# The joint evolution of movement and competition strategies

Pratik R. Gupte<sup>1,\*†</sup>
Christoph F. G. Netz<sup>1,†</sup>
Franz J. Weissing<sup>1,\*</sup>

- 1. Groningen Institute for Evolutionary Life Sciences, University of Groningen, Groningen 9747 AG, The Netherlands.
- \* Corresponding authors; e-mail: p.r.gupte@rug.nl or f.j.weissing@rug.nl
- † Both authors contributed equally to this study.

# Abstract

- 2 Competition is a key process in spatial ecology, driving movement decisions, spatial distri-
- <sup>3</sup> butions and interactions. Yet, classical models often neglect the intricate interactions between
- 4 individuals that can range from facilitation to competition over limited resources and klep-
- 5 toparasitic encounters.
- 6 Here, we present a mechanistic, spatially-explicit model of intraspecific competition with
- the evolution of foraging competition and movement strategies. We examine (1) the evolution
- 8 of movement under exploitation competition; the joint evolution of movement and (2) ge-
- 9 netically determined competition strategies (either foraging for resources or stealing resource
- items from conspecifics); and (3) behaviorally flexible competition strategies conditioned on
- 11 local cues.
- Different combinations of linked foraging and movement strategies evolve over the three
- scenarios. Exploitation competition produces broad 'clueless regions', where individuals use
- the presence of conspecifics as a proxy for resources. Interference in the form of kleptopara-
- sitism leads to conspecific avoidance, maintaining landscape heterogeneity. Populations with
- 16 fixed competition strategies generally consume less resources than foraging-only and condi-
- 17 tional competition strategies.

# **1 Introduction**

Intraspecific competition is a constant feature of animal ecology, and an important driver of 19 population dynamics and the spatial distribution of organisms (Krebs and Davies, 1978). Com-20 petition can be broadly classified into two main types, 'exploitation' and 'interference'. In ex-21 ploitation competition, individuals compete indirectly by depleting a common resource, while 22 in interference competition, individuals compete directly by interacting with each other (Birch, 23 1957; Case and Gilpin, 1974; Keddy, 2001). A special case of interference competition which is widespread among animal taxa is 'kleptoparasitism', in which an individual steals a resource from its owner (Iyengar, 2008). Experiments with foraging birds have shown that competition, including kleptoparasitism, can affect the spatial distribution of individuals across resource 27 patches (Goss-Custard, 1980; Vahl et al., 2005a,b, 2007; Rutten et al., 2010a). The avoidance of competitive interactions can also affect the distribution and behaviour of animals foraging in groups (Rutten et al., 2010b; Bijleveld et al., 2012). At larger scales, competition among different behavioural types in a species can strongly influence species distributions and animal 31 movement decisions (e.g. Duckworth and Badyaev, 2007; Schlägel et al., 2020). The fine-scale 32 mechanisms and evolutionary consequences of competition are difficult to study in free-living 33 animals, yet their knowledge is central to evolutionary ecology. It is nearly impossible to study competition and its coevolution with movement strategies at evolutionary time-scales in most animals, due to a lack of long-term data (Clutton-Brock and Sheldon, 2010) — this necessitates 36 the use of models. 37

Competition is key to paradigms of animal space-use, including the ideal free distribution (IFD, Fretwell and Lucas, 1970), information-sharing based local enhancement (also called conspecific aggregation Giraldeau and Beauchamp, 1999; Folmer et al., 2012), and producer-scrounger dynamics (Barnard and Sibly, 1981; Vickery et al., 1991; Beauchamp, 2008). Yet these paradigms often treat competition in highly simplified ways. Most IFD models, for instance, assume that resource depletion is either negligible, or that resources have a constant influx rate, where standing stock densities are effectively zero due to immediate consumption (continuous input/ immediate consumption models, Tregenza, 1995; van der Meer and Ens, 1997). Other IFD models that do include resource depletion make simplifying assumptions about the

importance of interference competition, considering it unimportant, or even modelling a ben-47 efit of grouping (e.g. Amano et al., 2006). Producer-scrounger models are primarily concerned 48 with the benefits of choosing either a producer or scrounger strategy in relation with local 49 conditions, such as the number of conspecifics (Vickery et al., 1991), or the order of arrival on 50 a patch (Beauchamp, 2008). While models such as Beauchamp (2008) and Tania et al. (2012) 51 allow for individuals to either search for food or scrounge off exploited patches, they simplify the mechanisms by which this decision is made (see also Garay et al., 2020, for a game theoretic 53 treatment). Few foraging ecology models — either IFD or producer-scrounger — allow for re-54 alistic movement strategies, often assuming omniscient animals with no travel costs (Vickery 55 et al., 1991; Tregenza, 1995; van der Meer and Ens, 1997, but see Amano et al. 2006; Cressman 56 and Křivan 2006).

