

Climate variability and density-dependent population dynamics: Lessons from a simple High-Arctic ecosystem

Running title: Climate and density-dependent dynamics

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Statement of authorship

DF wrote the first complete draft of the manuscript and conducted CMR analyses; AS collected data in the field, conducted population modelling, and contributed substantially to revisions; NGY, EF and RAI collected data and contributed substantially to revisions.

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Data accessibility

All data used in this work will be deposited in a public repository (i.e. Dryad) upon request or publication.

Abstract

Ecologists are still puzzled by the diverse population dynamics of herbivorous small mammals that range from high-amplitude, multi-annual cycles to stable dynamics. Theory predicts that this diversity results from combinations of climatic seasonality, weather stochasticity and density-dependent food web interactions. The almost ubiquitous 3-5-yr cycles in boreal and arctic climates may theoretically result from bottom-up (plant-herbivore) and top-down (predator-prey) interactions. Assessing empirically the roles of such interactions, and how they are influenced by environmental stochasticity, has been hampered by food web complexity. Here, we take advantage of a uniquely simple High-Arctic food web, which allowed us to analyze dynamics of a

graminivorous vole population not subjected to top-down regulation. This population exhibited high-amplitude, non-cyclic fluctuations - partly driven by weather stochasticity. However, the predominant driver of the dynamics was direct density dependence, which alternated between being weak in summer and strong (overcompensatory) in winter that the population frequently crashed. Model simulations showed that this season-specific density dependence would yield regular 2-year cycles in absence of stochasticity. While such short cycles have not yet been observed in mammals, they are theoretically plausible if graminivorous vole populations are deterministically bottom-up regulated. When incorporating weather stochasticity in the model simulations, cyclicity became disrupted and the amplitude was increased - akin to the observed dynamics. Our findings contrast with the 3-5-yr population cycles involving delayed density dependence that are typical of graminivorous small mammals in more complex food webs, suggesting that top-down regulation is an important component of such dynamics.

Keywords: population fluctuations; tundra ecosystem; trophic interactions; seasonality; top-down regulation; climate change.

Significance (max 120 words)

Whether the renowned population cycles of small mammals in northern food webs are driven by bottom-up (plant-herbivore) or top-down (predator-prey) interactions is still a debated question, but crucial to our understanding of their ecological functions and response to climate change. A long-term study of a graminivorous vole population in an exceptionally simple High-Arctic food web, allowed us to identify which population dynamics features are present when top-down regulation is absent. Unique features were high-amplitude, non-cyclic population fluctuations driven by a combination of stochastic weather events and season-specific direct density dependence likely arising from plant-herbivore interactions. That such features are not present in more complex food webs, points to the importance of top-down regulation in most small mammal populations.

Introduction

Theory suggests that contrasting population dynamics result from details in the pattern of density dependence, including its strength, whether it acts instantly or with a delay, and how it interacts with deterministic (seasonal) and stochastic (weather) components of the prevailing or changing climate (1-5). Studies of small rodents have contributed much to elucidating the different facets of density-dependent and density-independent population dynamics (2, 4). A central topic has been what sort of density dependence yields the high-amplitude, multi-annual population cycles - for which voles and lemmings have become so renowned (6-9). Based on time series analyses, delayed density dependence is considered to be a main determinant of population cycles (see (4, 10) for reviews), although overcompensatory direct density dependence appears to be an alternative in some settings (11). As rodent cycles are most prevalent in northern ecosystems with profound climatic seasonality (6, 7, 12, but see 13, 14), several studies have emphasised

that annual density dependence ought to be decomposed into its seasonal components (15-17) - both to accurately account for the density-dependent structure that underlies the observed dynamics and to identify the season-specific biotic mechanisms that cause density dependence. Considering seasonal dynamics is also crucial to assessing the role of climatic change and weather stochasticity, because both differ between summer and winter (15, 18). The role of climate forcing is now also emphasized by the recent collapses and dampening of population cycles in several ecosystems that appear to be associated with ongoing climate change (15, 19, 20).

Linking density dependence to the biotic mechanisms that causally generate the diversity of population dynamic patterns seen in small mammals, has proved to be challenging. Most rodent populations are imbedded in complex food webs, and hence, simultaneously subjected to a multitude of biotic interactions that could cause the different facets of density-dependent population growth. For instance, delayed and direct density dependence may result from both top-down and bottom-up trophic interactions as well as intrinsic population mechanisms (11, 21, 22). While field experiments have helped pinpointing some mechanisms (23-27), they have been too short-term to be conclusive with respect to what generates different patterns of multi-annual population dynamics.

Here we apply an approach that has proved useful for unravelling the effects of density dependence and weather stochasticity in herbivorous large mammals (e.g. 28-30), namely to target populations that are found in exceptionally simple biotic settings. Hence, our study targets a High-Arctic population of the graminivorous (grass-eating) East European vole (*Microtus levis*) in a food web that lacks significant top-down regulation (i.e. predation). By combining statistical analyses of long-term, high-quality live-trapping data with simulations of a population model parameterized from these data, we (1) identify which features of density dependence (e.g. direct or delayed) and resultant population dynamics (e.g. cyclic or non-cyclic) that emerge in such a simple biotic setting, and (2) assess how climatic seasonality and weather stochasticity impinge on such density-dependent population dynamics. Finally, we point out how the insights from this unique case study shed new light on the longstanding puzzle about what generates population cycles and how ongoing climate change may influence these cycles.

Methods

Study population

Our study was located at Grumant in Svalbard (78.18°N, 15.13°E). This High-Arctic location is characterised by cool summers (July average: 5.9°C) and cold winters (January average -16.2°C) with little precipitation (average 190 mm, period 1960-1990; 31). Average daily air temperatures are typically above 0°C from early-to-mid June – September (data from Longyearbyen airport, ~13 km away from Grumant). Winter temperatures are much more variable than summer temperatures (31, 32). Rain-on-snow (ROS) are relatively frequent stochastically occurring weather events (30) and have been found to strongly influence the population dynamics of all year-round resident vertebrate populations in Svalbard (33).

The East European vole belongs to one of the most speciose and widespread genera (*Microtus*) of small mammals (34). Most *Microtus* species are graminivorous (grass-eating) and have multivoltine life histories (e.g. multiple generation per year). The

East European vole was accidentally introduced to Svalbard in the first half of the 20th century (35). The voles have a highly restricted distribution on the archipelago, associated with seabird fertilized tundra vegetation dominated by graminoids (36).

There are no other small mammals present in Svalbard, which suggests no interspecific competition (37). The Arctic fox (*Vulpes lagopus*) is the only terrestrial predator present, but acts as a generalist carnivore that mostly relies on large colonies of seabirds in the study area (38). Thus, the focal food web lacks the guild of specialist predators consisting of mustelids, owls, hawks and jaegers that are almost omnipresent in the Arctic (12). East European voles reproduce quickly with females observed to be gravid as early as 17 days old (39) and may live at high population densities (>100 ind. ha⁻¹; 37). Many *Microtus* populations have been studied extensively on the European continent where they typically exhibit 3-5-yr multi-annual cycles (11, 13-15).

