ORIGINAL ARTICLE



# Theoretical insight into three disease-related benefits of migration

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Received: 24 December 2014/Accepted: 25 September 2015/Published online: 12 October 2015 © The Society of Population Ecology and Springer Japan 2015

Abstract Migration (seasonal round-trip movement across relatively large distances) is common within the animal kingdom. This behaviour often incurs extreme costs in terms of time, energy, and/or survival. Climate, food, predation, and breeding are typically suggested as factors favouring the evolution of migration. Although disease regulation has also been considered, few studies consider it as the primary selective pressure for migration. Our aim was to determine, theoretically, under what conditions migration could reduce the long-term disease prevalence within a population, assuming the only benefits of migration are infection-related. We created two mathematical models, one where the population migrates annually and one where the entire population remains on the breeding ground year-round. In each we simulated disease transmission (frequency-dependent and density-dependent) and quantified eventual disease prevalence. In the migration model we varied the time spent migrating, disease-related migration mortality, and the overall migration mortality. When we compared results from the two models, we found that migration generally lowered disease prevalence. We found a population was healthier if it: (1) spent more time

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<sup>2</sup> Department of Ecology, Evolution, and Behavior, University of Minnesota, Saint Paul, MN 55108, USA migrating (assuming no disease transmission during migration), (2) had higher disease-induced migration mortality, and (3) had an overall higher mortality when migrating (compared to not migrating). These results provide support for two previously proposed mechanisms by which migration can reduce disease prevalence (migratory escape and migratory cull), and also demonstrate that nonselective mortality during migration is a third mechanism. Our findings indicate that migration may be evolutionarily advantageous even if the only migratory benefit is disease control.

**Keywords** Annual migration · Density-dependent transmission · Disease control · Frequency-dependent transmission · Mathematical model · Migratory cull · Movement ecology

# Introduction

Migration is a behaviour that has evolved across a broad range of taxonomic groups (Alerstam et al. 2003; McGuire and Fraser 2014). Migration is characterised as an animal's persistent movement between two or more habitats (Dingle 1996) and typically involves high energetic demands and extreme physiological changes (Lidicker and Caldwell 1982; Altizer et al. 2011). Migration can occur in numerous ways from long-range to-and-fro seasonal migration, as seen in the finetooth shark, *Carcharhinus isodon* (Castro 1983), to single oneway migration, as shown by the North American tumbleweed (Dingle 1996). In order to evolve such a complex and costly behaviour, migration must be highly beneficial. Many people have theorised about the exact nature of these benefits. The three main hypothesised benefits are increased food quality, finding mates or breeding sites, and avoiding the energetic costs associated with seasonally harsh climate or predation (Heape 1931; Aidley 1981; Avgar et al. 2014). Although reducing the energetic costs associated with parasites and pathogens is sometimes mentioned as a benefit of migration (e.g., Avgar et al. 2014), it is rarely studied as a primary factor driving migration (but see Poulin et al. 2012).

Many unfavourable diseases infect species that go through annual migration (Table 2 in Altizer et al. 2011), and it is clear that migration and infection could potentially interact in a number of ways. As individuals migrate, they can transfer pathogens to new areas (Reed et al. 2003). Infection by pathogens can also interfere with an individual's ability to successfully migrate (van Gils et al. 2007). Furthermore, studies have shown that in some species migrants have a higher level of infection than residents (van Dijk et al. 2014) while in other species the reverse is true: migrants have a lower level of infection than residents (Folstad et al. 1991).

Three mechanisms have been proposed to explain how migration can reduce infection: migratory escape (Loehle 1995), migratory allopatry (Krkošek et al. 2007), and migratory cull (Bradley and Altizer 2005). Migratory escape occurs when individuals temporarily leave a highly infectious environment via migration. Pathogens that rely on hosts being present decline in number, resulting in lower virulence upon the individuals' return to the environment. Similarly, migratory allopatry occurs when susceptible juveniles are physically separated from infectious adults (Krkošek et al. 2007). Migratory cull, on the other hand, occurs when infected individuals are not as capable of surviving migration, and thus reduce the prevalence of a disease within a population. Some studies have suggested that this process of natural selection against the infected leads to stronger immunity in migratory populations (Møller and Erritzøe 1998).