On the contrary, competition occurs in a spatial context, and spatial structure is key to for-58 aging (competition) decisions (Beauchamp, 2008). Consequently, the abundance of resources 59 and their depletion, as well as the presence of potential competitors is of obvious importance 60 to individuals' movement decisions (resource selection, sensu Manly et al., 2007). How animals 61 are assumed to integrate the costs (and potential benefits) of competition into their movement 62 decisions has important consequences for theoretical expectations of population distributions 63 (van der Meer and Ens, 1997; Beauchamp, 2008). In addition to short-term, ecological effects, 64 competition should also have evolutionary consequences for individual movement strategies, 65 as it does for so many other aspects of behaviour (Baldauf et al., 2014), setting up feedback 66 loops between ecology and evolution. Modelling competition and movement decisions jointly is thus a major challenge. A number of models take an entirely ecological view, assuming that individuals move or compete ideally, or according to some fixed strategies (Vickery et al., 69 1991; Tregenza, 1995; Amano et al., 2006). Models that include evolutionary dynamics in the 70 movement (de Jager et al., 2011, 2020) and foraging competition strategies (Beauchamp, 2008; 71 Tania et al., 2012) are more plausible, but they too make arbitrary assumptions about the func-72 tional importance of environmental cues to individual decisions. Ideally, both movement and competition strategies should be the joint outcomes of selection, allowing for different competition strategies to be associated with different movement styles (see the approach in Getz et al., 2015).

Here, we present a first mechanistic, model of intraspecific competition in a spatially explicit 77 context, where competition is shaped by the joint evolution of foraging competition and move-78 ment strategies. As foraging and movement decisions are taken by individuals, we study the 79 joint evolution of both types of decision-making by means of a simulation model. Such models 80 are well suited to modelling the evolution of complex behaviours (Guttal and Couzin, 2010; 81 Kuijper et al., 2012; Getz et al., 2015, 2016; Long and Weissing, 2020; Netz et al., 2020, for conceptual underpinnings see Huston et al. (1988); DeAngelis and Diaz (2019)). This allows us to 83 both focus more closely on the interplay of exploitation and interference competition, and to 84 examine the feedback between movement and foraging behaviour at ecological and evolution-85 ary timescales. In our model, foraging individuals move on a spatially fine-grained resource 86 landscape with discrete, depletable food items that need to be processed ('handled') before consumption. Foragers make movement decisions using an inherited (and evolvable) strategy which integrates local cues, such as the local resource and competitor densities. After each 89 move, individuals choose between two foraging strategies: whether to search for a food item 90 or steal from another individual; the mechanism underlying this foraging choice is also inher-91 ited. We take lifetime resource consumption as a proxy for fitness, such that more successful 92 individuals produce more offspring, and thus are more successful in transmitting their move-93 ment and foraging strategies to future generations (subject to small mutations). We consider 94 three scenarios: in the first scenario, we examine only exploitation competition. In the second 95 scenario, we introduce kleptoparasitic interference as an inherited strategy, fixed through an 96 individual's life. In the third scenario, we model kleptoparasitism as a behavioural strategy conditioned on local environmental and social cues.

Our model allows us to examine the evolution of individual movement strategies, population-level resource intake, and the spatial structure of the resource landscape. The model enables us to take ecological snapshots of consumer-resource dynamics (animal movement, resource depletion, and competition) proceeding at evolutionary time-scales. Studying these snapshots from all three scenarios allows us to check whether, when, and to what extent the spatial distribution of competitors resulting from the co-evolution of competition and movement strategies corresponds to standard IFD predictions. Using this model, we investigate three primary questions: (1) Under what conditions does kleptoparasitic interference evolve and persist in

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the population? How do the movement strategies of kleptoparasites differ from those of the foragers? (2) What are the eco-evolutionary implications of conditional kleptoparasitism? Do conditional strategies evolve under broader conditions than a polymorphism of fixed pure strategies, and do they lead to a different spatial distribution of competitors? (3) To what extent does the spatial distribution of competitors and resources in space correspond to an ideal free distribution?