Live trapping

East European voles were live-trapped during the years 1990-2007. Here, we analysed two data sets. The main data set used for analysis of seasonal density dependence and demography was obtained from one of the largest and lushest vole habitat patches in Svalbard; hereafter termed Core area (Fig. 1). From 1990 to 1996, we used a trapping grid of 93 Ugglan Special multiple-capture traps encompassing 4.5 ha of the Core area, while from 2002-2006 the grid was made of 74 traps and encompassed 2.8 ha. Traps were separated by approximately 20 m and placed by burrow entrances wherever possible. Trapping of the Core area followed the robust design of Pollock (40) and consisted of three primary periods (late June/early July [hereafter termed July] = P1; early August = P2; and early September = P3), each with 6 to 10 secondary periods, except in 1990 when primary periods spanned only the first half of the summer. The primary trapping periods consisted of traps being checked at 13h00 and 19h00 after baiting with oats and potatoes in the morning (07h00, i.e. 2 secondary periods per day). Traps were deactivated during the last trapping period of the day. We used a second, more long-term data set obtained from a linear habitat on a ridge and vegetated part of the ravine at the western edge of the Core area (hereafter termed Ridge; Fig. 1) for assessing the annual population dynamics. The Ridge area was monitored with 30 traps in August during 1991-2007, with the same number of secondary periods as for the Core area. Captured voles were marked by toe clipping, sexed and weighed. The study was conducted according to the regulations for research in Svalbard during the study period.

Density estimation

The densities of the vole population in the Core and Ridge areas were estimated by spatially-explicit capture-recapture (SECR) models with the package *secr* in R (41-43). Briefly, these models have the advantage of estimating capture probabilities based on the distance separating the center of activities of an individual from a trap (43). By using a two-parameter half-normal detection function, we obtained more accurate estimates of the area effectively surveyed (44). For the Core area, we used one null SECR model per trapping period per year with the Huggins parameterisation to estimate density (44). For the Ridge area, annual densities were obtained for the August trapping period only. Densities of male and female adults (body mass ≥ 25 g) and sub-adults (body mass < 25 g; 39) were derived from this general model. Because the movement of voles in Svalbard is

restricted by habitat, we used a 20 m buffer around traps to build the state-space that is used to estimate effective sampling area. The Nelder-Mead algorithm was used for optimisation of the likelihood in model fitting.

Annual density-dependent structure and temporal variability

We used the annual early August SECR density estimates from the Ridge area to assess the density-dependent structure of the population dynamics. We modelled ln-transformed densities from the 18-year time series using a second-order autoregressive model (2, 4). Coefficients obtained from this type of model inform about direct (β_{t-1}) and delayed density dependence (β_{t-2}), and may also be interpreted with respect to the presence of cyclic dynamics and cycle periods (1). We observed zero vole densities in the Ridge area in 1996 and 2002 and the time series was modelled using $\log(D_t + c)$ with $c = 1$. A range of values for c , from $c = 0.2$ to $c = 2$, were investigated, but the choice of c was not found to affect parameter estimates and conclusions substantially. We used the standard deviation of the log10 transformed time series as a metric for the temporal variability (i.e. the amplitude) of the multiannual dynamics (s -index; 45). The s -index has been used both to define cyclic dynamics (index values > 0.5 ; 46) and to compare populations across environmental gradients (47-49).

Seasonal density dependence and climate effects on population growth

We used the following model to explore patterns of variation in population growth in summer and winter in the Core area:

$$X_{t+1} = X_t * e^{r_t * \Delta t} \quad (1)$$

Where X_t is the true population density at time t , r_t is the population growth rate from t to $t+1$ and Δt is the time period from t to $t+1$ (in months). Furthermore, we modelled r_t as a linear function of X_t , weather stochasticity in winter (C_t , i.e. ROS) and residual stochastic variation in r (process error, ε_t):

$$r_t = \beta_0 + \beta_X * X_t + \beta_C * C_t + \varepsilon_t \quad (2)$$

where we assume that process error $\varepsilon_t \sim N(0, \sigma_r^2)$ and $\beta_0, \beta_X, \beta_C$ and σ_r^2 are parameters estimated by the data. Measurement error was included in the model assuming a log normal distribution for the densities estimated using the SERC model, D_t , giving:

$$D_t \sim \text{lnorm}(\log_e(X_t), \sigma_{D,t}^2) \quad (3)$$

The log normal measurement error standard deviations, $\sigma_{D,t}$, were calculated from the estimates of the standard error of D_t ($\text{SE}(D_t)$) obtained in the SECR analysis:

$$\sigma_{D,t} = \log_e((\text{SE}(D_t) / D_t)^2 + 1) \quad (4)$$

The model (equations 1-3) was fitted in JAGS version 4.2.0 (50). Point estimates of r_t and associated 95 % credibility intervals presented in figures were obtained by fitting a model for r_t (equation 2) with time fitted as a factor, i.e. $r_t = \beta_t$. In addition to

parameter estimates and associated 95% credibility intervals we report estimates of Bayesian R^2 for the models (51). The Bayesian R^2 was calculated as the mean of $R_i^2 = \text{var}(\text{fit}_i) / (\text{var}(\text{fit}_i) + \text{var}(\text{residuals}_i))$, where i is the index of draws in MCMC chains, $\text{var}(\text{fit}_i) = \text{var}(\beta_{0,i} + \beta_{X,i} * X_t + \beta_{C,i} * C_t)$ and $\text{var}(\text{residuals}_i) = \sigma_{r,i}^2$.

Analyses of population growth were done separately for the approximately 2.5 month summer period (June/July-September) and for the approximately 9.5 month winter period (September-June/July) as we expected the population dynamics to differ substantially in these two seasons. In the winter we expected the amount of ROS to affect population growth (33, 52).

Summer population growth could be estimated from the change in densities from June/July (t) to August ($t + 1$) and from August ($t + 1$) to September ($t + 2$). Differences between these periods were investigated by fitting period as a factor in the model for population growth (equation 2). Population growth rates were not estimated for the summer of 1996, when there were no voles captured in the study area, and 2002, when there were no voles captured in the first and second primary trapping periods and an estimate of 1 vole per hectare (3 voles caught) in the third primary period. The very low density estimates in September 2002 and the absence of voles in 1996 implied adoption of methodological adjustments, that are detailed in supplementary material, to allow growth rate estimates over the associated winters.

The timing of the primary trapping periods differed somewhat in 1990-1991 from subsequent years. In 1990, all the trapping was early in the season and the time period from primary period 1 to primary period 3 was only 0.7 months. We therefore only used data from primary period 1 and 3 to estimate population growth, to get a time period that was more similar to the other years ($\Delta t = 1.2$ -1.7 months). In 1991 it was only 2 weeks between primary period 1 and 2 and we used only estimates from primary period 2 and 3 in analyses.

Model simulations of multiannual population dynamics

We simulated the annual population dynamics linking summer and winter population growth using:

$$X_{a,t+1} = X_{s,t} * e^{r_{s,t} * \Delta t_s} \quad (5)$$

$$X_{s,t+1} = X_{a,t} * e^{r_{w,t} * \Delta t_w} \quad (6)$$

where $X_{s,t}$ and $X_{a,t}$ is population density in the spring and autumn in year t respectively, $r_{s,t}$ and $r_{w,t}$ are population growth rates (month^{-1}) in summer and winter respectively, and Δt_s and Δt_w are the time periods of the summer and winter seasons respectively ($\Delta t_s + \Delta t_w = 12$).

