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OPEN Colonization of Warsaw by the red fox Vulpes vulpes in the years 1976-2019

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The red fox is one of the most adaptable carnivores inhabiting cities. The aim of our study was to describe the process of Warsaw colonization by the red fox. We focused on: (1) the fox distribution in Warsaw on the basis of presence-absence data (2005–2012) over a grid of 1×1 km², (2) the process of settlement in 29 green areas (study periods 1976–1978, 2004–2012, and 2016–2019) in relation to habitat type, and (3) temporal and spatial patterns of the red fox incidents (1998–2015) reported by Warsaw citizens. We found out that: (1) the red fox penetrated the whole city (i.e. its presence was confirmed in all squares of the grid), (2) 21% of the green areas were colonized in 1976–1978 but 93% in 2016–2019. Forests and riparian habitats were occupied more frequently than parks and cemeteries in 1976–1978 with no difference in the further years; (3) the probability of the fox incidents increased over years, was higher in June-October, on working days, and around noon, and with the share of discontinuous urban fabric in the buffers around incident locations. Nevertheless, the incidents only partially reflect population abundance trends and activity patterns of the species, so should be treated cautiously.

For decades, the use of urban areas by wildlife and urban species population numbers have increased¹⁻⁶, which is a result of wildlife adaptation to specific urban conditions (like high human density, large areas of impervious surfaces and built-up areas)7-10. One of species inhabiting urban areas is the red fox (Vulpes vulpes)11. Thanks to its plasticity the red fox utilizes a wide range of habitats—from near-natural to built-up areas¹²⁻¹⁵, and uses a variety of food in different habitats¹⁶⁻¹⁹. As a result, urban populations of the red fox may reach extremely high densities^{1,13,20-23}. This in turn may lead to emerging and rapidly spreading epizooties (e.g. sarcoptic mange), limiting the number of foxes^{24,25}. The occurrence of the red fox in urban areas, may result in predation on pets and digging burrows^{16,26-29}, which is annoying and frequently reported by city inhabitants^{30,3}

The first red foxes in urban areas were recorded in the 1930s in the suburbs of London^{12,32}. Yet, historical analyses showed that foxes used urban habitats in the mid-nineteenth century³³ or even earlier³⁴. The time of colonization of urban areas by red fox varies by countries: Denmark-the 1960s³³, Australia-the 1970s³⁵, Switzerland—the 1980s³⁶. Nowadays, red fox populations have been recorded from more than one hundred cities around the world, mostly in Great Britain and other European countries³⁷, but new cities have been colonized²⁸ and some urban populations have continued to increase in numbers³¹. The red fox populations expanding in urban areas are probably related to anti-rabies vaccinations implemented in many countries^{36,38}, but not all. Although the red fox is common in many cities, breeding in typically urban populations have not been recorded from everywhere³⁴.

The red fox is mainly nocturnal^{31,39}. Moreover, patterns of daylight encounters of the red fox are variable²¹ cf.⁴⁰, and the probability of fox sighting are influenced by human activity and their space use in a city³¹. Therefore, the increase of the red fox sightings does not necessarily reflect increase in the population abundance, but can be related to the rising number of the red fox-human conflicts (traffic collisions or intervention of relevant services,

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e.g. trapping, interventional culling)^{28,41}. Taking all this into account, direct observations can be used to estimate abundance of urban populations of red foxes^{20,42}, yet estimation bias needs to be acknowledged⁴³. On the other hand, registry of incidents involving foxes (e.g. traffic collisions), was found to be quite a reliable indicator of population rise, changes in species distribution^{5,21,41} and a possible density estimator⁴⁴.

Preliminary studies on red fox population in Warsaw, conducted in the 1970s, showed a very low population density and just incidental (and associated to forest areas in peripheral city zones) records of breeding [Goszczyński J., unpublished]. It is likely that the population has grown since then and has spread throughout the city area. Therefore, the aim of our study was to describe the process of Warsaw colonization by the red fox on the basis of current and historical field work and red fox incident reports. The study included three parts. First, we checked what proportion of the city was colonized by the red fox on the basis of presence–absence data over a grid of squares. We assumed that red foxes would be present mostly in outer city districts, forests and continuous fields and meadows, but also within the Vistula river riparian forests, as this would serve as an ecological corridor. Next, we analysed the progress in the settlement of selected urban green areas by red fox for which historical and present field work data were available. We related the process of colonization to habitat types of those areas. Additionally, we analysed how the number of red fox incidents changed over a twenty year period as this would, at least to some extent, reflect population abundance increase. We also checked what were the temporal and spatial factors shaping the pattern of red fox incidents and related this to both carnivore biology and ecology but also human activity within the city. This would help to evaluate usefulness of such data to document population increase of the red fox in urban conditions.

Methods

Study area. The research was conducted in Warsaw ($52^{\circ} 13' 47'' N 21^{\circ} 00' 42'' E$), the capital city of Poland, the largest (517 km^2) and the most populous (1,778,000 inhabitants, 3437 inhabitants/km²) city of the country⁴⁵. The city is situated at an altitude of around 113 m above sea level with an annual rainfall of about 500 mm and an average annual temperature of 7.7 °C^{46} .

The Vistula River flows through Warsaw, dividing the city into two parts (Fig. 1). The left bank of the river is characterized by a high degree of anthropogenic transformation, while along the right bank natural riparian forests, included in the Natura 2000 network^{47–49} and constituting an important ecological corridor, have been preserved.

Warsaw is divided into 18 districts and characterized by high proportion of green areas (as much as 63% according to Luniak et al.⁵⁰). These are: numerous parks, squares, residential and roadside vegetation, cemeteries, botanical and zoological gardens, allotment gardens, home gardens, old city fortifications, open areas and agricultural land (pastures, meadows, orchards). Moreover, natural greenery like riparian forest along the Vistula and smaller watercourses, nature reserves and forests are important green areas. Most of parks and squares are located in the city centre (Fig. 1). Forests account for about 15% of the city area and are located mainly in the outskirts, and in the eastern and south-eastern part of the city (Fig. 1). It may be assumed that the connectivity between green areas on each side of the river is relatively maintained, and that the system of protected areas in Warsaw provides a safeguard to populations of most, especially small mammal species⁵¹.

Research methods. The study included three stages: (1) assessment of the fox distribution in Warsaw, (2) describing the process of settlement in the selected green areas and (3) temporal and spatial patterns of incidents with red foxes.

