peninsulas, where within the region the bird is found in its greatest abundance [Red Data Book... 2017]. Response curves (Figs. 6) too, in our opinion support the credibility of our SDMs by producing results that have a biological interpretation consistent with the physiology and/or ecology of the bird species or either environmental requirements of its potential prey.

As mentioned above, one of the most crucial in SDM operations is identifying the key environmental variables that determine the niche of the species in question. Usually, SDMs are calibrated only with abiotic variables as predictors, assuming that biotic interactions are indirectly represented by abiotic variables because they strongly correlate [Soberón & Nakamura 2009]. The addition of biotic interactions usually improves the predictive performance of SDMs [Araújo & Luoto 2007], although the inclusion of such interactions as, for example, the dependence of the roller on certain food items meets difficulties due to the insufficiency of appropriate data. Not able to incorporate abiotic and biotic predictors into one SDM, we considered building two: one for the roller and one for *Calliptamus italicus* (Linnaeus, 1758), the Italian locust, a species of 'short-horned grasshoppers' belonging to the family Acrididae, using the same set of climatic variables extracted from the TerraClimate database for the years 2010–2021 and employing the BART algorithm. Point data for the grasshopper was downloaded from the GBIF repository [GBIF.org 2021]. The choice of the prey species was determined by the fact that the Italian locust is a frequent food item for the roller in Ukraine: out of 172 individuals of *Acrididae* found in the stomach of sampled birds 41 (or 23.8%) belonged to this species, more than it was for other grasshoppers (unpublished data). Assuming a coupling between the spatial distribution of resources and consumers, we hypothesised that the geographical distribution of the roller should in some way match that of the Italian locust and tested the expected spatial congruence across grid cells of the produced SDMs. To control for spatial non-independence we used a modified t-test to calculate the statistical significance of the correlation coefficient (a corrected Pearson's correlation) based on geographically effective degrees of freedom as implemented in the Spatial-Pack package [Osorio & Vallejos 2014]. The relationship was found to be positive (0.487), statistically significant ($p = 0.05$) and can be considered moderate in its magnitude [Rumsey 2016]. Therefore, despite solely using abiotic variables as predictors, SDMs built for the roller niche roughly managed to capture features of the niche important for the locust too without explicitly introducing the insect to the model as a biotic factor. Perhaps, if the association between the bird and prey would be closer, as though the rollers would specialise and predominantly feed on locusts, the correlation coefficient would be higher. In the end, we found it reasonable to consider modelling the distribution only with abiotic variables and relying on the BART algorithm for identifying those to be of most importance.

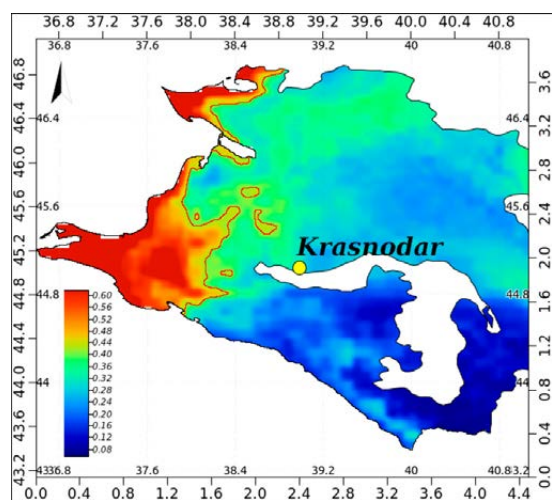


Fig. 7. Left: extrapolation of the 1985–2020 species distribution model for the European roller to Krasnodar Krai [habitat suitability ranging from high (red) to low (blue)]; right: map from the Red Data Book of Krasnodar Krai [2017], p. 577, showing the distribution (squares) of the species in the region.

Рис. 7. Ліворуч: екстраполяція моделі поширення сиворакиши (1985–2020 рр.) на територію Краснодарського краю [придатність середовища існування показано в діапазоні від високого (червоний) до низького (синій)]; справа: карта з Червоної книги Краснодарського краю [2017], с. 577, де показано поширення (квадрати) виду в цьому регіоні.

Because of the gaps in the study of threats faced by the European roller [Finch 2016], we considered several factors that could have contributed to the decline of the species, namely in Ukraine, but maybe also in a broader geographical context.