Using equation (2), $r_{j,t}$ were modelled with parameters estimated from the data (Table 2). Our baseline deterministic model included only density dependence ($r_{j,t} = \beta_{j,0} + \beta_{j,x} * X_{j,t}$) and assumed 3 months of summer and 9 months of winter. The sensitivity of population dynamics to changes in parameter values were evaluated using bifurcation diagrams and analyses of autocorrelation.

Demography

The demographic structure of the population was analysed using SECR based estimates of subadult and adult, male and female vole densities. Recruitment was determined by comparing densities of subadults to adult female densities. We analysed densities of male and female voles within age categories to detect sex differences.

Survival and maturation rates of subadult and adult, male and female voles were estimated using multi-event models implemented in the software E-Surge (53). The summer estimates were obtained for the periods of July-August and August-September. The data did not allow demographic rates to be estimated for the winter period (September-July), because too few individuals captured in year t survived the winter and were recaptured year $t+1$. The maturation rate is the probability of a subadult to develop into the adult stage from one primary period to the next. Survival, maturation and detection probabilities were modelled as functions of covariates using a logit link function. Year, period (July-August vs. August-September) and sex were considered as covariates for all demographic rates. In addition, age (subadults vs. adults) was considered in models for survival and detection rates. Furthermore, we evaluated the effect of vole density, D_t , as an environmental covariate in models of survival and maturation rates. Model selection was based on Akaike information criterion corrected for overdispersion (QAICc; 54) and estimates used in the simulations (see below) were retained from the model judged as the most parsimonious using QAICc.

The effect of density on survival and maturation was first determined by whether the covariate was significant in the most parsimonious, non-temporal model. If yes, we tested if the variance explained by the covariate was significant using ANODEV with M_t being a model with year fitted as a factor, M_c being a model with D_t fitted as a continuous covariate, and M_0 being the model without density or time included as covariates (55).

Results

Annual population dynamics

The 1991-2007 time series of Eastern European vole densities from the Ridge trapping area was characterised by high amplitude population fluctuations with 2 - 4 years between subsequent crash years (Fig. 1). The population dynamics appeared to be stationary; i.e. there was no evidence for temporal trends in mean or variance in densities over the 18 years. The amplitude of the fluctuations (s-index=0.57) was within the range found in population time series of cyclic Arctic lemming populations (49). However, in contrast to most other Arctic populations, first ($r = -0.39$) and second-order ($r = 0.02$) autocorrelation coefficients showed no evidence of cyclic dynamics. A second-order autoregressive model supported direct density dependence ($\beta_{t-1} = -0.46$, 95% confidence interval [CI]: [-0.70, 0.02]), while delayed density dependence was estimated to be close to zero ($\beta_{t-2} = -0.15$, 95% CI: [-0.65, 0.34]). These estimates suggest population dynamics with dampened 2-year cycles (1), and that sustained fluctuations were upheld by high unstructured error variance ($\sigma^2 = 1.3$).

Seasonal density dependence

Population densities in the Core trapping area showed the same annual pattern as densities in the Ridge area (cross-correlation of vole densities with the Ridge trapping area, $r = 0.92$; Fig. 1). Within the summer season, population growth rates were all positive (Fig. 2 and 3a). This suggests that vole population densities remained below

carrying capacity in summer. Still, there was evidence for weak negative density dependence in the population growth rates (Table 1, Fig. 3a).

In contrast, winter population growth rates were negative in many of the years. The negative population growth rates in winter were associated with both high vole densities in the previous autumn and high levels of ROS in the winter (Table 1, Fig. 3b). Overall, the data suggest strong population regulation from direct density dependence in the winter period.

Simulated population dynamics

Simulation of the deterministic version of the seasonal density-dependent model (eq. 2, 5-6) generated stable 2-year vole cycles. These 2-yr cycles were relatively robust to changes in climate severity in winter, in that high ROS must become the norm before we expect a change to stable dynamics with a single equilibrium density (Fig. 4a). The 2-yr cycle in the baseline model was also robust to changes in season lengths as climate change would have to reduce the winter length to well below 8 months for more complex dynamics to appear (Fig. 4b). However, the signal of the 2-yr cycles deteriorated rapidly with increasing levels of stochastic process error (Fig. 4c). At the observed levels of process error, as generated by stochastic variation in winter ROS, the expected second order autocorrelation was close to zero in the model simulations ($r = 0.02$); i.e. similar to what was estimated from the time series data. Finally, temporal variability as quantified by the s-index increased with increasing process error (Fig. 4d).

Demography

Sub-adult male and female voles occurred at similar densities, with no evidence for a systematic deviance from a 1:1 sex ratio (Fig. 5a). In contrast, the sex ratio of adults approached a female-bias of 2:1 at high female densities (Fig. 5b). This pattern was consistent with strong density-dependent regulation of adult male densities in summer, with growth rates close to zero at ~ 14 adult male voles ha^{-1} (Fig. 5c). There was no strong evidence for adult female population growth to be density-dependent in summer ($\beta_D = -0.015$, $\text{CI} = [-0.034, 0.005]$). Recruitment in the population remained also relatively stable across densities (Fig. 5d).

Both survival and maturation rates varied significantly between years as well as among demographic categories (sex and age) and summer periods (Supplementary material, Table S1, Fig. S1) in a manner that contributed to the high process error in summer population growth (Table 1). Survival rates were density-dependent, and stronger in females than in males (Supplementary material, Table S2, Fig. S2), whereas there was no evidence for density dependence in maturation rates (Supplementary material, Table S2, Fig. S3).

Discussion

Without significant top-down regulation from predators or interspecific competition, the focal study system is essentially reduced to a simple two-link food chain consisting of a multivoltine herbivore population and their graminoid food plants in a profoundly seasonal environment. Here we have presented the first empirical analysis of such an ecological system that previously has been subjected to only theoretical investigations.

Such systems have been modelled mechanistically in continuous time to identify under which circumstances multiannual herbivore population cycles can be expected (56, 57). Moreover, theoreticians have thoroughly investigated the dynamical properties of phenomenological discrete-time models with seasonal direct density dependence (58), akin to the model we parameterized here with field data. The core insight from this theory - and indeed also our empirical study - is that the profound seasonality destabilises the dynamics of such simple systems (59). Profound seasonality in terms of a long Arctic winter without primary production implies that the carrying capacity in summer greatly exceeds that of the winter. Such environmental setting combined with a multivoltine life history and rapid population growth in summer allows the herbivore population to overshoot its winter carrying capacity. We provide evidence that such situation prevails in the graminivorous East European voles on Svalbard. Here season-specific, direct density-dependent growth alternated between being weak in summer and so strong (overcompensatory) in winter that the population crashed whenever having attained high densities at the end of the summer.