Although there is strong empirical support for each of these mechanisms, directly quantifying the disease control benefits of migration is difficult since migration can be driven by multiple covarying factors (e.g., disease and climate). However, such quantifications can be possible in theoretical studies of migration and disease. Hall et al. (2014) created a model to examine the interaction between disease transmission and seasonal migration, using life history assumptions typical of migratory Neotropical passerine species. Individuals in their theoretical population either remained at the breeding ground year-round or migrated to a wintering ground. They found that more extreme migration lowered disease prevalence (travelling longer distances and departing earlier from the infected breeding ground) and suggested that migration could therefore be adaptive for pathogen avoidance.

Here we develop a model for migration and disease that is similar to the approach in Hall et al. (2014), but with two key differences. First, we assume that the only benefits of migration are related to infection. In contrast, Hall et al. (2014) also assume seasonality in survival that differs between the breeding and non-breeding grounds. Second, we compare the infection prevalence in migratory and nonmigratory populations, whereas Hall et al. (2014) compare the infection prevalence across different types of migratory populations. These two differences enable us to determine conservatively whether migration can minimise disease prevalence (maximise population health) if disease control is the only benefit to migration. We develop a pair of theoretical models and use them to compare disease prevalence with and without migration, considering both frequency-dependent and density-dependent disease transmission. We find that migration generally lowered disease prevalence and we demonstrate three mechanisms by which this occurs. Our findings suggest that disease control by itself could be a selective pressure for migration.

## Methods

Here we model disease prevalence in a population of individuals that annually migrate between two areas: one where breeding occurs and a second, non-breeding, area. For simplicity we refer to the second as the 'wintering grounds', even though we do not assume seasonality in survival. We separate the year into four discrete time periods: breeding, migration, wintering, and return migration (Fig. 1). For comparison, we also consider a non-migratory population that spends the entire year on the breeding ground.

## Breeding and wintering grounds

We assume disease transmission occurs primarily in the breeding and wintering grounds. To model disease transmission between individuals, we employ a standard SI disease model, and we considered both frequency-dependent disease transmission

$$\frac{\mathrm{d}S}{\mathrm{d}t} = \frac{-\beta' SI}{S+I} + \gamma I - \mu_{\mathrm{S}}S \tag{1a}$$

$$\frac{\mathrm{d}I}{\mathrm{d}t} = \frac{\beta' SI}{S+I} - \gamma I - \mu_{\mathrm{I}} S \tag{1b}$$

as well as density-dependent disease transmission

$$\frac{\mathrm{d}S}{\mathrm{d}t} = -\beta SI + \gamma I - \mu_{\mathrm{S}}S \tag{2a}$$

$$\frac{\mathrm{d}I}{\mathrm{d}t} = \beta SI - \gamma I - \mu_{\mathrm{I}}S \tag{2b}$$



**Fig. 1** Schematic of the model's annual cycle showing susceptible (*S*) and infected (*I*) individuals during the breeding, migration, wintering, and return migration time periods. Disease transmission ( $\beta$ ) and recovery ( $\gamma$ ) occur primarily on the breeding and wintering grounds. The mortality of susceptible and infected individuals are given by  $\mu_{\rm S}$  and  $\mu_{\rm I}$  (occurring continuously during the breeding and wintering seasons) and  $1 - \sigma_{\rm S}$  and  $1 - \sigma_{\rm I}$  (occurring once during each migration). The number of new offspring is given by *b* 

(for a full list of parameters and variable with their definitions and values see Table 1).

This splits the population into two groups: susceptible (S), healthy individuals, and infectious (I), individuals who

have become infected by a disease. The rates at which individuals move between susceptible and infected classes depend both on how infectious the disease is ( $\beta'$  and  $\beta$ ) and how fast infected individuals recover ( $\gamma$ ). We also assume that there is a constant disease-independent mortality rate, which is higher for infected individuals ( $\mu_I$ ) than susceptible ones ( $\mu_S$ ). Extra disease-related mortality occurs when there is the additional stress of migration (see below).

#### Migration

For simplicity, we assume that essentially no disease transmission occurs during migration. Each individual undertaking migration survives with probability  $\sigma$ , the likelihood of it reaching its destination. Since migration is typically quite costly, we assume that mortality during the migration period (length  $t_{\rm M}$ ) is higher for a migrating individual than for one remaining on the breeding ground  $(1 - \sigma > e^{-\mu t_{\rm M}})$ .