Reasons for this decline are primarily focused upon the spread and intensification of agricultural systems leading to habitat fragmentation and loss [Saunders 2016]. Cropland (% of land area) in Ukraine was reported at 56.76% in 2018, according to the World Bank collection of development indicators (<https://data.worldbank.org/indicator/>), meaning that much of the roller's habitat in Ukraine is lost. Today minor changes in cropland dynamics within the country hardly have any impact on the welfare of the species.

An analysis of land cover trends more or less coinciding with the decline of the species in Ukraine bare ground losses, more pronouncedly in the south-east of the country. Bare ground dynamics is an important component of global land cover change resulting from economic drivers such as urbanisation and resource extraction [Ying *et al.* 2017]. Bare ground losses could mean more vegetated sites. The closure and/or reduced operations of industrial plants and agricultural processing facilities in the eastern part of Ukraine [Burakovsky & Betlii 2009] seem to have facilitated this trend. Later it was shown that abandoned in the Donbas region quarrying and coal mining sites, with the encroachment of vegetation, notably enhance biodiversity [Ulyura & Tytar 2017, 2018].

Larger changes have been seen regarding the dynamics of 'short vegetation' and 'tree canopy' cover and these because of their magnitude are more likely to affect the roller. The loss of areas with short vegetation and increase in the tree canopy cover in the north-west of the country, now primarily abandoned by the species, certainly will not favour its return. Perhaps an exception is the Chornobyl Exclusion Zone and some adjacent areas, where Landsat images show the change from a previously vibrant agricultural and forestry economy, when crops have been replaced by grasslands (<https://www.usgs.gov/news/earthview-chernobyl-30-years-later>).

As for human population density and dynamics, these unlikely can be responsible for the extirpation of the roller from the north-west as far as the occupied by the species south-east of the country is more heavily populated by humans and densities here between 1981 and 2014 have noticeably increased. Also it appears that urbanisation in the north-west, leading to having fewer people over more land area, was not salutary for the roller.

The majority of threats posed to the roller by habitat and land use change are also likely to be compounded by the effects of global climate change [Saunders 2016] and in our study this is exactly what climate velocity points to. In fact, velocities are a simple function of spatial and temporal variation in climate conditions in a particular landscape, and can be interpreted as one of several risk factors that contribute to the persistence or loss of species and populations in complex landscapes under climate change [Hamann *et al.* 2015]. Ultimately, we suggest climate change, in particular its speed, have been responsible for shaping the contemporary distribution range of the European roller in Ukraine and likely in other countries of the continent.

Acknowledgments

We consider our duty is to express our deep gratitude to T. Devyatko, V. Serebryakov, I. Mikhalevich, L. Potish, A. Bokotey and M. Khymyn for sharing data and their kind assistance.

References

- Abatzoglou, J. T., S. Z. Dobrowski, S. A. Parks, *et al.* 2018. TerraClimate, a high-resolution global dataset of monthly climate and climatic water balance from 1958–2015. *Scientific Data*, 5.
- Allouche, O., A. Tsoar, R. Kadmon. 2006. Assessing the accuracy of species distribution models: prevalence, kappa and the true skill statistic (TSS). *Journal of Applied Ecology*, 43: 1223–1232.
- Araújo, M. B., M. Luoto. 2007. The importance of biotic interactions for modelling species distributions under climate change. *Global Ecology and Biogeography*, 16 (6): 743–753.
- Austin, M. 2002. Spatial prediction of species distribution: an interface between ecological theory and statistical modelling. *Ecological Modelling*, 157: 101–118.