Interestingly, the continuous-time, plant-herbivore model analysed by Turchin and Batzli (57) with a graminoid-type plant regrowth function, multivoltine herbivore population dynamics and High-Arctic seasonality without stochasticity, generated 2-year cycles similar to our baseline model. However, we are not aware of such short population cycles have ever been reported for any mammal population. Neither are we aware of any other examples of the non-cyclic high-amplitude, high frequency boom-bust vole population dynamics we observed in our High-Arctic study system. In multivoltine rodents, cycle lengths typically vary between 3-5 years in ecosystems with profound seasonality, while populations in environments with less pronounced seasonality have typically non-cyclic low-amplitude fluctuations that often are categorised as stable dynamics (48, 60). It is commonly assumed that cycle generating mechanisms induce delayed density dependence (4, 10, 12, 21), while opinions differ about which mechanisms are in place (61, 62). Seasonality is in itself a source of delay in producer-consumer interactions (56), but is expected to yield at most 2-year cycles. Also, the rapid regrowth of graminoids (57) – even after high vole peak densities and severe winter grazing (63) – prevents longer delays that may generate the longer cycles often found in graminivorous voles. We notice that the lack of evidence for delayed density dependence in our study system may suggest that delays due to intrinsic mechanisms, such as stress-induced maternal effects (64), were of little importance. In fact, the only demographic feature that could be attributed to intrinsic regulation was the adult sex ratio, which became more female biased with increasing population density - as could be expected from the polygynous mating system of graminivorous voles (65). Finally, our study is consistent with the hypothesis that the almost ubiquitous guild of specialist rodent predators in boreal and Arctic food webs normally cause delayed density dependence, in that both the predator guild and delayed density dependence were lacking in our study system (62, 66, 67). Indeed, the unique absence of top-down regulation by specialist predators in High-Arctic Svalbard is the most likely cause of the exceptional vole population dynamics observed. Experimental predator removals (24, 27, 63) have never been conducted at sufficient spatial and temporal scale to investigate whether a similar outcome would appear in other vole populations released from top-down regulation.

A fundamental question in population ecology accentuated by global climate change is how abiotic environmental variation can modify the effect of density-dependent biotic interactions. Our study adds to previous studies showing that episodes of mild winter weather in boreal and Arctic ecosystems may lead to population crashes in herbivores (68-70) and disrupt population cycles (18-20, 71). Previous models have shown that climatically disrupted population cycles in multivoltine rodents readily collapses to low-amplitude fluctuations and hence stable population dynamics in the presence of direct and delayed density dependence (19, 20, 71). Here we have shown that population cycles in a simple trophic system with only direct density dependence, may also be disrupted by increasing weather stochasticity, however, without any dampening effect on the dynamics. Hence, our case study provides support to the general conjecture that the impact of climate change on ecological systems depends on their structure and hence can be expected to be diverse across time and space (18, 19, 29).

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Tables

Table 1. Parameter estimates for the best models for monthly population growth of Eastern European voles (equations 1-5) over winter and in the summer period and estimates of the Bayesian R^2 for the models. No rain-on-snow (ROS) effect was included in the model for summer population growth, giving no estimate of β_{ROS} .

Parameter	Winter		Summer	
	mean	95 % C. I.	mean	95 % C. I.
β_0	0.23	(0.14, 0.33)	0.64	(0.44, 0.83)
β_D	-0.0040	(-0.0058, -0.0024)	-0.0051	(-0.0095, -0.0006)
β_{ROS}	-0.0043	(-0.0074, -0.0014)	-	-
σ_r^2	0.005	(0.001, 0.020)	0.020	(0.005, 0.058)
Bayesian R^2	0.92	(0.73, 0.98)	0.40	(0.02, 0.76)

β_0 = intercept; β_D = coefficient for density at time t ; β_{ROS} = coefficient for effect of ROS; σ_r^2 = process error variance.

Figures

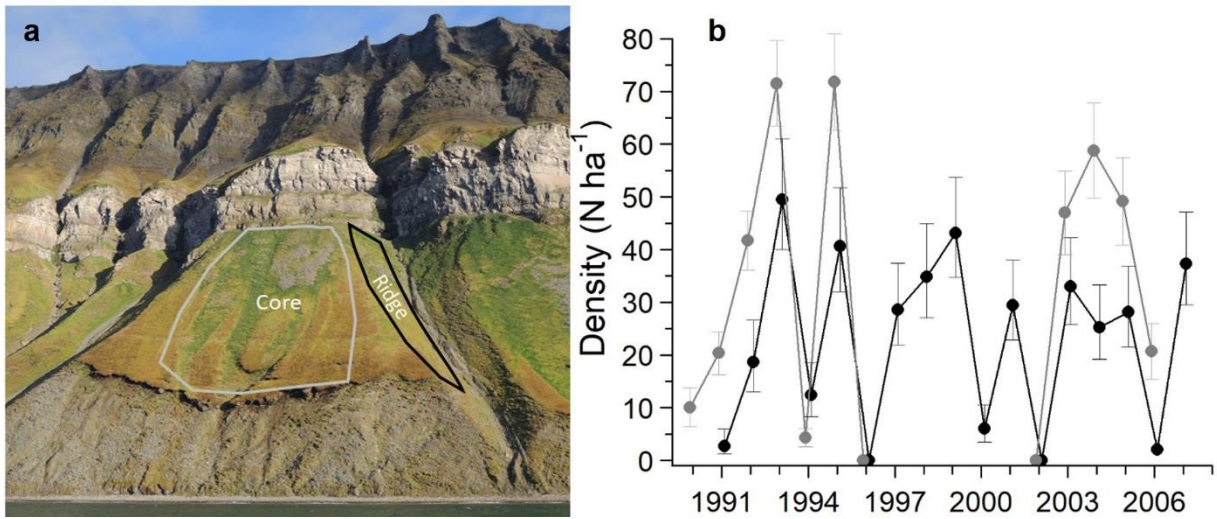


Fig. 1. Picture of the Core and Ridge areas for live-trapping East European voles near Grumantbyen on Svalbard (a) and time series of vole densities (b) estimated in August in the Core area (gray shape, lines points, years 1990-1996 and 2002-2006) and the Ridge area (black shape, lines and points, years 1991-2007). Error bars represent 95% confidence intervals.