Data collection. Assessment of the red fox distribution in Warsaw. To assess the occurrence of the red fox in Warsaw, the city area was divided into grid of 593 squares (Fig. 2) with the resolution 1×1 km, 152 squares were located at the borders of Warsaw (with part being outside the city not included in the study). Each square was checked for the presence of the red fox. First, all previously collected direct sightings of red fox and known fox dens dating back to 2005 were assigned to a square. Next, all remaining squares were searched between 2011 and 2012 for signs of fox presence. Most of the data was collected during winter 2011–2012, when long-lasting snow cover allowed for efficient (snow tracking) survey. Additionally, occupied and non-occupied burrows, presence of adults or juveniles, or killed animals (mostly victims of collisions), and, in some cases, tracks on the mud/sand or scats were recorded. When some of the above was found, the square was marked as 'fox present' and no further checks were done in this particular square. When no signs were found, we repeated the survey or searched the square more thoroughly.

Process of the settlement of the red fox in the selected green areas. To estimate the progress in the settlement of selected green spaces in the city, 29 various green areas (4 to 139 ha) located in different distance from the city centre were selected. They were attributed to four different habitat types: cemeteries (n = 6), forests (n = 5), parks (n = 11) and riparian habitats in the Vistula river valley (n = 7). The green areas were easily identified as separate units, and they remained relatively stable in terms of boundaries and land use since the first compared period: the 1970s. The research was done in three periods: (1) 1976–1978 (Goszczyński J., unpbl. data), (2) 2004–2012 and (3) 2016–2019. In the first period, in all selected areas snow-tracking on transect routes (i.e. line transects) was done to confirm the species presence. In the next two periods, presence of fox was confirmed either on the basis of snow tracking on the transect routes or on the basis of presence of dens or breeding records within the green area. The total lengths of the line transects were: 113.9 km (on average 3.9 km in one study area, min = 0.15, max = 23.5 km), 61.0 km (2.8 km, min = 0.5, max = 9.1 m), 93.4 km (5.5 km, min = 0.8, max = 21.2 km) in the three periods, respectively.



Figure 1. Distribution of green areas and other habitats in Warsaw. The Palace of Culture and Science, assumed as the most central point of the city is marked.

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Spatial and temporal patterns of incidents involving the red fox. As the third source of data, we used reports on red fox presence in the city (1998–2015), recorded by the Municipal Forests—Warsaw. The data included any kind of incident involving red fox: sightings (reported by city inhabitants), trapping attempts, culling or euthanasia, traffic collisions involving the species, observation of burrows or litters, individuals found dead or delivered to the rehabilitation centre governed by the Municipal Forests—Warsaw. For each incident, time and date, approximate or exact location (see Supplementary Fig. S1) and condition of the animal (alive, wounded, dead) were recorded.

Statistical and spatial analysis. Process of the settlement of the red fox in the selected green areas. The χ^2 test for goodness of fit was used to test the null hypothesis that the observed counts of objects (green areas) of each habitat type, colonised by foxes followed the expected counts, which were proportional to the total number of objects belonging to a given habitat category. In the case the null hypothesis had been falsified the post-hoc analysis was performed to determine which counts differed from their theoretical proportions. The confidence intervals for multinomial proportions were calculated using method proposed by Sision and Glaz⁵² with the function MultinomCI from package DescTools⁵³.

Spatial and temporal patterns of incidents involving the red fox. To analyse temporal patterns of incidents with foxes two statistical models were built. The first one described annual and year to year variation (1998–2015) in the number of incidents with the red fox. The second one described the hourly variation in the number of incidents. We checked the assumption that incorporation of nonlinear effects to the model improved its performance by comparison of two models both fitted with gam function from library mgcv. The first had only linear terms and the second had nonlinear smoothers. To compare explanatory power of both models we used the anova function. The methods described above, confirmed with the significance level at least 0.05, that models containing non-linear terms performed better in the case of both models. We tested for concurvity (which is counterpart for collinearity for gam models) in the first gam model (containing more than one independent variable) with function concurvity() from library mgcv. We also checked for collinearity in each logistic regression model for spatial data with the use of function check_collinearity from library performance.

To build the first temporal model each recorded incident with fox was coded for 'day of year' (ordinal day as number ranging from 1 to 366) and 'time of week' (variable week with only two levels weekday and weekend). Based on these attributes the number of collisions per day was calculated for each day in the analysed period (6574 estimates). To account for a possible trend in the number of fox incidents in the analysed period the additional variable 'time of data collection' was introduced. This was based on a unique number representing a calendar day in R software environment. The variable was scaled by 1000 to values in a range from 10,227 to 16,800 representing all days in the analysed period. The general additive model (GAM) with a Poisson error distribution and log link was used to determine how the number of incidents changed over time during 1998–2015. These kind of models use splines, that allow for determination of nonlinear fit between dependent and independent variables in a more elastic manner then parametric nonlinear functions usually implemented in generalized

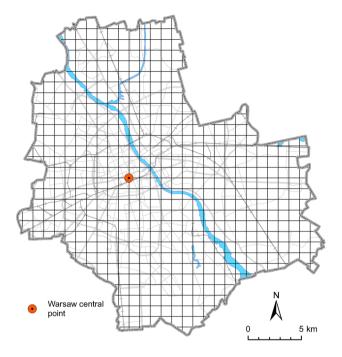


Figure 2. The grid of squares searched for presence signs to assess red fox distribution in Warsaw in 2005–2012. The Palace of Culture and Science, assumed as the most central point of the city is marked.

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models. The 'number of incidents per day' was used as a response variable. The 'day of year' and described above variables: 'time of data collection' and 'time of week' were used as explanatory variables. In the GAM model an explanatory variable 'day of year' was fitted with cyclic penalized cubic regression splines whose ends match (i.e., number of incidents in day 1 and day 366 was assumed to be the same; Wood⁵⁴). The variable 'time of data collection' was fitted in a model with ordinary regression splines. For both mentioned variables the upper limit for the effective degrees of freedom of the spline was set at 10 to control the complexity of the fit. The variable 'time of week' was used as fixed categorical variable.

The second temporal model was built to estimate the daily variability of incidents with foxes. The dependent variable was calculated as a number of incidents per minute of a day, e.g. all cases of fox incidents which happened between 0:00 and 0:01 in the whole period of study (between 1998 and 2015) were pooled and assigned to the first minute of a day. This gave variable containing 1440 min estimates. The only independent variable used in this model was the 'minute of day' ranging from 1 to 1440. As in previous model the explanatory variable was fitted with cyclic penalized cubic regression splines whose ends match and the effective degrees of freedom of the spline was set at 10. Both GAM models were parametrized using the mgcv package⁵⁵.