- Avilés, J. M., J. M. Sanchez, D. Parejo. 2000. Nest-site selection and breeding success in the Roller (*Coracias garrulus*) in the Southwest of the Iberian Peninsula. *Journal für Ornithologie*, **141**, 345–350.
- Aviles, J. M., D. Parejo. 2002. Diet and prey type selection by Rollers *Coracias garrulus* during the breeding season in southwest of the Iberian Peninsula. *Alauda*, **70**: 227–230.
- Baldwin, R. A. 2009. Use of maximum entropy modeling in wildlife research. *Entropy*, **11** (4): 854–866.
- Bale, J. S., G. J. Masters, I. D. Hodkinson, et al. 2002. Herbivory in global climate change research: Direct effects of rising temperature on insect herbivores. *Global Change Biology*, **8**: 1–16.
- Baltensperger, A. P., K. Joly. 2019. Using seasonal landscape models to predict space use and migratory patterns of an arctic ungulate. *Movement Ecology*, **7**: 18.
- Barbet-Massin, M., W. Thuiller, F. Jiguet. 2011. The fate of European breeding birds under climate change, land-use and dispersal scenarios. *Global Change Biology*, **18**: 881–890.
- Battisti, A., L. Marini, A. Pitacco, et al. 2013. Solar radiation directly affects larval performance of a forest insect. *Ecological Entomology*, **38**: 553–559.
- Beck, J., L. Ballesteros-Mejia, P. Nagel, et al. 2013. Online solutions and the “Wallacean shortfall”: What does GBIF contribute to our knowledge of species’ ranges? *Diversity and Distributions*, **19**: 1043–1050.
- Belyalova, L. E. 2020. Some data on the nesting ecology of the Roller *Coracias garrulus* on the northwestern slopes of the Turkestan ridge. *The Russian Journal of Ornithology*, **29** (1881): 441–447 [In Russian]
- Birdlife International. 2015. *European Red List of Birds*. Birdlife International, Cambridge, 1–12.
- Bokotey, A. A., N. Yu. Sokolov. 2000. *Catalogue of the ornithological collection of the State Natural Science Museum*. Lviv, 1–164 [In Ukrainian]
- Bonan, G. B. 1989. A computer model of the solar radiation, soil moisture, and soil thermal regimes in boreal forests. *Ecological Modelling*, **45** (4): 275–306.
- Brochet, A.-L., W. Van Den Bossche, S. Jbour, et al. 2016. Preliminary assessment of the scope and scale of illegal killing and taking of birds in the Mediterranean. *Bird Conservation International*, **26** (1): 1–28.
- Burakovsky, I., O. Betliy. 2009. *Impact of the Global Economic Crisis on the Ukrainian Economy: Regional Aspects. Analytical Report*. Institute for Economic Research and Policy Consulting, Kyiv, 1–15.
- Burfield, I. J., F. P. J. van Bommel. 2004. *Birds in Europe: Population Estimates, Trends and Conservation Status*. BirdLife International, Cambridge, UK, 1–374.
- Carlson, C. J. 2020. embarcadero: Species distribution modelling with Bayesian additive regression trees in R. *Methods in Ecology and Evolution*, **11** (7): 850–858.
- Carne, C. 2017. Predicting habitat suitability for the wart-biter bush cricket (*Decticus verrucivorus*) in Europe. *Journal of Insect Conservation*, **21** (2): 287–295.
- Catry, I., A. Sampaio, M. C. Silva, F. Moreira, et al. 2019. “Combining stable isotope analysis and conventional techniques to improve knowledge of the diet of the European Roller *Coracias garrulus*”. *Ibis*, **161** (2): 272–285.
- Center for International Earth Science Information Network (CIESIN), Columbia University. 2018. Documentation for the Gridded Population of the World, Version 4 (GPWv4), Revision 11 Data Sets. Palisades NY: NASA Socioeconomic Data and Applications Center (SEDAC).
- Cervellini, M., P. Zannini, M. Di Musciano, et al. 2020. A grid-based map for the Biogeographical Regions of Europe. *Biodiversity Data Journal*, **8**: e53720.
- Cohen, M., M. McKinney, S. Kark, et al. 2019. Global invasion in progress: modeling the past, current and potential global distribution of the common myna. *Biological Invasions*, **21**: 1295–1309.
- Conrad, O., B. Bechtel, M. Bock, et al. 2015. System for Automated Geoscientific Analyses (SAGA) v. 2.1.4. *Geoscientific Model Development Discussions*, **8**: 2271–2312.
- Cornioley, T., L. Börger, A. Ozgul, et al. 2016. Impact of changing wind conditions on foraging and incubation success in male and female wandering albatrosses. *Journal of Animal Ecology*, **85** (5): 1318–1327.
- Cramp, S. 1985. *The Birds of the Western Palearctic, Vol. 4: Terns to Woodpeckers*. Oxford University Press, Oxford, 1–960.
- Expósito-Granados, M., D. Parejo, O. Chastel, et al. 2020. Physiological stress and behavioural responses of European Rollers and Eurasian Scops Owls to human disturbance differ in farming habitats in the south of Spain. *Bird Conservation International*, **30** (2): 220–235.
- Fernández-Tizón, M., T. Emmenegger, J. Perner, et al. 2020. Arthropod biomass increase in spring correlates with NDVI in grassland habitat. *The Science of Nature*, **107**: 42.
- Finch, T. M. 2016. *Conservation ecology of the European Roller*. A thesis submitted for the degree of Doctor of Philosophy School of Biological Sciences University of East Anglia, UK, 1–183.
- Finch, T., C. Branston, H. Clewlow, et al. 2019. Context-dependent conservation of the cavity-nesting European Roller. *Ibis*, **161** (3): 573–589.
- Fisher, J. B., R. J. Whittaker, Y. Malhi. 2011. ET come home: potential evapotranspiration in geographical ecology. *Global Ecology and Biogeography*, **20** (1): 1–18.
- Florczyk, A. J., C. Corbane, D. Ehrlich, et al. 2019. GHSL Data Package 2019, EUR 29788 EN, Publications Office of the European Union, Luxembourg, 2019, ISBN 978-92-76-13186-1, JRC 117104.
- Foley, J. A., R. Defrie, G. P. Asner, et al. 2005. Global consequences of land use. *Science*, **309** (5734): 570–574.
- Franchuk, M. V., R. O. Zhuravchak. 2016. Revision of avifauna of Somyne Mass, Rivnenskyi Nature Reserve. *Troglodytes*, **7**: 111–123.