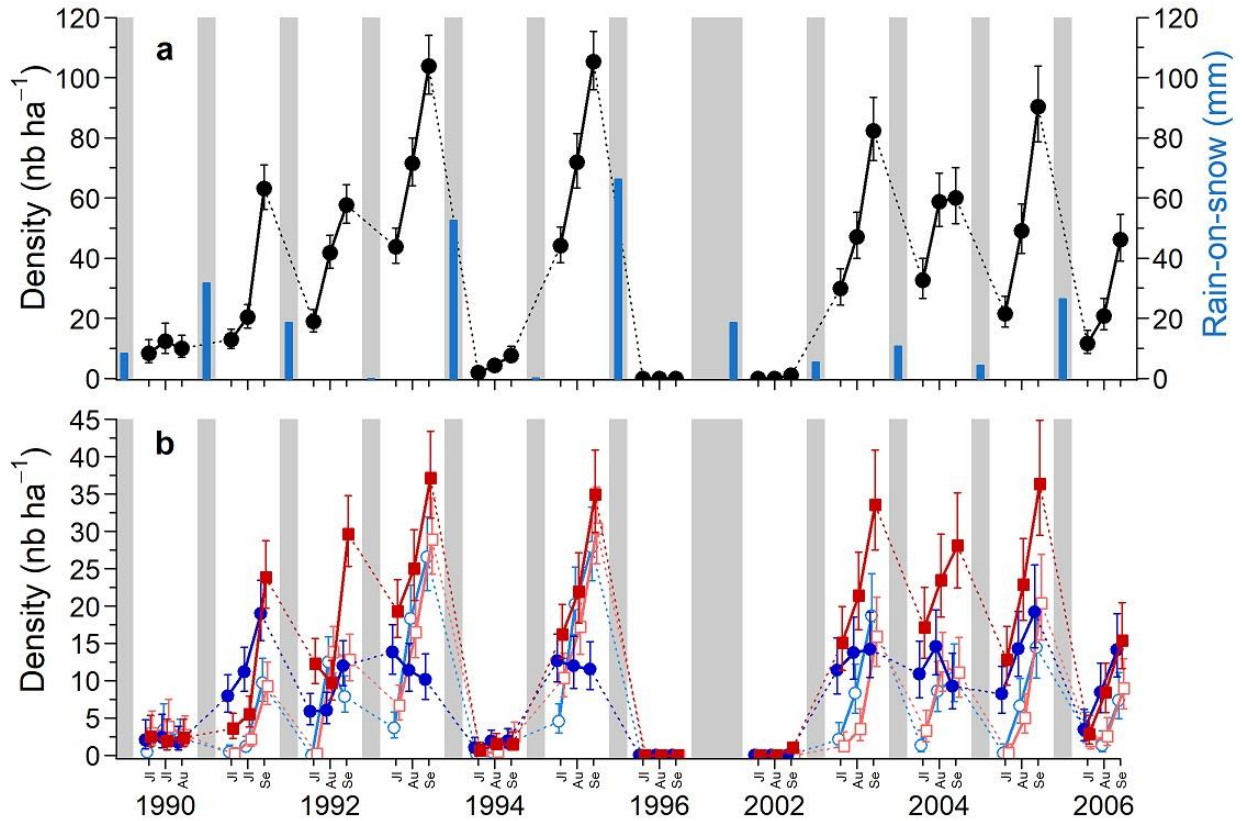


Fig. 2. Population density of the East European vole in the Core area near the Grumant area in Svalbard (lines and points) and precipitation as rain-on-snow during the previous winter (blue bars in **a** only). The total population densities are shown in **a**. In **b**, adult males (solid blue circles and lines), adult females (solid red squares and lines), subadult males (open pale blue circles and lines), and subadult females (open pale red squares and lines) are shown. Densities were obtained using spatially-explicit capture-recapture models with the Huggins parameterisation. Dotted lines indicate change in population size during winter. The thin grey bands indicate winter when trapping was not conducted. The wide grey band between 1996 and 2002 indicate no trapping during that period. Error bars represent 95% confidence intervals. Notice the difference in scale between **a** and **b**. In 1990, trapping periods were in early July, late July, and mid-August. In 1991, trapping periods were early July, late July, and mid-September, whereas for all other years trapping was done in the first part of each month.

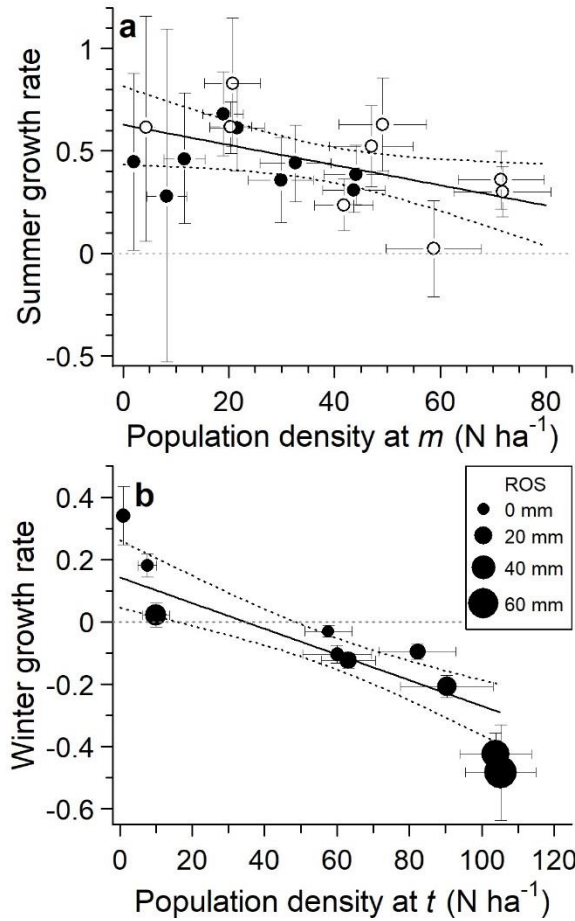


Fig. 3. Estimated monthly population growth rates (r) in summer in relation to population density in month m (a) and monthly winter population growth rate in relation with population density in year t measured in September (b) of East European voles. In a, filled points represent the early summer period (July-August) and open points the late summer period (August-September) each year. In b, the points represent average monthly growth over the period September-July and point size reflect the amount of rain-on-snow (ROS, mm) that fell during the winter. Error bars represent 95% confidence and credibility intervals along respectively the x and y - axis. Parameter estimates for the regression lines (with 95% C.I.) are given in Table 1. Horizontal dotted gray line mark $r = 0$, no change in population size.