Among all incidents with red foxes, only those for which the exact location was known (i.e. the street number or other details that allowed to locate the place with at least 50 m accuracy were given) were taken for spatial analysis. In order to analyse habitat characteristics for red fox incidents locations, the following data were involved: Urban Atlas (UA) published in 2018 and derived by EU Copernicus Land Monitoring Service⁵⁶, which presented the biophysical characteristic of Earth, the polygon data for the Vistula river and the central point of Warsaw. The UA layer was generalized into seven classes of landcover (continuous urban fabric, discontinuous urban fabric, industrial areas, parks, agricultural areas, forests, wetlands; see Supplementary Table S1). Around all fox incident locations the circle polygons with the radius 100, 250, 500 and 1500 m were generated by buffer function. Next UA layers were intersected with each buffer independently and the UA classes percentages for each radius were calculated. The planar distances between fox incident location and aforementioned point layers were done by the ArcGIS near function. The same procedure was repeated for the 1000 randomly generated points within the border of Warsaw. To analyse spatial characteristics of incidents four logistic regression models were built. The dependent variable was a binary vector of length 1263, taking values equal 1 for all 263 incidents with foxes for which precise geographic location was available and 0 for additional 1000 locations, randomly distributed within the border of Warsaw. The distance to the city centre (i.e. the most central point of the city, Fig. 1), the distance to the Vistula River (an ecological corridor within the city) and the percentage share of seven habitats that were subject to different level of anthropopression (Supplementary Table S1) in the buffer zones (100, 250, 500, 1500 m) were taken as independent variables in each model. In each spatial model the characteristic of surrounding habitats were calculated based on different radius 100, 250, 500, 1500 m. Variables that were not important statistically were removed from fitted models. The comparison of model performance based on R² could be used to judge which environmental variables and in a given spatial scale were the most important to predict incidents with foxes.

All statistical calculations were performed in R⁵⁷. All spatial analyses were performed in ArcGIS package version 10.8.1⁵⁸.

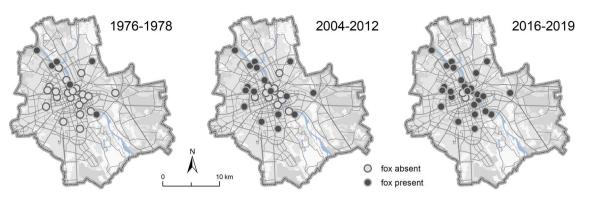


Figure 3. Presence of the red fox as confirmed by snow tracking in 29 randomly selected green areas in Warsaw in the three study periods (data for 1976–1978 after Goszczyński J., unpbl.).

Results

Assessment of the red fox distribution in Warsaw. Signs of red fox presence were found in the whole city, i.e. the fox presence was confirmed in each of $593 1 \times 1 \text{ km}^2$ of the grid checked between 2005 and 2012.

Process of the settlement of the red fox in the selected green areas. In 1976 to 1978, only six (21%) of 29 selected green areas were colonized by foxes. This increased to 18 (62%) in 2004–2012 and 27 (93%) in 2016–2019 (Fig. 3). Areas covered by forests and riparian habitats (Supplementary Table S2) were occupied in the first study period (1976–1978) more frequently (test for goodness of fit, p = 0.031). For the other two periods no significant differences in the selection of habitats were found (p = 0.638 and p = 0.971, respectively) (Fig. 4).

Temporal pattern of incidents involving the red fox. In the years 1998–2015, 608 incidents involving foxes were reported; 52% of them concerned alive individuals (mostly fox sightings or trapping attempts), in 5% injured foxes were reported. In 47% of cases foxes were found dead (mostly due to traffic collisions). The number of reported incidents per year increased gradually from just a few cases in 1998 and 1999 to over 80 in 2015. The number of city districts where incidents were reported also increased gradually from four and two in 1998 and 1999, respectively to 16 (out of total 18) in 2015. The highest number of reported incidents per day was three.

All three time scale predictors (time of week, day of year, time of data collection) included in the GAM significantly influenced the probability of reporting a fox incident (Table 1). The higher probability was from June to October, and most of the reports (58.6%, N = 314) in this period concerned fox sightings or trapping attempts. In the remaining months, this probability was lower, and the majority of incidents involved dead animals (54.3%, N = 289). Overall, the probability of reporting the red fox incidents in Warsaw increased over study course (Fig. 5), and was significantly affected (p = 0.022) by time of week, being higher on working days than weekends (Fig. 5).

Time of day (p < 0.001) also influenced the probability of a red fox incident. The incidents were reported most often between 8 a.m. and 8 p.m. with a clear peak around noon. The biggest chance of incident report was between 10.00 a.m. to 02.00 p.m., and lowest between 08.00 p.m. to 07.00 a.m. (Fig. 6).

Spatial patterns of incidents involving the red fox. We recorded a general negative relationship with the proportion of forests, agricultural areas, wetlands and with an increasing distance to the Vistula River for the buffers with radius 100, 250 and 500 m (Table 2, Fig. 7). Within 1500 m radius buffer there was a negative relationship with an increasing distance to the Vistula River and the city centre, and a positive with the share of discontinuous urban fabric (Table 2, Fig. 8). No collinearity was found between the variables.

Discussion

The red fox is one of the mammal species that successfully colonized many cities around the world³⁷. Its presence was confirmed in Warsaw more than a few decades ago. Nevertheless, at those times the red fox was assumed to inhabit mainly fairly natural habitats (i.e. forests) and remote city areas. The aim of our study was to describe the process of Warsaw colonization by the red fox in recent decades. A concept of the process of city colonization assumes division into three phases: (1) arrival, (2) adjustment and (3) spread⁴. In this paper we focused on the spread of the species in the city. The red fox arrival in Warsaw is hard to estimate, yet first data on the red fox in Warsaw dates back to 1890s⁵⁹. Low population density and few sightings in the 1970s [Goszczyński J., unpublished] may suggest that proper spread of the red fox in Warsaw started no sooner than in the last decades. As we showed on the basis of presence-absence data through the grid of squares, red foxes had already started to penetrate the whole area of Warsaw. In the past decades (i.e. in the 1970s), it inhabited mostly green spaces of more natural character (i.e. forests), while in the XXI century parks and cemeteries were occupied as often.