- Garcia, R. A., M. Cabeza, C. Rahbek, *et al.* 2014. Multiple dimensions of climate change and their implications for biodiversity. *Science*, **344** (6183): 1247579.
- Gashchak, S. P. 2018. Vertebrate animals of the Chernobyl zone (Chernobyl radiation-ecological biosphere reserve), included in the Red Book of Ukraine (2009). *Problems of the Chernobyl exclusion zone*, **18**: 5–55. [In Russian]
- GBIF.org (14 November 2021) GBIF Occurrence Download <https://doi.org/10.15468/dl.2w6yq7>
- GBIF.org (21 May 2022) GBIF Occurrence Download <https://doi.org/10.15468/dl.w5nexy>
- Grinnell, J. 1917. The niche-relationships of the California Thrasher. *Auk*, **34** (4): 427–433.
- Guisan, A., W. Thuiller. 2005. Predicting species distribution: offering more than simple habitat models. *Ecology Letters*, **8**: 993–1009.
- Guziy, A. I. 1996. Ornithofauna of the Ukrainian Roztocze. *Zapovidna sprava v Ukraini*, **2**, 30–36. [In Ukrainian]
- Hallgren, W., L. Beaumont, A. Bowness, *et al.* 2016. The Biodiversity and Climate Change Virtual Laboratory: Where ecology meets big data. *Environmental Modelling & Software*, **76**: 182–186.
- Hamann, A., D. R. Roberts, Q. E. Barber, *et al.* 2015. Velocity of climate change algorithms for guiding conservation and management. *Global Change Biology*, **21** (2): 997–1004.
- Hammer, Ø., D. A. T. Harper, P. D. Ryan. 2001. PAST: Paleontological statistics soft ware package for education and data analysis. *Palaeontologia Electronica*, **4** (1): 1–9.
- Havrys, H. H. 2009. Roller. Red Book of Ukraine. Fauna. «Globalkonsalting», Kyiv, 471. [In Ukrainian]
- Hebda, G., K. Kata, M. Żmihorski. 2019. The last meal: large insects predominate the diet of the European Roller *Coracias garrulus* prior to population extinction. *Bird Study*, **66** (2): 173–177.
- Hedenström, A., T. Ålerstam. 1995. Optimal flight speed of birds. *Phil. Trans. R. Soc. Lond. B* **348**: 471–487.
- Herrmann, D. L., A. E. Ko, S. Bhatt, *et al.* 2010. Geographic variation in size and oviposition depths of *Romalea microptera* (Orthoptera: Acrididae) is associated with different soil conditions. *Annals of the Entomological Society of America*, **103** (2): 227–235.
- Hijmans, R. J., L. Guarino, M. Cruz, *et al.* 2001. Computer tools for spatial analysis of plant genetic resources data: 1. DIVA-GIS. *Plant Genetic Resources Newsletter*, **127**: 15–19.
- Huntley, B., Y. C. Collingham, R. E. Green, *et al.* 2006. Potential impacts of climate change upon geographical distributions of birds. *Ibis*, **148** (1): 8–28.
- Jiménez-Valverde, A., A. Peterson, J. Soberón, *et al.* 2011. Use of niche models in invasive species risk assessments. *Biological Invasions*, **13**: 2785–2797.