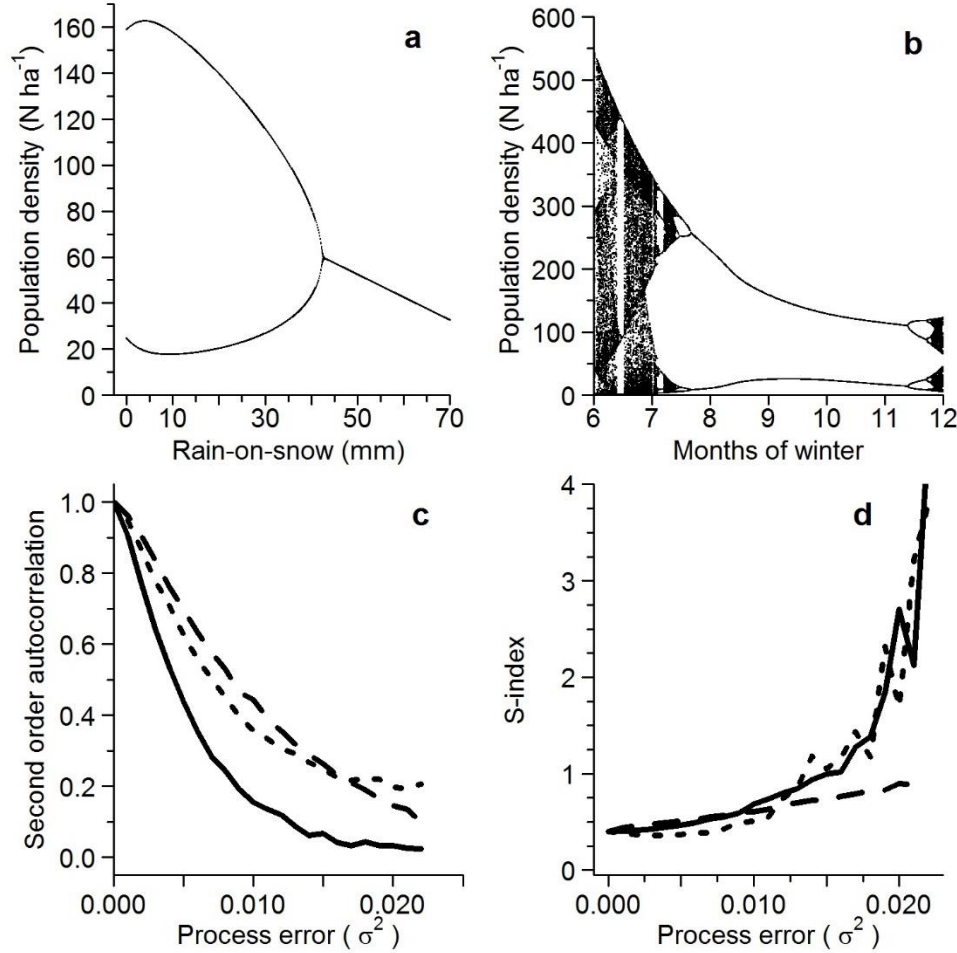


Fig. 4. Simulated population dynamics in the East European vole in Svalbard. **(a)** Bifurcation diagram for autumn densities for increasing fixed amounts of rain-on-snow (ROS) every winter using the population model with no process error ($r_{w,t} = \beta_{w,0} + \beta_{w,X} * X_{w,t} + \beta_{w,ROS} * ROS_t$, parameter estimates in Table 1 but $\sigma_{t,r}^2$ set to zero). **(b)** Bifurcation diagram for the effect of changing the length of the winter season (Δt_w) on autumn densities in the baseline population model with zero ROS and process error (ROS = 0, $\sigma_r^2 = 0$). **(c)** Estimates of the second order autocorrelation and **(d)** the amplitude of fluctuations (s-index) in autumn densities in the baseline population model for increasing values of process error variance (σ_r^2) and ROS = 0. In **c** and **d**, the long dashed line represents a model where process error only affects the summer population growth, the short dashed line a model where process error only affects the winter population growth, and the solid line represents a model where process error affects equally winter and summer population growth. Estimates of process error variance in models without a ROS effects were $\bar{\sigma}_{w,r}^2 = 0.014$ and $\bar{\sigma}_{s,r}^2 = 0.020$ for winter and summer, respectively. Estimated second order autocorrelation in the Ridge area in August was 0.02, while the s-index was 0.57.

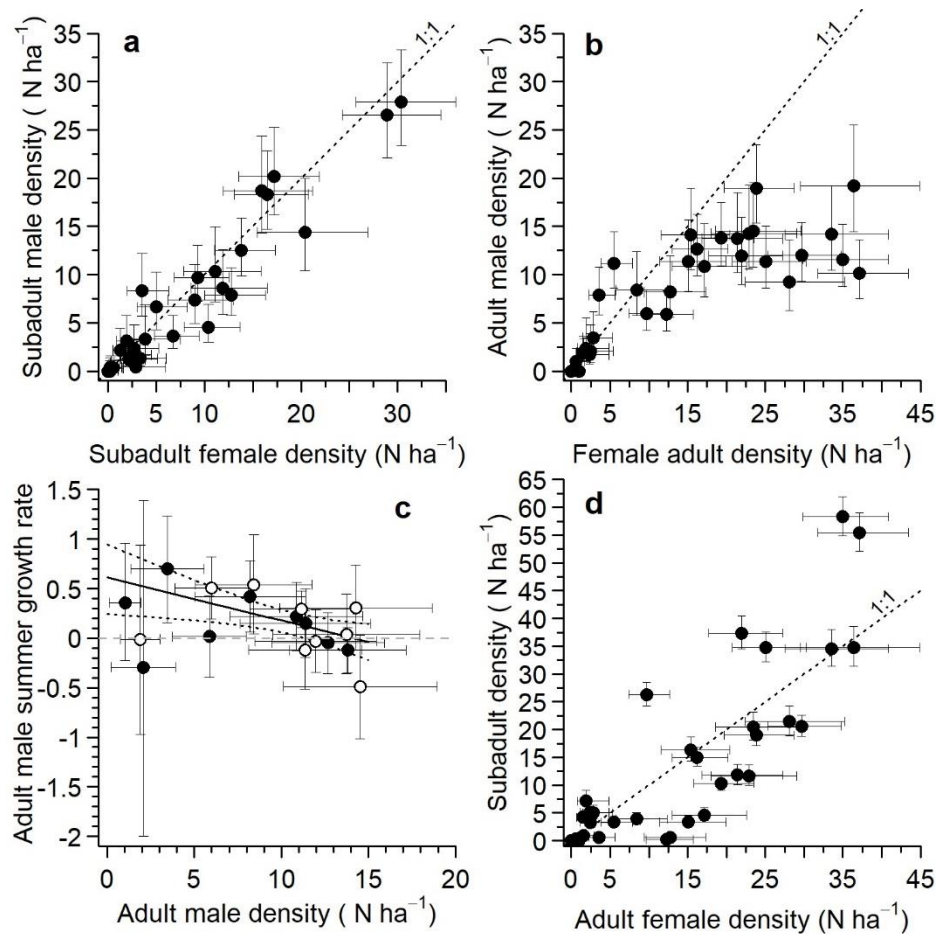


Fig. 5. Demographic structure and density dependence based on sex and body size (i.e. sub-adult vs. adults) of East European voles. Sex ratio displayed as **a** the density of sub-adult males plotted against the density of sub-adult females and as **b** density of adult males plotted against the density of adult females. In **c**, density dependence in adult males in summer displayed as estimated monthly population growth rate (from time t to $t+1$) in adult males plotted against the density of adult males at time t . Estimates from the early (July-August) and late part of the summer (August – September) are given by closed and open circles, respectively. The full line is the regression line estimated using equations (1-5; $\beta_D = -0.043$, $CI = [-0.073, -0.009]$). Black dotted lines are the 95% C.I. for the regression line and the grey dashed horizontal line represents zero population growth. In **d**, recruitment as measured by the density of sub-adults is plotted against the adult female population density. In **a**, **b** and **d**, the 1:1 dotted lines are drawn for visual reference. Bars gives the 95% confidence intervals of estimated densities (**a-d**) and population growth rates (**c**).

Supplementary material

Methodological adjustments adopted to handling low and zero population densities when estimating of population growth

In September 2002 there were only 3 voles caught and the density was estimated to 1 vole per hectare. However, the mark-recapture analysis did not allow measurement error to be estimated for this density estimate. To overcome this problem with a missing value for the uncertainty associated with the density estimator in subsequent analyses we used the empirical least square linear relationship between $\log(D_t)$ and $\log(\text{var}(D_t))$, $\log(\text{var}(D_t)) = -1.5253 - 0.9479 * \log(D_t)$, to estimate $\sigma_{D,t}^2$ for the last observation in 2002.