To test the impact of migratory cull on disease prevalence, we varied the disease-related mortality cost (c) of having the disease. The survival of infected individuals ( $\sigma_{I}$ ) is given by

$$\sigma_{\rm I} = (1 - c)\sigma_{\rm S} \tag{3}$$

where  $\sigma_{\rm S}$  is the survival of healthy individuals. If there is no cost to the disease during migration, then c = 0 and healthy and infected individuals have equal survival probability during migration ( $\sigma_{\rm S} = \sigma_{\rm I}$ ). However, if there is

Parameter	Definition	Values in Fig. 2	Values in Figs. 3, 4, 5
$P_0$	Initial population size	1000	1000
$S_0$	Initial number of susceptible individuals	900	900
$I_0$	Initial number of infectious individuals	100	100
$\beta'$	Rate of frequency-dependent infection	0.01, 0.03, 0.05	0.01, 0.02, 0.03, 0.05
β	Rate of density-dependent infection	NA	0.00001, 0.00002, 0.00003, 0.00005
γ	Rate of disease recovery	$\gamma = \beta'/2$	$\gamma = \beta'/2; \ \gamma = \beta/2$
$\mu_{\rm S}$	Susceptible mortality (per day)	0.0005 (20 % per year)	0.0005 (20 % per year)
$\mu_{\mathrm{I}}$	Infectious mortality (per day)	0.0007 (25 % per year)	0.0007 (25 % per year)
С	Disease-related migration mortality cost	0.3	Varied from 0 to 1
$\sigma_{ m S}$	Chance of susceptible surviving migration	0.7	Varied from 0.5 to 1.0
$\sigma_{\mathrm{I}}$	Chance of infected surviving migration	0.49	$\sigma_{\rm I} = (1 - c) \sigma_{\rm S}$
Κ	Carrying capacity	1500	1500
r	Newborns per individual	2.5	2.5
b	Births per year	$r(S+I)\left(1-\frac{S+I}{K}\right)$	$r(S+I)\left(1-\frac{S+I}{K}\right)$
$t_{\rm B}$	Time spent in breeding ground (days)	115	115
$t_{M1}$	Time spent migrating to wintering ground (days)	61	Varied from 0-60
$t_{\rm W}$	Time spent in wintering ground (days)	136	$365 - (t_{\rm B} + t_{\rm M1} + t_{\rm M2})$
$t_{M2}$	Time spent migrating to breeding ground (days)	53	Varied from 0 to 60

Table 1 Table of all parameters and variables used in the model, a brief description of each and their assigned values, if given ones

The migratory times were based on the yellow warbler, a well-studied migratory bird from North America



Fig. 2 Simulation of disease dynamics over time, showing the difference between one and multiple years as well as migratory versus non-migratory populations and different transmission rates,  $\beta'$ . The *solid lines* indicate the number of susceptible individuals (*S*), the

dashed lines indicate the number of infected individuals (I), and grey bars indicate time periods spend migrating (no transmission). All simulations were run with disease-related migration mortality cost c = 0.3

a cost  $(0 < c \le 1)$  then infected individuals have lower survival than healthy ones. Clearly this cull would initially reduce the number of infected individuals, but it is unclear if the disease would be restored to its previous level after migration ends and transmission resumes.

## One year in the life

To create a basic annual structure, we used data from *Se*tophaga coronata, the Yellow-Rumped Warbler, a wellstudied migratory bird of the Americas. Note, however, that our model framework is not constrained to this species or even just to birds—it is general enough to be broadly applicable to migratory species across taxonomic groups. The Yellow-Rumped Warbler spends about 115 days on its breeding ground, 61 days migrating in the fall, 136 days on its wintering ground, and 53 days migrating in the spring (Burton 1992).

Each simulation was run as follows. The population is initialised with 10 % infected individuals ( $I_0 = 100$ ,  $S_0 = 900$ ). For the next  $t_B$  days the population is on the breeding ground and experiences continuous disease transmission. At the end of this period the population migrates for  $t_M$  days. We varied the relative disease-related mortality cost between susceptible and infectious individuals in order to quantify the effect of a migratory cull on the population.