- Kiss, O., I. Catry, J. M. Avilés, *et al.* 2020. Past and future climate-driven shifts in the distribution of a warm-adapted bird species, the European Roller *Coracias garrulus*. *Bird Study*, **67** (2): 143–159.
- Kiss, O., Z. Elek, C. Moskat. 2014. High breeding performance of European Rollers *Coracias garrulus* in heterogeneous farmland habitat in southern Hungary. *Bird Study*, **61** (4): 496–505.
- Klestov, M. L., N. P. Halchenko, O. D. Nekrasova, *et al.* 2016. *Flora and fauna of the lower Sula River*. Kyiv, 1–240. [In Ukrainian]
- Klestov, M. L., H. H. Havrys, O. I. Andriievska. 2014. Rare and endangered birds of the lower reaches of the Sula River. *Cherkasy University Bulletin: Biological Sciences Series*, **36** (329): 40–45. [In Ukrainian]
- Knysh, M. P. 2007. Retrospective note on the nesting of the Roller near the city of Sumy. *Berkut*, **16** (2): 280–281. [In Ukrainian]
- Knysh, M. P., M. E. Matvienko. 1995. Catastrophic state of the grayling population in the North-East of Ukraine. *Problems of study and protection of birds*. Lviv-Chernivtsi, 72–73. [In Ukrainian]
- Kovács, A., B. Barov, C. Urhun, *et al.* 2008. *International Species Action Plan for the European Roller Coracias garrulus garrulus*. Besenyotelek, Hungary, 1–52.
- Kozlovskiy, R. S., V. O. Pohranychnyi, I. M. Horban. 1994. Ornithofauna of the landscape reserve «Strytsi Dnistra». *The 1st Conference of Young Ornithologists of Ukraine (Lutsk, March 4–6, 1994)*. Chernivtsi, 76–79. [In Ukrainian]
- Li, X., Y. Wang. 2013. Applying various algorithms for species distribution modelling. *Integrative Zoology*, **8** (2), 124–135.
- Liang, S., K. Wang, X. Zhang, *et al.* 2010. “Review on Estimation of Land Surface Radiation and Energy Budgets From Ground Measurement, Remote Sensing and Model Simulations,” in *IEEE Journal of Selected Topics in Applied Earth Observations and Remote Sensing*, **3** (3): 225–240.
- Liu, C., P. M. Berry, T. P. Dawson, *et al.* 2005. Selecting thresholds of occurrence in the prediction of species distributions. *Ecography*, **28** (3): 385–393.
- Lloyd, C., A. Sorichetta, A. Tatem. 2017. High resolution global gridded data for use in population studies. *Scientific Data*, **4**: 170001.
- Loarie, S. R., P. B. Duffy, H. Hamilton, *et al.* 2009. The velocity of climate change. *Nature*, **462**: 1052–1055.
- Luck, G. W. 2007. A review of the relationships between human population density and biodiversity. *Biological Reviews*, **82** (4): 607–645.
- Lugovoi, A. E., L. A. Potish. 2004. Red Book of Ukraine and birds of Transcarpathia. *Berkut*, **13** (1): 115–118. [In Russian]
- Lüütsepp, G., A. Kalamees, O. Lüütsepp. 2011. European Roller (*Coracias garrulus*) in Estonia 2000–2011. *Hirundo* **24**, 61–72.