The red fox colonizes urban areas because of its extraordinary adaptability to settle in new habitats. Animals may be also pushed into the city as a result of overpopulation in non-urban areas³⁶. Previous molecular studies on colonization of urban habitats by the red fox showed that the process starts usually from a few locations near the city borders and spreads gradually into its central parts^{60,61}. The red fox movements through the city

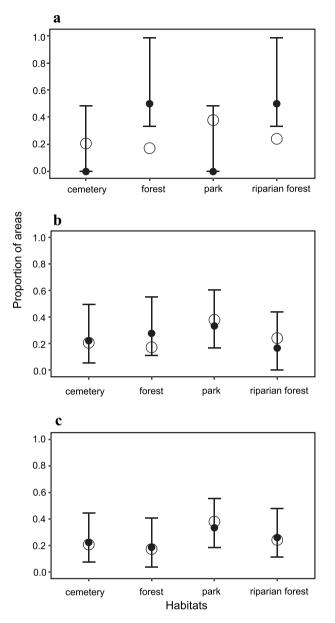


Figure 4. Proportion of green areas occupied by the red fox as confirmed by snow tracking, attributed to four habitat types in Warsaw, in subsequent study periods: (**a**) 1976–1978 (Goszczyński J., unpbl. data), (**b**) 2004–2012 and (**c**) 2016–2019. A full circle indicates actual proportion and an empty circle indicates expected proportion of colonized areas attributed to a certain habitat type, bars depict lower and upper bound of the confidence interval.

can be affected by human-made infrastructures⁶², like railways⁶³, roads^{62,64,65}. Densely built-up areas are usually avoided by foxes^{14,62}, while specific migration corridors like roadside or railway vegetation^{62,66} will facilitate the process. Indeed, in Warsaw the red fox inhabited at first the largest green areas located mainly in the outer city districts or located in the Vistula riparian forests, a natural ecological corridor for mammals⁴⁸. At the next stage, a number of green spaces occupied by the red fox increased. City habitats are generally readily accessible by foxes (see Douglas and Sadler⁶⁷), therefore after several decades of the colonization process in Warsaw, only a small percentage of green areas under study was not used by foxes. They were highly isolated, small urban parks, often visited by people, with limited availability of potential den sites. They were also located close to or in the strict city centre, areas usually avoided by foxes^{13,68,69}.

The other part of our research was based on data derived from the Municipal Forests in Warsaw, the administration unit dealing with and collecting data on incidents with wildlife in Warsaw. This included mostly any incidental observational data by city inhabitants or cases of traffic collisions. Such data was already used by other researchers to study encounters between carnivores and humans or urban population trends^{15,21,28,31,70} and here we wanted to evaluate its usefulness in future studies. We showed that the probability of reporting on incident involving red foxes was dependent on different temporal variables. First, most of the incidents were noticed

Predictors	Estimate	SE	z or χ^2	p			
Model 1 (R ² _{Nagelkerke} =15.9%)							
Intercept	-2.69	0.06	-44.10	< 0.001			
Time of week	-0.22	0.09	-2.30	0.022			
Day of year	edf=2.21	-	18.39	< 0.001			
Time of data collection	edf=1.45	-	275.80	< 0.001			
Model 2 (R ² _{Nagelkerke} =10.9%)							
Intercept	-1.31	0.12	-11.21	< 0.001			
Time of day	edf=3.34	-	39.71	< 0.001			

Table 1. Results of generalized additive models explaining probability of the red fox incidents in Warsaw. 'Model 1' analyzing the effect of time of week (weekdays vs. weekends), day of year (1–366) and time of data collection (a day in the period 1998–2015), on the probability of an incident with the red fox in Warsaw and the second one, 'model 2' analyzing the impact of time of day (hour) on the probability of fox incident. Estimated number of degrees of freedom, standard error, z or χ^2 statistics, *p* value and explanatory power of each model (R²_{Nagelkerke}) are given.

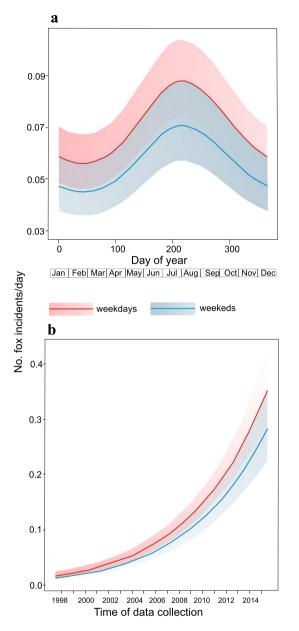
during a peak of a day (between 10.00 am and 02.00 pm), which is atypical fox activity (regardless of habitat type) compared with most other studies^{18,28,31,39,71-73}. However, it was shown that the daily activity of urban populations of the red fox differed. In Great Britain, in a typical urban population, foxes were observed mostly during the day^{40} , while in Melbourne (Australia), red fox sightings at this time were very rare. This was explained by the initial stage of population development²¹. Therefore, we assume that the probability of reporting incidents with the red fox in our case was dependent on human rather than red fox activity. The number of incidents involving red foxes increased beginning from 07.00 a.m. and clearly declined after 08.00 p.m., what corresponds with highest number of people staying outdoor⁷⁴. In Finland, Kauhala et al.³¹ came to the same conclusion with even clearer peaks of observations at a few specific hours during the day. Next, we showed that the number of reported red fox incidents on weekdays was higher when compared to weekends. This also may be attributed to higher weekday outdoor activity of city inhabitants and higher traffic volume, thus increased probability of the red fox sighting or vehicle collision. Finally, we showed that the peak of the red fox incidents was reported in summer and early autumn (June-October) while being lower in the remaining months (November-April). Similar distribution of observations during the year was in Turku in Finland³¹, but different in Estonian cities²⁸. Again, we may assume that in our case, this can be explained by both circannual activity of the red fox but also human outdoor activity. February to April is the birth time of foxes, with spatial activity (especially of vixens) limited mainly to the area of breeding dens^{39,75-77}, which is in line with recorded low number of red fox incidents at that time. However, December to February is the mating season of red foxes when increased activity of males is observed⁷⁷, so a higher number of incidents could be expected. Here, low number of the red fox incidents was probably the result of low human activity (as connected to unfavourable winter weather conditions) rather than fox activity. Similarly, the peak of incidents between June and October can be related to high red fox activity (especially increasing range of juveniles⁷⁸) but also higher human outdoor activity in summer and early autumn months.

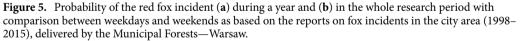
This relation between the number of the red fox incidents and human outdoor activity is also visible when spatial patterns are analysed. The number of the red fox incidents decreased with the share of forests, meadows, wetlands (which are natural red fox habitats⁷⁹) but increased with the share of sparsely built-up areas. It was also higher close to the city centre and to the Vistula River. Foxes inhabiting residential gardens and low-density housing areas were observed in other cities^{14,80,81}, yet in Warsaw dens of red foxes are hardly ever recorded in such surrounding, they are mostly located in forests (Jackowiak M., unpbl.). At the same time, in the city centre and in areas with low-density housing the outdoor activity and presence of people is high⁸², which may favour more frequent fox observations. The Vistula River in turn, goes through the whole of Warsaw (including its city centre), serving as an ecological corridor but also a popular recreational area, so wildlife-human encounters here are likely. Similar results were obtained in Turku³¹ and in Vienna⁷¹.