In June/July 1996, no vole was caught giving an estimate of zero density of voles. No vole was caught in the Core area also in the subsequent trapping periods in 1996, as well as the nearby Ridge area. The most reasonable explanation for the zero observations in 1996 was therefore local extinction in the trapping area, and not that a zero due to measurement error. The previous winter had the highest levels of ROS in the dataset and the population density the previous autumn was also the highest observed, so the handling of the zero observation in 1996 could affect estimates of the effect of density dependence and ROS on winter population growth rates. In our estimation of population growth we imputed a small number for the zero observation in June/July 1996. We evaluated the consequence of different choices for the imputed value by fitting the model (equations 1-3) with imputed values for the density in June/July 1996 in the range $\delta = [0.1, 1]$, where 1 vole per hectare is the lowest positive estimate of the density of voles in the study area. Changes in the imputed value mainly affected estimates of the effect of ROS, with increasingly negative estimates of β_C with decreasing δ (point estimates decreasing from -0.0042 to -0.0052). Estimates of β_X (density dependence) were robust to the choice of δ (point estimate range = (-0.0041, -0.0042)). In the results we use $\delta = 1$. This value of δ gave similar parameter estimates to models fitted to data with the observation from June/July 1996 excluded. However, it is noteworthy that more negative effect sizes of ROS are also consistent with the data.

Detailed results from the survival and maturation analyses

The data supported a model for survival that included an additive effect of year, and an interaction effect between trapping period, age, and sex (Table S1). Apparent survival rates were highest for adult females (~75-85%/month), whereas sub-adult males had the lowest apparent survival rates (~15-65%/month; Fig. S2). Adult females showed no change in survival rates between the early (July-August) and late (August-September) summer periods. For the other demographic groups of voles survival rates were lower in late summer than early summer (Supplementary material, Fig. S1). This period effect in the survival of males and juvenile females, as well as high survival estimates for the years with very low densities (1990 and 1994), was consistent with density-dependent survival density at t and survival between t and $t + 1$ (Fig. S2). The ANODEV confirmed that the survival was negatively affected by density, but this effect was more pronounced in males than females ($\beta = -0.025$, 95% CI = [-0.036, -0.013]; Table S2, Fig. S2).

Maturation rates varied between years and with an interaction effect between trapping period and sex (Table S1, Fig. S1). We found no significant relationship with

density at time t based on the most parsimonious, non-temporal model ($\beta = 0.006$, 95% CI: [-0.011: 0.023]; Table S2; Fig. S3). Both sexes had high maturation rates for the July-August period, with males having a 100% maturation probability in all years in this first part of the summer (Fig. S1). Maturation rates were substantially lower in the latter part of the summer (August-September), and males tended to have lower maturation rates than females in this period (Fig. S1).

Table S1. Ranking of models to test for the effects of time and density on survival (ϕ) and transition (ψ ; maturation) rates of East European voles. The formulae of each model (i) is shown along with its number of parameters (K), ranking parameter ΔQAICc_i , and model weight (w_i). We modelled detection the same way for all models with additive effects of period (t), year, age, and sex. The models that are shown represent those with the highest statistical support ($\Delta\text{QAICc}_i < 2$) for the three hypotheses being tested. Time-dependent models shown are those with a $\Delta\text{QAICc}_i < 4$ and the one ranked right after. For the density dependence analyses, we present the models with the highest support without temporal effects and ΔQAICc_i are calculated based on the top time-dependent model.

Type	Model		K_i	ΔQAICc_i
	ϕ	ψ		
Time-dependent	year+t.f.sex	year+t.sex	44	0.00
	year+t.sex+f.sex	year+t.sex	42	4.05
Density-dependent survival	D.sex+f.sex	year+t.sex	33	9.87
	D.f.sex+f.sex	year+t.sex	35	10.86
	D+sex	year+t.sex	32	11.22
Density-dependent maturation	year+t.f.sex	D+sex	34	58.54
	year+t.f.sex	D.sex+sex	35	59.08

Note: covariates on detection probabilities were the same for all models and included additive effects of year, primary period, state (subadults, adults), and sex. t = primary period (July-August, August-September); D = relative density (low, intermediate, high); f = state; + = additive effect; . = interactive effect.

Table S2. Analysis of deviance (ANODEV) for models without temporal effects to assess density dependence in survival (ϕ) and maturation (ψ) of East European voles.

Model				
Response variable	ϕ	ψ	<i>F</i> -value	<i>p</i> -value
Survival	D.sex+f.sex	year+t.sex	3.299	0.043
Maturation	year+t.f.sex	D+sex	6.109	0.018

Note: Model comparisons for the ANODEV were based on the full time-dependent model ($\phi \sim \text{year} + \text{t.f.sex}$, $\psi \sim \text{year} + \text{t.sex}$, $p \sim \text{year} + \text{t.f} + \text{sex}$; $K = 44$) and the simplified model without time or density as a covariate on survival ($\phi \sim \text{f.sex}$, $\psi \sim \text{year} + \text{t.sex}$, $p \sim \text{year} + \text{t.f} + \text{sex}$; $K = 31$) or maturation ($\phi \sim \text{year} + \text{t.f.sex}$, $\psi \sim \text{sex}$, $p \sim \text{year} + \text{t.f} + \text{sex}$; $K = 33$).