- Martínez Pastur, G., P. L. Peri, R. M. Soler, *et al.* 2016. Biodiversity potential of *Nothofagus* forests in Tierra del Fuego (Argentina): tool proposal for regional conservation planning. *Biodiversity and Conservation*, **25**: 1843–1862.
- Materials for the 4th edition of the Red Book of Ukraine. Fauna. 2018a. Conservation Biology in Ukraine, 7 (1). Kyiv, I. I. Schmalhausen Institute of Zoology, National Academy of Sciences of Ukraine, 1–442. [In Ukrainian]
- Materials for the 4th edition of the Red Book of Ukraine. Fauna. 2018b. Conservation Biology in Ukraine, 7 (2). Kyiv, I. I. Schmalhausen Institute of Zoology, National Academy of Sciences of Ukraine, 1–454. [In Ukrainian]
- Materials for the 4th edition of the Red Book of Ukraine. Fauna. 2019. Conservation Biology in Ukraine, 7 (3). Kyiv, I. I. Schmalhausen Institute of Zoology, National Academy of Sciences of Ukraine, 1–416. [In Ukrainian]
- McDonnell, M. J., A. K. Hahs. 2008. The use of gradient analysis studies in advancing our understanding of the ecology of urbanizing landscapes: current status and future directions. *Landscape Ecology*, **23**: 1143–1155.
- Novak, V. O. 1994. Preliminary analysis of avifauna of Letychiv district. *The 1st Conference of Young Ornithologists of Ukraine (Lutsk, March 4–6, 1994)*. Chernivtsi, 5–7. [In Ukrainian]
- Novak, O. V., A. V. Savchuk. 1991. Coraciiformes of the Rivne region. *Materials of the 10th All-Union Ornithological Conference (Vitebsk 1991)*, **2** (2). Minsk, 124–125. [In Russian]
- Novikov, G. A. 1953. *Field research on the ecology of terrestrial vertebrates*. Sov. Nauka, Moscow, 1–502. [In Russian]
- Osorio, F., R. Vallejos. 2014. *SpatialPack: package for analysis of spatial data*. R package version 0.2-3. <http://cran.r-project.org/package=SpatialPack>
- Parmesan, C., G. Yohe. 2003. A globally coherent fingerprint of climate change impacts across natural systems. *Nature*, **421**: 37–42.
- Peheta, V. P. 1991. Long-term changes in the avifauna of the environs of Kiev. *Mater. X All-Union ornithol. conf. Vitebsk 1991: abstracts*. Navuka i tekhnika, Minsk, **2** (2): 140–141. [In Russian]
- Peklo, A. M., 1997. *Catalog of the collections of the Zoological Museum of the National Academy of Sciences of Ukraine. Birds*, **2**. Kyiv, 184–197 [In Russian]
- Pepper, J., E. Hastings. 1952. The effects of solar radiation on grasshopper temperatures and activities. *Ecology*, **33** (1): 96–103.
- Phillips, S. J., M. Dudik. 2008. Modeling of species distributions with MaxEnt: new extensions and a comprehensive evaluation. *Ecography*, **31** (2): 161–175.
- Pimm, S. L., P. Raven. 2000. Extinction by numbers. *Nature*, **403**: 843–845.
- Pohranychnyi, V. O., R. S. Kozlovskiy, M. I. Makhnyk. 1994. Ornithofauna of the Lazy tract and its surroundings. *The 1st Conference of Young Ornithologists of Ukraine (Lutsk, March 4–6, 1994)*. Chernivtsi, 104–106. [In Ukrainian]
- Poniatowski, D., T. Fartmann. 2008. The classification of insect communities: Lessons from orthopteran assemblages of semi-dry calcareous grasslands in central Germany. *European Journal of Entomology*, **105** (4): 659–671.
- Potapov, P., S. Turubanova, M. C. Hansen, *et al.* 2021. Accelerated expansion of global cropland extent in the 21st century. *In Review. Nature Portfolio Journal*. <https://doi.org/10.21203/rs.3.rs-294463/v1>
- Potish, L. A., N. I. Potish. 2006. *Catalog of collections of the Zoological Museum of Uzhhorod National University. Birds: exhibition collection*. Uzhhorod National University, Uzhhorod, 1–38. [In Ukrainian]
- R Core Team 2020. *R: A language and environment for statistical computing*. R Foundation for Statistical Computing, Vienna, Austria. URL: <https://www.R-project.org/>
- Records of protected animal, plant and fungi species in Ukraine. 2020. Conservation Biology in Ukraine, **19**. Kyiv, Fund “Biodiversity Protection Fund of Ukraine”, 1–704. [In Ukrainian]
- Red Data Book of Krasnodar Province. 2017. 3rd edition. Part 2 (Vertebrates), 452–720. [In Russian]
- Rodriguez, J., J. M. Avilés, D. Parejo. 2011. The value of nestboxes in the conservation of Eurasian Rollers *Coracias garrulus* in southern Spain. *Ibis*, **153** (4): 735–745.
- Redinov, K. O. 2006. Ornithofauna of the Elanetsky Steppe Nature Reserve. *Zapovidna sprava v Ukraini*, **12**(1): 46–56. [In Ukrainian]
- Rumsey, D. J. 2016. *Statistics For Dummies, 2nd Edition*, 1–416. ISBN 978-1-119-29352-1.
- Rydgren, K., R. H. Økland, T. Økland. 2003. Species response curves along environmental gradients. A case study from SE Norwegian swamp forests. *Journal of Vegetation Science*, **14** (6) : 869–880.
- Santini, L., A. Benítez-López, L. Maiorano, *et al.* 2021. Assessing the reliability of species distribution projections in climate change research. *Diversity and Distributions*, **27** (6): 1035–1050.
- Saunders, P. W. *Habitat change and climate effects on the European Roller (Coracias garrulus); implications for conservation*. 2016. Thesis submitted for the degree of Doctor of Philosophy at the University of East Anglia, Norwich, UK, 1–165.
- Shepard, E. L. C., Wilson, R. P., Rees, W. G., Grundy, E., Lambertucci, S. A., Vosper, S. B. 2013. Energy landscapes shape animal movement ecology. *The American Naturalist*, **182** (3): 298–312.
- Soberón, J., M. Nakamura. 2009. Niches and distributional areas: concepts, methods and assumptions. *Proceedings of the National Academy of Sciences USA*, **106**, Suppl. 2: 19644–19650.