Once the population arrives at the wintering grounds, disease transmission resumes. They remain here for  $t_W$  days ( $t_B + 2t_M + t_W = 365$ ) and then spend  $t_M$  days migrating back to their breeding ground. The population reproduces instantaneously at the beginning of the breeding

time period. We assume reproduction is density-dependent, with the number of newborns given by

$$b = r(S+I)\left(1 - \frac{S+I}{K}\right) \tag{4}$$

where r is the potential number of offspring an individual can have and K is the carrying capacity of the environment (the maximum number of individuals the environment can sustain). We assume that all newborns enter the susceptible category (there is no vertical transmission of the disease between parents and offspring).

For short-term dynamics, we report the disease prevalence (fraction of individuals that are infected) over time. For long-term dynamics, we focus on the disease prevalence immediately before reproduction at the start of the year. We ran each simulation for 100 years, until the disease prevalence at this point in the annual cycle did not change from year to year. We refer to this steady-state disease prevalence value as the 'eventual disease prevalence' for the population.

We fixed the ratio of transmission to recovery rates ( $\beta'$ /  $\gamma = 2$  and  $\beta/\gamma = 2$ ) but varied transmission rate for each frequency-dependent transmission ( $\beta' = 0.01, 0.02, 0.03,$ and 0.05) and density-dependent transmission  $(\beta = 0.00001, 0.00002, 0.00003, and 0.00005)$ , as well as disease-related mortality cost during migration  $(0 \le c \le 1)$ . For comparison, we also ran an additional model where the population does not migrate. This model is simply the SI models (1) and (2) run throughout the entire year with births at the beginning of the year. We compared the eventual disease prevalence to determine how parameter values impacted the disease prevalence.

# **Results**

#### Within year dynamics

Throughout the breeding period, the number of susceptible individuals decreased and the number of infected individuals increased (Fig. 2a–f). The rate at which this happened was affected by the value of  $\beta'$ , which represents the infectivity of the disease. When  $\beta'$  was large (Fig. 2c, f), the disease spread quickly and the population rapidly reached a steady state. In contrast, in simulations with a smaller  $\beta'$ , disease spread slowly and the population typically did not reach the steady state before migration (Fig. 2a, d). If the steady state was not reached prior to migration, then the 'migratory cull' (increased mortality during migration) had the greatest impact, as the disease was still at relatively low levels in the population. This means that for a disease with a small  $\beta'$ , at the beginning of the migration there will be fewer infected individuals and



Fig. 3 Effect of disease mortality during migration. Eventual disease prevalence within the population as a function of disease-related migration mortality cost (c) for different transmission rates, for a frequency-dependent and b density-dependent transmission. As the disease becomes more costly, infected individuals are less likely to survive migration. Over multiple years this migratory cull increases the proportion of susceptibles within the population thus reducing eventual disease prevalence

thus the potential for the cull to 'nip the disease in the bud'. Generally, the smaller the  $\beta'$  value, the lower the disease prevalence at the end of the year. The results were qualitatively the same for density-dependent transmission (not shown).

#### Across year dynamics

As with the single year example,  $\beta'$  changed the eventual (long-term) disease prevalence when the model was run over multiple years (Fig. 2g–1). A disease within a resident (non-migrating) population eventually had a 50 % prevalence (Fig. 2j–1) whereas the migrating population had





a Frequency-dependent transmission

**Fig. 4** Effect of non-transmission period. Eventual disease prevalence in the population as a function of time (in days) spent migrating  $(t_M)$  for different transmission rates, for **a** frequency-dependent and **b** density-dependent transmission. The more time spent migrating the fewer infected individuals in the population. Here, there is no cost to having the disease during migration (c = 0). Even when migration takes no time there is still less infected individuals than in a non-migrating population

much lower disease prevalence (Fig. 2g–i). For small  $\beta'$ , the disease eventually disappeared (Fig. 2g). We attributed this difference in disease prevalence to three factors that are present in the migration model but not in the resident model.