#### 13 2 The Model

We implement an individual-based evolutionary simulation model whose most basic compo-114 nents — the environment's gridded structure, and each cell's capacity to hold multiple in-115 dividuals, as well as the discrete conception of time within and between generations — are 116 inspired by the behaviour of waders (Charadrii). Waders are extensively studied in the context of foraging competition, both empirically (e.g. Vahl et al., 2005a,b, 2007; Rutten et al., 2010a,b), and using IBMs (reviewed in Stillman and Goss-Custard, 2010) — but few, if any, models consider the interplay of ecology and evolution when studying wader movement and compe-120 tition. We simulated a population with a fixed size moving on a landscape of 5122 grid cells, 121 with the landscape wrapped at the boundaries so that individuals passing beyond the bounds 122 at one end re-appear on the diametrically opposite side. The model has two time scales, first, an ecological (or behavioural) time scale of T timesteps, during which individuals move, make 124 foraging decisions, and handle prey items they find or steal. Individuals are modelled as being 125 immobile while handling food items, creating the conditions for kleptoparasitism (Brockmann 126 and Barnard, 1979). On the second, evolutionary time scale, individuals reproduce and pass on 127 their movement and foraging strategies to their offspring, the number of which is proportional 128 to their intake at the behavioural time scale. By default, we set T to 400, and simulated 1,000 129 generations of a population of 10,000 individuals; thus there are about 26 times more grid cells 130 than individuals. 131

#### 2.1 Resource Landscape

**Prey Abundance** We considered a resource landscape that is heterogeneous in its productiv-133 ity of discrete resources, but with strong spatial clustering of grid cells of similar productivity 134 (see Fig. 1C; panel gen: 1, showing a subset of 60<sup>2</sup> grid cells). We assigned each cell a constant 135 probability of generating a new prey item per timestep, which we refer to as the cell-specific 136 growth rate r. We modelled clustering in landscape productivity by having the distribution of 137 r across the grid take the form of 1,024 resource peaks, placed at regular distances of 16 grid 138 cells from the peaks around them; r declines from the centre of each peak (called  $r_{max}$ ) to its pe-139 riphery (see Fig. 1C). Effectively, the cell at the centre of each cluster generates a prey item five 140 times more frequently than the cells at the edges. We ran all three scenarios at a default  $r_{max}$  of 141 0.01, and also across a range of  $r_{max}$  values between 0.001 and 0.05. For an  $r_{max} = 0.01$ , the most 142 productive cells (at the centres of a cluster) are likely to generate one item per 100 timesteps (or 143 four items per generation, for T = 400), while the least productive cells (at cluster peripheries) 144 are likely to generate one item every 500 timesteps (only about one item per generation, for T = 400). Since our model was conceived to represent foraging waders, we considered our resources to represent mussels, a common prey of many waders, whose abundances are largely 147 driven by external gradients; we refer to these resources as 'prey items' henceforth. Cells in 148 our landscape were modelled as having a uniform carrying capacity K of 5 prey items, and 149 while a cell is at carrying capacity its r is 0. 150

**Prey Acquisition by Foragers** Foragers can perceive a cue indicating the number of all 151 prey items *P* in a cell, but do not know the exact locations of these prey. We model foragers as 152 having a probability q of failing to detect a prey item, and a probability  $q^P$  of not detecting any 153 of P prey items; foragers are thus successful in finding a prey item with a probability  $1 - q^P$ . 154 Individuals on a cell forage in a randomised sequence, and the probability of finding a prey 155 item  $(1-q^P)$  is updated as individuals find prey, reducing P. Foragers that are assigned a prey item in timestep t begin handling it, and are considered to be handlers from the end of the 157 timestep, i.e., for the movement and foraging decisions of other individuals. Foragers that are 158 not assigned a prey item are considered idle, and are counted as non-handlers.

#### 2.2 Movement and Competition Strategies

**Movement Strategies** We model movement as a fine-scale process comprised of small, dis-161 crete steps of fixed size. These steps are the outcome of short-term individual movement deci-162 sions, which are made using evolved movement strategies. Movement decisions are modelled 163 as the individual selection of a destination cell, after assessing potential destinations based on 164 available cues (akin to the concept of step selection or resource selection Fortin et al., 2005; 165 Manly et al., 2007). At the end of each timestep t, individuals scan the nine cells of their Moore 166 neighbourhood for three environmental cues, (1) an indication of the number of discrete prey 167 items P, (2) the number of individuals handling prey H (referred to as 'handlers'), and (3) the 168 number of individuals not handling prey N (referred to as 'non-handlers'). Based on these 169 cues, a 'suitability score' S is assigned to each cell as  $S = s_P P + s_H H + s_N N$ . At the start of 170 timestep t + 1, each individual moves to the cell to which it assigned the highest suitability. 171 The weighing factors for each cue,  $s_P$ ,  $s_H$ , and  $s_N$ , are genetically encoded and and transmit-172 ted from parents to their offspring. All individuals move simultaneously, and then implement 173 their foraging or kleptoparasitic behaviour to acquire prey. Individuals move and forage on the resource landscape for *T* timesteps per generation. 175