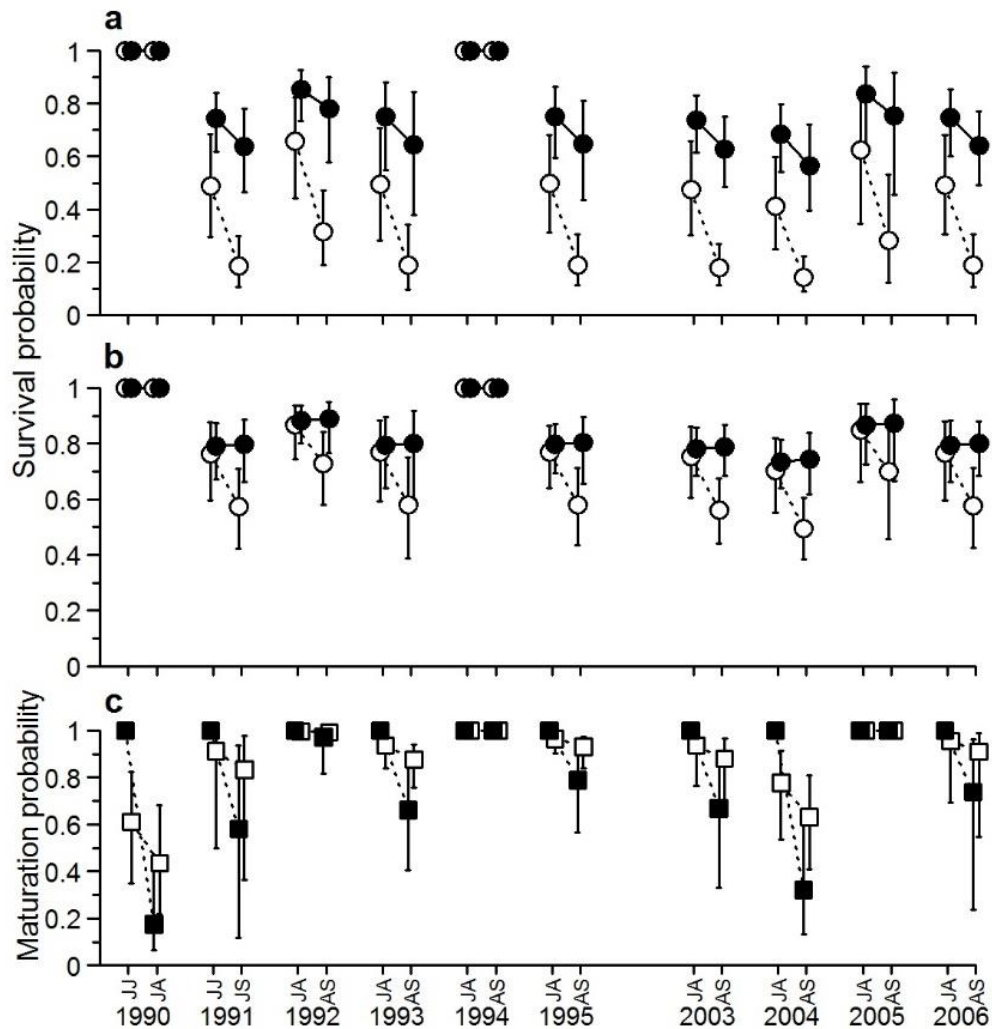


Fig. S1. Summer survival estimates of adult (black circles) and sub-adult (white circles) male (a) and female (b) East European voles and maturation probabilities (c) of sub-adult males (white squares) and females (black squares) throughout the years of sampling. Data points are slightly displaced on the x-axis to make confidence intervals more visible. The gap between 1995 and 2003 indicate no data available for summers of 1996-2002 due to sample size being too low or trapping occurred only in August. Error bars are 95% confidence intervals. JJ: early July to late July; JA: late July (1990 only) or mid-July (all other years) to mid-August; JS: late July to mid-September; AS: mid-August to mid-September.

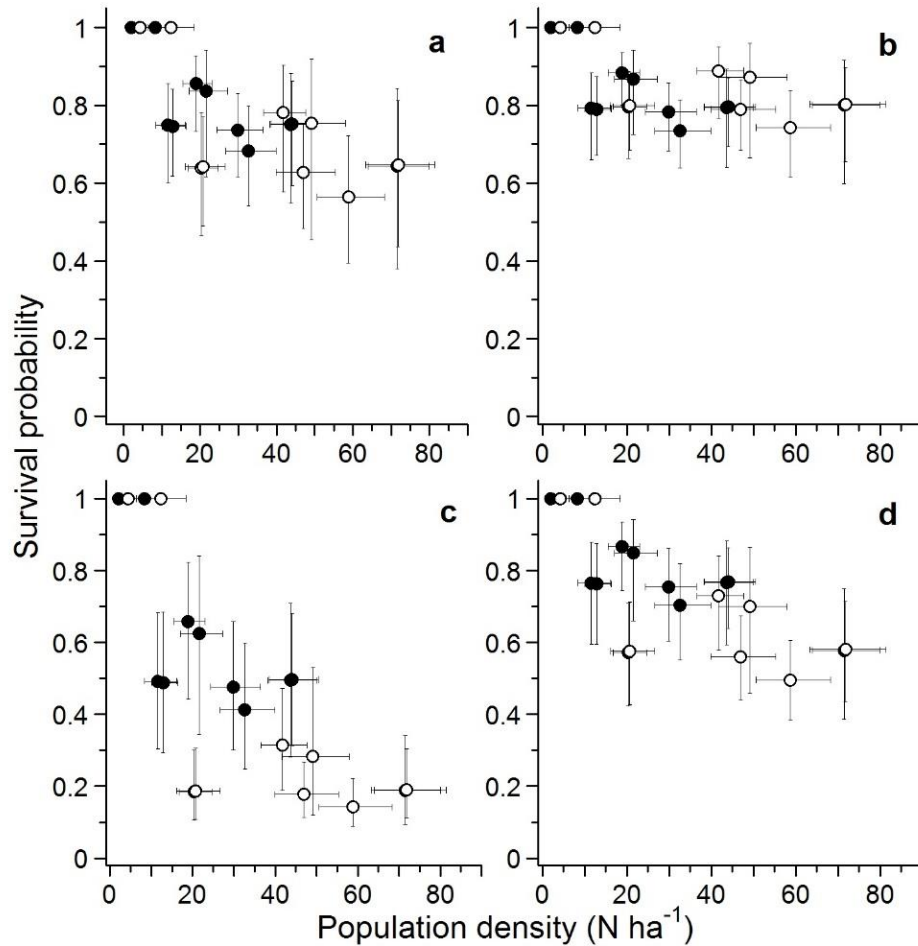


Fig. S2. Estimates of survival rates in East European voles between t and $t+1$ of adult males (a), adult females (b), subadult males (c), and subadult females (d) in relation with population density at t from the most parsimonious model (Table S1, time-dependent model $\varphi = f(\text{year} + t.f.\text{sex})$). Filled points represent the period of July-August and open points the August-September period, error bars represent 95% confidence intervals.

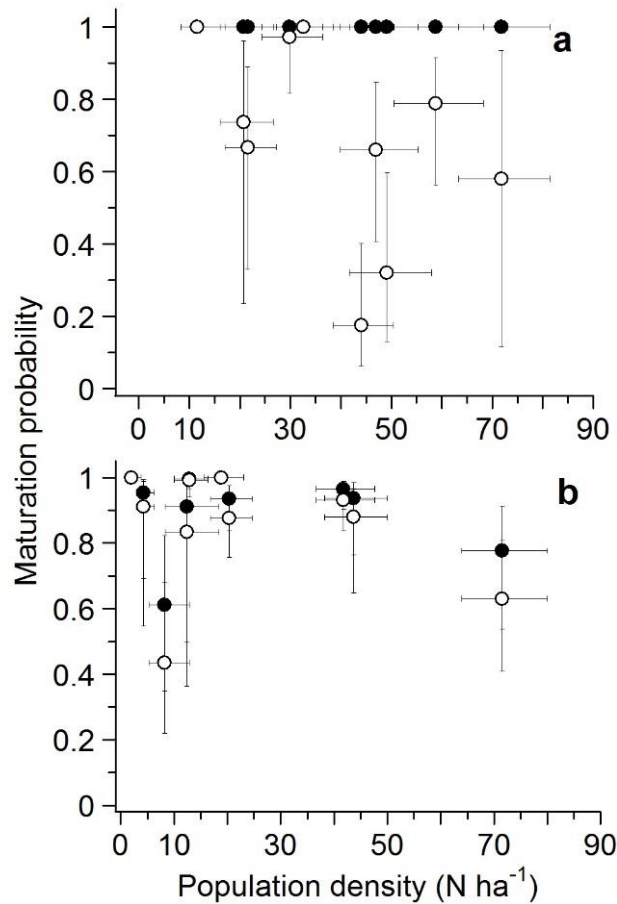


Fig. S3. Estimates of maturation rates in East European voles for subadult males (**a**) and females (**b**) from a model with an additive effect of year, and an interaction effect between live-trapping period and sex ($\psi = f(\text{year} + t.\text{sex})$, Table 1). Filled points represent the period of July-August and open points the August-September period, error bars represent 95% confidence intervals. Correlation coefficients are given using all the data points (r.all) and excluding the estimates of $\psi = 1$ (r.sub).