First, when there was a mortality cost to having the disease during migration (c > 0), disease prevalence was lower after the migratory cull in any given year. This resulted in a higher proportion of healthy individuals in the long-term. These results hold across multiple transmission rates which all showed a decrease in disease prevalence when the cost is increased, for both frequency-dependent (Fig. 3a) and density-dependent (Fig. 3b) transmission. The sharpest decline of infection was seen in the models

**Fig. 5** Effect of total migration mortality. Eventual disease prevalence after an instantaneous population decline  $(t_{\rm M} = 0)$  as a function of mortality probability during migration  $(1 - \sigma_{\rm S})$ , where c = 0 so  $\sigma = \sigma_{\rm I} = \sigma_{\rm S}$  for different transmission rates, for **a** frequency-dependent and **b** density-dependent transmission. Here in the extreme case  $(1 - \sigma = 0)$ , the eventual disease prevalence is the same for a migrating and non-migrating population

with lower frequency-dependent transmission rates. The proportion of infected individuals was generally higher under density-dependent transmission than under frequency-dependent transmission, especially for low diseaserelated mortality.

Second, the migrating population in our model experienced a time of no transmission (since we assumed no transmission during migration) which overall reduced disease prevalence. We varied the time that migration takes ( $t_{\rm M}$ ) and found that the more time spent migrating the lower the disease prevalence in the population (Fig. 4). This effect was much stronger for frequency-dependent transmission than for density-dependent transmission. In simulations with no migration, the proportion of infected individuals was approximately 0.5 when  $\beta'$  was large (0.02, 0.03, and 0.05) and 0.47 when  $\beta'$  was 0.01 (for frequencydependent transmission) and the proportion of infected individuals was approximately 1.0 when  $\beta$  was large (0.00002, 0.00003, and 0.00005) and 0.96 when  $\beta$  was 0.00001 (for density-dependent transmission). Therefore, even for no time spent migrating ( $t_{\rm M} = 0$ ), the disease prevalence was still higher in migration simulations than in the non-migrating ones.

Third, any degree of mortality during migration (regardless of infection) led to a long-term reduction in disease prevalence. To separate out this third factor, we ran a set of simulations where there was no disease-related migration mortality cost (c = 0) and no time spent migrating ( $t_M = 0$ ). Here, we found that the higher the total migration mortality, the lower the proportion of infected individuals (Fig. 5). The change in infection prevalence with increasing mortality was much more drastic for density-dependent transmission (Fig. 5b) than for frequencydependent transmission (Fig. 5a). The long-term disease prevalence was reduced even though the fraction of individuals dying during migration was the same for both susceptible and infected.

## Discussion

Consistent with prior theoretical and empirical work, here we show that migration can benefit host populations by lowering disease prevalence. The novelty of our results comes from the fact that, in contrast to previous theoretical work, we have constructed a model where the only benefits of migration are lowered disease prevalence (e.g., no increased survival). We demonstrate that migration could indeed lower disease prevalence in a population, by acting through three mechanisms.

First, if infected individuals have lower survival during migration than healthy individuals do, disease prevalence is lower. Although a higher mortality of diseased individuals intuitively lowers disease prevalence in the short term, the long-term outcomes are less obvious. We found that when the infection rate is high, the disease prevalence quickly increases again after migration. In contrast, we show that when the infection rate is low, disease prevalence does not increase to the same level that was present prior to migration and, in the extreme, eventually dies out. As a result, migratory populations have lower disease prevalence than resident populations (an example of migratory cull; Bradley and Altizer 2005). The validity of a disease cull is supported by empirical evidence that migratory birds infected with low-pathogenic avian influenza (LPAI) can have deteriorated body condition (Latorre-Margalef et al. 2009), or travel shorter distances during migration (van Gils et al. 2007) compared to uninfected migrants. When the immune response is triggered it leads to a decrease in body condition (Nebel et al. 2012) thus reducing an individual's chance of surviving migration. The same physiological impact can also be seen in individuals carrying parasites (Wagner et al. 2003; Bradley and Altizer 2005). As long as the parasite's life cycle does not change the transmission dynamics, our model also applies to microparasite infection.

Second, when there is more time spent migrating, there is less time at the wintering and breeding grounds, where disease transmission occurs, which results in lower disease prevalence. This outcome is based upon our assumption of no disease transmission during migration, and this is effectively the 'migratory escape' mechanism proposed by Loehle (1995) and for which Hall et al. (2014) also found theoretical support. The assumption of no (or at the very least, lower) disease transmission would be more appropriate for species that form particularly dense aggregations on either the breeding or non-breeding grounds (e.g., elk, Cervus elaphus; Cross et al. 2010, and many reef fish; Domeier and Colin 1997). However, species like red knots (Calidris canutus) that migrate in groups or aggregate at stopover sites may actually experience increased transmission during migration (Buehler and Piersma 2008). The Hall et al. (2014) model assumes that transmission does not occur in the wintering ground (in contrast to our assumption of transmission in both breeding and wintering grounds), which may be the case in some species. Again, as the model developed by Hall et al. (2014) assumes that migration is beneficial even with no pathogen present, it is used to answer a different question (for a migrating species, what amount of time spent migrating and distance travelled is most beneficial?) than the one we answer here (when is migration more beneficial than not migrating?).