The eagerness to report the fact of observing a wild animal, depends on observer's motivation²⁶, and in our study may be explained by people concerned about the presence of carnivorous mammals (in this case the red fox) in cities. As revealed in a questionnaire study in Germany, the majority of inhabitants were not afraid of foxes and were generally pleased with fox presence, yet had their concerns about potential zoonotic diseases³⁰. The red fox is one of the most important vectors of zoonoses and their presence in cities may affect the spread of epidemic risks^{31,83-85}. In Poland and in Warsaw, rabies, as the most dangerous fox-transmitted disease, is still present in fox population⁸⁶ but also frequent cases of mange occur (Jackowiak M., unpbl.). Due to this red fox encounters arise usually anxiety in city inhabitants who, in such situations, may willingly seek help from wildlife services.

Although, human activity influences the number of the red fox observations^{43,71}, fox sightings were used to estimate population abundance and how it changed (e.g.^{20,36,42,87}). In our study, the probability of a red fox incident rose over time, which points to a population increase. Yet, it should be kept in mind that during our study, access to the Internet (thus information on urban wildlife), and mobile phones increased rapidly, which possibly also boosted the number of the red fox incidents reported.

In our study we showed the process of red fox settlement in Warsaw, the capital city of Poland. At first, the red fox colonised mainly green areas of more natural character and placed further from the city centre, gradually





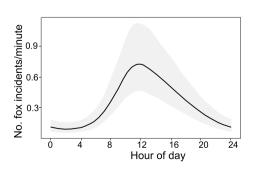


Figure 6. Modelled number of the red fox incidents per minute during the day as based on the reports on the red fox incidents in the city area (1998–2015), delivered by the Municipal Forests—Warsaw.

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Predictors	Estimate	SE	Z	P			
100 m radius (R ² _{Tjur} =0.069; AUC=0.684)							
Intercept	-0.38845	0.12804	- 3.03368	0.002			
Distance to the Vistula river	-0.00016	0.00003	- 5.69064	< 0.001			
Share of forests	- 0.00005	0.00001	-4.58908	< 0.001			
Share of agricultural areas	-0.00004	0.00001	-4.00039	< 0.001			
Share of wetlands	-0.00007	0.00003	- 2.62905	0.009			
250 m radius (R ² _{Tjur} =0.065; AUC=0.678)							
Intercept	-0.34782	0.13128	-2.64937	0.008			
Distance to the Vistula River	-0.00017	0.00003	- 5.80572	< 0.001			
Share of forests	-0.00001	0.00000	-4.42650	< 0.001			
Share of agricultural areas	-0.00001	0.00000	- 3.55513	< 0.001			
Share of wetlands	-0.00001	0.00001	-2.79133	0.005			
500 m radius (R ² _{Tjur} =0.060; AUC=0.672)							
Intercept	-0.29848	0.13850	-2.15513	0.031			
Distance to the Vistula river	-0.00017	0.00003	- 5.74674	< 0.001			
Share of forests	- 0.00000	0.00000	-4.19826	< 0.001			
Share of agricultural areas	- 0.00000	0.00000	- 3.32188	0.001			
SHARE of wetlands	- 0.00000	0.00000	-2.71936	0.007			
1500 m radius (R ² _{Tjur} =0.045; AUC=0.648)							
Intercept	-0.69091	0.25402	- 2.71995	0.007			
Distance to the Vistula river	-0.00015	0.00003	- 5.16528	< 0.001			
Distance to the city centre	- 0.00005	0.00002	-2.63165	0.008			
Share of discontinuous urban fabric	0.00000	0.00000	2.56185	0.010			

Table 2. Influence of habitat characteristics on the probability if the red fox incident in Warsaw. Results of the logistic regression models for 100, 250, 500 and 1500 buffer radius around location of red fox incident in Warsaw in 1998–2015 has been presented. The explanatory ability of models (R^2_{Tjur} and AUC) is given.

expanding throughout the city. The red fox requires three factors that are crucial for urban population existence—access to daytime resting sites, convenient breeding sites and food availability⁸⁸. Wide distribution of the red fox in Warsaw proves that these conditions are fulfilled and the abundance of the red fox population will probably further increase. For decades, red fox was heavily hunted (and poached) as pest (preying on small game and domestic animals, mostly poultry) but also for its valuable fur⁷⁹ so red foxes avoided people (e.g. they had their dens almost exclusively in forests⁸⁹). This has changed in the last (approximately) twenty years, i.e. red fox abundance increased thanks to anti-rabies vaccinations⁹⁰. This increase in population abundance and, assumingly, lowering fear of human will lead to higher tolerance of red foxes to closer contacts with people. With the red fox settlements in more human-transformed habitats within city boundaries, red fox-human encounters (and possibly also conflicts) will also increase. This will affect epidemiological risks. Thus, the urban red fox monitoring remains essential for the risk assessment and proper population management. Nevertheless, as we shown in this study, incidental red fox sightings by city inhabitants should be treated with caution. Being highly influenced by patterns of human outdoor activity and people attitudes towards wildlife (driven also by health concerns) they only partially reflect real population abundance trends as well as temporal and spatial activity patterns of this medium-sized carnivore.

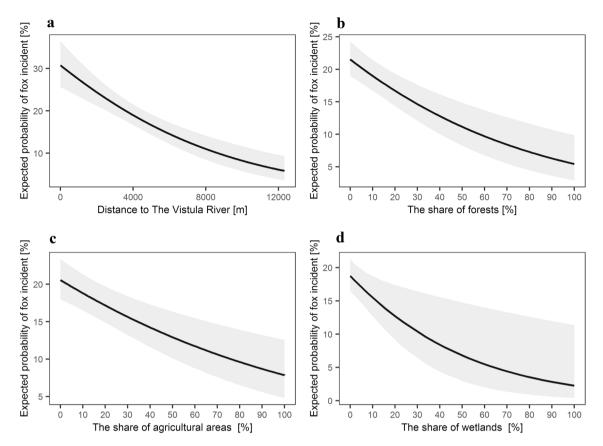


Figure 7. Expected probability of the red fox incidents as based on the reports (1998–2015), delivered by the Municipal Forests—Warsaw, in relation to distance to (**a**) the Vistula river (an ecological corridor), (**b**) share of forest, (**c**) share of agricultural areas, and (**d**) share of wetlands within 100 m radius around location of red fox incident. Explanatory variables that were significant in the logistic regression model (see Table 2) are shown.