- Song, X. P., M. C. Hansen, S. V. Stehman, *et al.* 2018. Global land change from 1982 to 2016. *Nature*, **560**: 639–643.
- Sosnowski, J., S. Chmielewski. 1996. Breeding biology of the Roller *Coracias garrulus* in Puszcza Pilicka Forest (Central Poland). *Acta Ornithologica*, **31** (2): 119–131.
- Torres, L. G., P. J. Sutton, D. R. Thompson, *et al.* 2015. Poor transferability of species distribution models for a pelagic predator, the Grey Petrel, indicates contrasting habitat preferences across ocean basins. *PLoS ONE*, **10** (3): e0120014.
- Tucker, G. M., M. F. Heath, L. Tomialojc, *et al.* 1994. *Birds in Europe: Their Conservation Status*. BirdLife International, Cambridge, UK, 1–600.
- Ulyura, E., V. Tytar. 2018. Terrestrial vertebrates of post-coalmining sites in the Donets Basin. *Geo&Bio*, **16**: 99–109.
- Ulyura, E., V. Tytar. 2017. Terrestrial vertebrates of post-quarrying sites in the Donbas region of Ukraine. *Vestnik Zoologii*, **51** (6): 517–526.
- Uvarov, B. P. 1977. *Grasshoppers and Locusts. A Handbook of General Acridology. Volume 2. Behaviour, ecology, biogeography, population dynamics*. London: Centre for Overseas Pest Research, Cambridge University Press, 1–613.
- Visconti, P., M. Bakkenes, D. Baisero, *et al.* 2016. Projecting global biodiversity indicators under future development scenarios. *Conservation Letters*, **9** (1): 5–13.
- Wiens, J. J. 2011. The niche, biogeography and species interactions. *Philosophical Transactions of the Royal Society of London B. Biological Sciences*, **366** (1576): 2336–2350.
- Wilson, J. D., A. J. Morris, B. E. Arroyo, *et al.* 1999. A review of the abundance and diversity of invertebrate and plant foods of granivorous birds in northern Europe in relation to agricultural change. *Agriculture, Ecosystems & Environment*, **75** (1–2): 13–30.
- Wolf, B. O., G. E. Walsberg. 1996. thermal effects of radiation and wind on a small bird and implications for microsite selection. *Ecology*, **77** (7): 2228–2236.
- Wormworth, J., K. Mallon. 2006. *Bird Species and Climate Change*. The Global Status Report: A synthesis of current scientific understanding of anthropogenic climate change impacts on global bird species now, and projected future effects, 1–75.
- Yadav, S., A. J. Stow, R. M. B. Harris, *et al.* 2018. Morphological variation tracks environmental gradients in an agricultural pest, *Phaulacridium vittatum* (Orthoptera: Acrididae). *Journal of Insect Science*, **18** (6): 13. Doi: 10.1007/s10841-018-9999-9.
- Yang, K., J. He, W. Tang, *et al.* 2010. On downward shortwave and longwave radiations over high altitude regions: Observation and modeling in the Tibetan Plateau. *Agricultural and Forest Meteorology*, **150** (1), 38–46.
- Ying, Q., M. C. Hansen, P. V. Potapov, *et al.* 2017. Global bare ground gain from 2000 to 2012 using Landsat imagery. *Remote Sensing of Environment*, **194** (1): 161–176.