Last, the overall population decline caused by migration mortality (irrespective of an individual's infection status) causes a reduction in disease prevalence. To measure this, we considered the case where migration is instantaneous and all individuals have the same chance of surviving migration. Here, higher mortality during migration reduces the mean lifespan of both susceptible and infected individuals. A reduced lifespan of infected individuals creates a lower probability of infecting susceptible individuals, and therefore reduces overall disease prevalence. This type of instantaneous cull could occur in situations other than migration, such as seasonal bushfires, storms, frosts or heatwaves that kill part of a population. In each case, we expect the cull to result in lower disease prevalence. In fact, this sort of non-selective culling has been used as a strategy for actively managing diseases such as bovine tuberculosis and chronic wasting disease in wildlife populations (Schmitt et al. 2002; Potapov et al. 2012; Manjerovic et al. 2014). Future empirical studies should be conducted to test whether natural events lead to lower disease prevalence as well. For example, studies could examine the effect of a single population drop and how large it could be before it becomes detrimental to the population.

We ran our model using both frequency-dependent and density-dependent transmission. The transmission of most diseases is likely somewhere in the middle so these should be seen as two ends of a spectrum rather than two completely distinct scenarios (Antonovics et al. 1995). For both transmission cases, migration reduced disease prevalence under all three of the mechanisms described above. However, the relative effect of each mechanism differed by transmission type. Increased time without disease transmission (time spent migrating in our model) had a bigger impact for frequency-dependent transmission. In contrast, increased mortality during migration (both disease-related mortality, and overall mortality) had a bigger impact for density-dependent transmission. Full eradication of the disease from the population was most feasibly under density-dependent transmission with increased overall mortality during migration, and under frequency-dependent transmission with increased disease-related mortality during migration. This matches standard understanding in disease modelling that non-selective reduction of population size is a feasible strategy for eradicating disease under density-dependent transmission, but not under frequencydependent transmission (McCallum et al. 2001).

Although our model does show improved population health due to migration it does not track individuals and thus cannot determine if disease control could cause the evolution of migration. Future models should be made to test the evolutionary weight of disease control and determine if it could instigate migration. Empirical studies have shown that in some species, individuals decide to migrate or not based on body condition, with evidence for both better (Brodersen et al. 2008) and worse (Olsson et al. 2006) condition causing individuals to migrate. Perhaps if given the chances to remain behind, infected individuals would not migrate.

Since our model does not include migration distances explicitly, it could also be used to model any behaviour that involves a period of time when there is no disease transmission. For example, in the case of hibernation, disease transmission likely occurs throughout the year except during the time of hibernation (for species that hibernate solitarily). This system could also involve a cull for infected individuals as it could be hypothesised that the cost of the immune response would use energy needed to survive over the time of hibernation.

In addition to there being disease-related benefits of migration (explored here), there can also be disease-related costs of migration (not explored here). For example, in some species, migrating can actually increase exposure to pathogens (Figuerola and Green 2000; Waldenström et al. 2002; Morgan et al. 2007). In these cases, for migration to be favoured there must be some non-disease benefit to migration. Future modelling work could determine when the benefits of migration outweigh the costs, in the case where migration increases disease exposure.

Our model showed a decline in disease prevalence caused by three different factors: migratory cull of infected individuals, escaping transmission time via migratory trip, and a general population cull. The largest reduction in disease prevalence was caused by migratory cull. This is one of the first models to consider disease control as the only benefit to migration. Since we found such a large population benefit, we argue that disease control should be considered alongside climate, food, predation, and reproduction as potential benefits to migration.

Acknowledgments We thank the ANU Theory Group for discussion of ideas, and S. Binning, S. Peacock, and two anonymous reviewers for helpful comments on previous versions of the manuscript. This material is based upon work supported by the National Science Foundation under Grant No. OISE-1159097 to AKS.

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