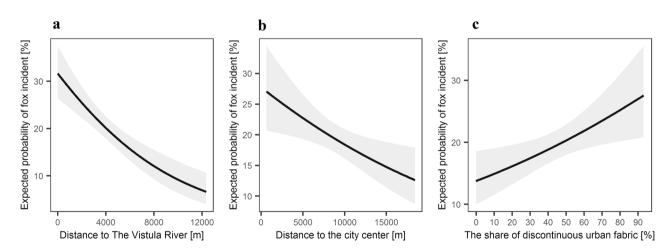


Figure 8. Probability of the red fox incident as based on the reports (1998–2015), delivered by the Municipal Forests—Warsaw, in relation to distance to (**a**) the Vistula river, (**b**) the city centre and (**c**) share of discontinuous urban fabric within 1500 m radius around location of red fox incident. Explanatory variables that were significant in the logistic regression model (see Table 2) are shown.

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References

- 1. Baker, P. J., Newman, T. & Harris, S. Bristol's foxes-40 years of change. Br. Wildl. 12, 411-417 (2001).
- 2. Vuorisalo, T. *et al.* Urban development from an avian perspective: Causes of hooded crow (*Corvus corone cornix*) urbanization in two Finnish cities. *Landsc. Urban Plan.* **62**, 69–87 (2003).
- 3. Baker, P. J. & Harris, S. Urban mammals: What does the future hold? An analysis of the factors affecting patterns of use of residential gardens in Great Britain. *Mammal Rev.* **37**, 297–315 (2007).
- Evans, K. L., Hatchwell, B. J., Parnell, M. & Gaston, K. J. A conceptual framework for the colonization of urban areas: The blackbird *Turdus merula* as a case study. *Biol. Rev.* 85, 643–667 (2010).
- Geiger, M., Taucher, A. L., Gloor, S., Hegglin, D. & Bontadina, F. In the footsteps of city foxes: Evidence for a rise of urban badger populations in Switzerland. *Hystrix It. J. Mamm.* 29, 236–238 (2018).
- Lesiński, G., Gryz, J., Krauze-Gryz, D. & Stolarz, P. Population increase and synurbization of the yellow-necked mouse Apodemus flavicollis in some wooded areas of Warsaw agglomeration, Poland, in the years 1983–2018. Urban Ecosyst. 24, 481–489 (2021).
- 7. Andrzejewski, R., Babińska-Werka, J., Gliwicz, J. & Goszczyński, J. Synurbization processes in population of *Apodemus agrarius*. I. Characteristics of populations in an urbanization gradient. *Acta Theriol.* **23**, 341–358 (1978).
- 8. Doncaster, C. P. & MacDonald, D. W. Drifting territoriality in the red fox Vulpes vulpes. J. Anim. Ecol. 60, 423–439 (1991).
- 9. Baker, P. J., Ansell, R. J., Dodds, P. A. A., Webber, C. E. & Harris, S. Factors affecting the distribution of small mammals in urban areas. *Mammal Rev.* 33, 95–100 (2003).
- 10. Baker, P. J., Dowding, C. V., Molony, S. E., White, P. C. L. & Harris, S. Activity patterns of urban red foxes (*Vulpes vulpes*) reduce the risk of traffic-induced mortality. *Behav. Ecol.* **35**, 716–724 (2007).
- 11. Bateman, P. W. & Fleming, P. A. Big city life: Carnivores in urban environments. J. Zool. 287, 1-23 (2012).
- 12. Harris, S. Distribution, habitat utilisation and age structure of a suburban fox (*Vulpes vulpes*) population. *Mammal Rev.* **7**, 25–39 (1977).
- Harris, S. & Rayner, J. M. V. Urban fox (Vulpes vulpes) population estimates and habitat requirements in several British cities. J. Anim. Ecol. 55, 575–591 (1986).
- Adkins, C. A. & Stott, P. Home ranges, movements and habitat associations of red foxes *Vulpes vulpes* in suburban Toronto, Ontario, Canada. J. Zool. 244, 335–346 (1998).
- Duduś, L., Zalewski, A., Kozioł, O., Jakubiec, Z. & Król, N. Habitat selection by two predators in an urban area: The stone marten and red fox in Wrocław (SW Poland). *Mamm. Biol.* 79, 71–76 (2014).
- 16. Harris, S. The food of suburban foxes (Vulpes vulpes) with special reference to London. Mammal Rev. 11, 151–168 (1981).
- 17. Doncaster, C. P., Dickman, C. R. & MacDonald, D. W. Feeding ecology of red foxes (*Vulpes vulpes*) in the city of Oxford, England. J. Mammal. **71**, 188–194 (1990).
- Saunders, G., White, P. C. L., Harris, S. & Rayner, J. M. V. Urban foxes (*Vulpes vulpes*)—Food acquisition, time and energy budgeting of a generalized predator. *Symp. Zool. Soc. Lond.* 65, 215–234 (1993).
- Contesse, P., Hegglin, D., Gloor, S., Bontadina, F. & Deplazes, P. The diet of urban foxes (*Vulpes vulpes*) in the city of Zurich, Switzerland. *Mamm. Biol.* 69, 81–95 (2004).
- Harris, S. An estimation of the number of foxes (Vulpes vulpes) in the city of Bristol and some possible factors affecting their distribution. J. Appl. Ecol. 18, 455–465 (1981).
- Marks, C. A. & Bloomfield, T. E. Distribution and density estimates for urban foxes (Vulpes vulpes) in Melbourne: Implications for rabies control. Wildl. Res. 26, 763–775 (1999).
- 22. Gloor, S. The rise of urban foxes (*Vulpes vulpes*) in Switzerland and ecological and parasitological aspects of a population in the recently colonised city of Zurich. Dissertation thesis (University of Zurich, 2002).
- Gosselink, T. E., van Deelen, T. R., Warner, B. E. & Joselyn, M. G. Temporal habitat partitioning and spatial use of coyotes and red foxes in east-central Illinois. J. Wildl. Manag. 55, 433–441 (2003).
- Gosselink, T. E., van Deelen, T. R., Warner, R. E. & Mankin, P. C. Survival and cause-specific mortality of red foxes in agricultural and urban areas of Illinois. J. Wildl. Manag. 7, 1862–1873 (2007).
- Soulsbury, C. D. et al. The impact of sarcoptic mange Sarcoptes scabiei on the British fox Vulpes vulpes population. Mammal Rev. 37, 278–296 (2007).
- 26. Macdonald, D. Running with the Fox (Unwin Hyman, 1987).
- Lewis, J. C., Sallee, K. L. & Golightly, Jr R. T. Introduced red fox in California. http://morro-bay.com/educational/research-reports/red-fox--california-introduced-research-93_10.pdf (1993).
- Plumer, L., Davison, J. & Saarma, U. Rapid urbanization of red foxes in Estonia: Distribution, behaviour, attacks on domestic animals and health-risks related to zoonotic diseases. *PLoS ONE* 9, e115124. https://doi.org/10.1371/journal.pone.0115124 (2014).
- Sogliani, D. & Mori, E. 'The Fox and the Cat': Sometimes they do not agree. *Mamm. Biol.* 95, 150–154 (2019).
 König, A. Fears, attitudes and opinions of suburban residents with regards to their urban foxes. *Eur. J. Wildl. Res.* 54, 101–109
- (2008).
- Kauhala, K., Talvitie, K. & Vuorisalo, T. Encounters between medium-sized carnivores and humans in the city of Turku, SW Finland, with special reference to the red fox. *Mammal Res.* 61, 25–33 (2016).
- 32. Teagle, W. G. The fox in the London suburbs. Lond. Nat. 46, 44-68 (1967).
- 33. Pagh, S. The history of urban foxes in Aarhus and Copenhagen, Denmark. Lutra 51, 51-55 (2008).
- Vuorisalo, T., Talvitie, K., Kauhala, K., Blauerc, A. & Lahtinene, R. Urban red foxes (*Vulpes vulpes L.*) in Finland: A historical perspective. *Landsc. Urban Plan.* 124, 109–117 (2014).
- 35. Seebeck, J. H. Mammals in the Melbourne metropolitan area. Vic. Nat. 94, 165–171 (1977).
- Gloor, S., Bontadina, F., Hegglin, D., Deplazes, P. & Breitenmoser, U. The rise of urban fox populations in Switzerland. *Mamm. Biol.* 66, 155–164 (2001).
- Soulsbury, C. D., Baker, P. J., Iossa, G. & Harris, S. Red foxes (Vulpes vulpes). In Urban Carnivores Ecology, Conflict, and Conservation (eds Gehrt, S. D. et al.) 63–75 (The Johns Hopkins University Press, 2010).
- Chautan, M., Pontier, D. & Artois, M. The role of rabies in recent demographic changes in red fox populations in Europe. Mammalia 46, 391–410 (2000).
- Doncaster, C. P. & MacDonald, D. W. Activity patterns and interactions of red fox (*Vulpes vulpes*) in Oxford city. J. Zool. 241, 73–87 (1997).
- 40. Harris, S. Surveying the urban fox. Biologist 35, 259-264 (1985).
- Uraguchi, K., Yamamura, K. & Saitoh, T. Estimating number of families for an urban fox population by using two public data sets. Popul. Ecol. 51, 1–7 (2009).
- Scott, D. M. et al. A citizen science based survey method for estimating the density of urban carnivores. PLoS ONE 13, e0197445. https://doi.org/10.1371/journal.pone.0197445 (2018).
- Sadlier, L. M. J., Webbon, C. C., Baker, P. J. & Harris, S. Methods of monitoring red foxes Vulpes vulpes and badgers Meles meles: Are field signs the answer?. Mammal Rev. 34, 75–98 (2004).

- 44. Baker, P. J., Harris, S., Robertson, C. P. J., Saunders, G. & White, P. C. L. Is it possible to monitor mammal population changes from counts of road traffic casualties? An analysis using Bristol's red foxes *Vulpes vulpes* as an example. *Mammal Rev.* 34, 115–130 (2004).
- 45. Statistics Poland. Statistical Yearbook of Warsaw (Zakład Wydawnictw Statystycznych, 2019).
- 46. Climate-data.org. https://pl.climate-data.org/europa/polska/masovian-voivodeship/warszawa-4560/ (2020).
- Goszczyński, J. & Romanowski, J. The mammals of the between-floodbanks area of the Middle Vistula Valley. In *The Between Floodbanks Area of the Vistula as an Unique Natural System (Pilica-Narew section)* (eds Matuszkiewicz, J. M. & Roo-Zielińska, E.) 107–117 (Polish Academy of Sciences, 2000).
- 48. Romanowski, J. Vistula River valley as the ecological corridor for mammals. Pol. J. Ecol. 55, 805-819 (2007).
- 49. Romanowski, J., Kowalczyk, K. & Rau, K. Population viability modelling and potential threats to the beaver in the Vistula River valley, Poland. *Ann. Zool. Fenn.* **45**, 323–328 (2008).
- Luniak, M., Kozłowski, P. & Nowicki, W. Magpie *Pica pica* in Warsaw—abundance, distribution and changes in its population. *Acta Ornithol.* 32, 77–86 (1997).
- Gryz, J., Lesiński, G., Krauze-Gryz, D. & Stolarz, P. Woodland reserves within an urban agglomeration as important refuges for small mammals. *Folia For. Pol. Ser. A For.* 59, 3–13 (2017).
- 52. Sison, C. P. & Glaz, J. Simultaneous confidence intervals and sample size determination for multinomial proportions. J. Am. Stat. Assoc. 90, 366–369 (1995).
- 53. Signorell, A. *et al.* DescTools: Tools for descriptive statistics. R package version 0.99. 26. The Comprehensive R Archive Network (2018).
- 54. Wood, S. N. Generalized Additive Models: An Introduction with R (Chapman and Hall/CRC, 2006).
- Wood, S. N. Fast stable restricted maximum likelihood and marginal likelihood estimation of semiparametric generalized linear models: *Estimation of semiparametric generalized linear models. J. R. Stat. Soc. Ser. B Stat. Methodol.* **73**, 3–36 (2011).
 Copernicus, *Mapping Guide for an European Urban Atlas* (European Union, 2018).
- 57. R Core Team. R: A Language and Environment for Statistical Computing (R Foundation for Statistical Computing, 2019).
- 58. ESRI ArcGIS Desktop: Release 10 (Environmental Systems Research Institute, 2011).
- 59. Wałecki, A. Fauna zwierząt ssących Warszawy i jej stosunek do fauny całego kraju in Pamiętnik Fizjograficzny Vol. 1, 268–291 (E. Dziewulski i Br. Znatowicz. 1881).
- Wandeler, P., Funk, S. M., Largiader, C. R., Gloor, S. & Breitenmoster, U. The city-fox phenomenon: Genetic consequences of a recent colonization of urban habitat. *Mol. Ecol.* 12, 647–656 (2003).
- 61. DeCandia, A. L. *et al.* Urban colonization through multiple genetic lenses: The city-fox phenomenon revisited. *Ecol. Evol.* **9**, 2046–2060 (2019).
- 62. Kimmig, S. E. *et al.* Beyond the landscape: Resistance modelling infers physical and behavioural gene flow barriers to a mobile carnivore across a metropolitan area. *Mol. Ecol.* **29**, 466–484 (2020).
- 63. Kato, Y. et al. Population genetic structure of the urban fox in Sapporo, northern Japan. J. Zool. 301, 118-124 (2017).
- Baker, P. J., Dowding, C. V., Molony, S. E., White, P. C. L. & Harris, S. Activity patterns of urban red foxes (*Vulpes vulpes*) reduce the risk of traffic-induced mortality. *Behav. Ecol.* 18, 716–724 (2007).
- Gehrt, S. D. The urban ecosystem. In Urban Carnivores Ecology, Conflict, and Conservation (eds Gehrt, S. D. et al.) 3–11 (The Johns Hopkins University Press, 2010).
- 66. Kolb, H. H. Factors affecting the movements of dog foxes in Edinburgh. J. Appl. Ecol. 21, 161-173 (1984).
- 67. Douglas, I. & Sadler, J. P. Urban wildlife corridors. Conduits for movement or linear habitats? In *The Routledge Handbook of Urban Ecology* (eds Douglas, I. *et al.*) 274–288 (Routledge, 2011).
- Tsukada, H., Morishima, Y., Nonaka, N., Oku, Y. & Kamiya, M. Preliminary study of the role of red foxes in *Echinococcus multi-locularis* transmission in the urban area of Sapporo, Japan. *Parasitology* 120, 423–428 (2000).
- 69. Robinson, N. A. & Marks, C. A. Genetic structure and dispersal of red foxes (*Vulpes vulpes*) in urban Melbourne. *Aust. J. Zool.* **49**, 589–601 (2001).
- Walter, T., Zink, R., Laaha, G., Zaller, J. G. & Heigl, F. Fox sightings in a city are related to certain land use classes and sociodemographics: Results from a citizen science project. *BMC Ecol.* 18, 50. https://doi.org/10.1186/s12898-018-0207-7 (2018).
- Cavallini, P. & Lovari, S. Home range, habitat selection and activity of the red fox in a Mediterranean coastal ecotone. *Acta Theriol.* 39, 279–287 (1994).
- 72. Frey, S. N. & Conover, M. R. Habitat use by meso-predators in a corridor environment. J. Wildl. Manag. 70, 1111–1118 (2006).
- Díaz-Ruíz, F., Caro, J., Delibes-Mateos, M., Arroyo, B. & Ferreras, P. Drivers of red fox (*Vulpes vulpes*) daily activity: Prey availability, human disturbance or habitat structure?. J. Zool. 298, 128–138 (2016).
- 74. Gaffron, P. Urban transport, environmental justice and human daily activity patterns. Transp. Policy 20, 114–127 (2012).
- Fguchi, K. & Nakazano, T. Activity studies of Japanese red foxes, *Vulpes vulpes japonica* Gray. *Jpn. J. Ecol.* **30**, 9–17 (1980).
 Travaini, A., Aldama, J. J., Laffitte, R. & Delibes, M. Home range and activity patterns of red fox *Vulpes vulpes* breeding females.
- Acta Theriol. **38**, 427–434 (1993).
- 77. Cavallini, P. Ranging behaviour of red foxes during the mating and breeding seasons. Ethol. Ecol. Evol. 8, 57-65 (1996).
- Robertson, C. P. J., Baker, P. J. & Harris, S. Ranging behaviour of juvenile red foxes and its implications for management. Acta Theriol. 45, 525-535 (2000).
- 79. Goszczyński, J. Lis. Monografia przyrodniczo-łowiecka (OIKOS Oficyna Wydawnicza, 1995).
- Tolhurst, B. A., Baker, R. J., Cagnacci, F. & Scott, D. M. Spatial aspects of gardens drive ranging in urban foxes (*Vulpes vulpes*): The resource dispersion hypothesis revisited. *Animals* 10, 1167. https://doi.org/10.3390/ani10071167 (2020).
- Hofer, S. et al. High prevalence of Echinococcus multilocularis in urban red foxes (Vulpes vulpes) and voles (Arvicola terrestris) in the city of Zurich, Switzerland. Parasitology 120, 135–142 (2000).
- Jiang, S., Ferreira, Jr J. & Gonzalez, M. C. Discovering urban spatial-temporal structure from human activity patterns. In Proceedings of the ACM SIGKDD International Workshop on Urban Computing (UrbComp '12) (ACM New York, 2012).
- Newman, T. J. *et al.* Changes in red fox habitat preference and rest site fidelity following a disease-induced population decline. *Acta Theriol.* 48, 79–91 (2003).
- Fischer, C., Reperant, L., Weber, J. M., Ochs, H. & Deplazes, P. Relation in the presence of various parasites in the red fox (*Vulpes vulpes*) in Geneva. Swiss Med. Wkly. 133, 61 (2003).
- Deplazes, S., Hegglin, D., Gloor, S. & Romig, T. Wilderness in the city: The urbanization of *Echinococcus multilocularis*. Trends Parasitol. 20, 77–84 (2004).
- Official Website of Republic of Poland. https://www.gov.pl/web/uw-mazowiecki/obszar-zagrozony-wscieklizna-na-terenie-wojew odztwa-mazowieckiego (2021).
- Wilkinson, D. & Smith, G. C. A preliminary survey for changes in urban fox (*Vulpes vulpes*) densities in England and Wales, and implications for rabies control. *Mammal Rev.* 31, 107–110 (2001).
- Baker, P. J., Funk, S. M., Harris, S. & White, P. C. L. Flexible spatial organization of urban foxes, *Vulpes vulpes*, before and during an outbreak of sarcoptic mange. *Anim. Behav.* 59, 127–146 (2000).
- Goszczyński, J. The effect of structural differentation of ecological landscape on the predator-prey interaction. *Treatises Monogr.* 46, 1–80 (1985).

90. Goszczyński, J., Misiorowska, M. & Juszko, S. Changes in the density and spatial distribution of red fox dens and cub numbers in central Poland following rabies vaccination. *Acta Theriol.* **53**, 121–127 (2008).

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Author contributions

J.G., K.J. and D.K.G. designed the study; M.J., J.G., K.J., P.K. and D.K.G. collected the data; M.J., K.J., M.B., L.B. and D.K.G. analysed the data; M.J. and D.K.G. led the writing of the manuscript. All authors read and approved the final manuscript.

Competing interests

The authors declare no competing interests.

Additional information

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