**Scenario 1: Exploitative Competition** The first scenario simulates only exploitative com-176 petition; individuals (henceforth called 'foragers') move about on the landscape and proba-177 bilistically find and consume prey items. A forager can be either in a 'searching' state or in a 'handling' state, as we assume that between finding and consuming a prey item individu-179 als must handle each prey for a fixed handling time  $T_H$  (set at 5 timesteps by default). The 180 handling time dynamic is well known from many systems; for instance, it could be the time re-181 quired for an oystercatcher to break through a mussel shell, or the time between catching and 182 subduing prey for raptors, with the handling action obvious to nearby individuals, and the 183 prey not fully under the control of the finder (Brockmann and Barnard, 1979). Handlers are as-184 sumed to be fully absorbed in their processing of prey, and do not make any movements until 185 they have fully handled and consumed their prey. In scenario 1, the only evolvable properties 186 are the cue weighing factors which determine the suitability scores ( $s_P$ ,  $s_H$  and  $s_N$ ).

**Scenario 2: Fixed Interference Competition** The second scenario builds on Scenario 1, 188 but in addition to foragers there is a second category of individuals called 'kleptoparasites'. 189 Kleptoparasites do not search for food, but rather for handlers from which they can steal prey. 190 Agents that steal are termed kleptoparasites. Kleptoparasites are always successful in stealing 191 from a handler; this may be thought of as the benefit of the element of surprise, a common ob-192 servation among birds (Brockmann and Barnard, 1979). However, if multiple kleptoparasites target the same handler, only one of them, randomly selected, is considered successful — thus 194 kleptoparasites also compete exploitatively among themselves. Individuals that have been 195 stolen from subsequently 'flee' and are moved to a random cell within a Chebyshev distance 196 of 5. Having acquired prey, a kleptoparasite converts into a handler, but need only handle prey 197 for  $T_H - t_h$  timesteps, where  $t_h$  is the time that the prey has already been handled by its previous owner; thus kleptoparasites save time on handling compared to a forager. Unsuccessful kleptoparasites are considered idle, and are also counted as non-handlers. Handlers that finish 200 processing their prey in timestep t return to the non-handler state and are assessed as such by 201 other individuals when determining their movements. In scenario 2, there are two fixed com-202 petition strategies that are inherited from parents to offspring, and each of these strategies can 203 evolve a (separate) movement strategy. 204

**Scenario 3: Conditional Interference Competition** In scenario 3, each individual can either act as a forager, searching for food, or as a kleptoparasite, dependent on its local circumstances. Individuals process the cell-specific environmental cues P, H, and N to determine their location in the next timestep (based on their inherited movement strategy). Additionally, individuals process the environmental cues to determine their strategy in the next timestep as

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$$strategy = \begin{cases} forager, & \text{if } w_P P + w_H H + w_N N \ge w_0 \\ kleptoparasite, & \text{otherwise} \end{cases}$$
 (1)

where the cue weights  $w_P$ ,  $w_H$  and  $w_N$ , and the threshold value  $w_0$  are also genetically encoded and heritable between generations. Apart from the ability to switch between foraging and kleptoparasitism, the foraging dynamics are the same as described in the fixed-strategy case.

# 2.3 Reproduction and Inheritance

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For simplicity, our model considers a population of fixed size (10,000 individuals) with discrete, non-overlapping generations. Individuals are haploid and reproduction is asexual. Each individual has 7 gene loci that encode the decision making weights; only the weights in control of individual movement ( $s_P$ ,  $s_H$ ,  $s_N$ ) are active in scenarios 1 and 2. In scenario 3, the weights for foraging decisions ( $w_P$ ,  $w_H$ ,  $w_N$ ,  $w_0$ ) are also active, and are transmitted from parent individuals to offspring. Hence the alleles at these loci correspond to real numbers that are transmitted from parent individuals to their offspring.

We assume that the expected number of offspring per individual is proportional to the individual's total lifetime intake of resources (hence resource intake is used as a proxy for fitness). This is implemented as a weighted lottery (with weights proportional to lifetime resource intake) that selects a parent for each offspring in the subsequent generation (see prior implementation in Tania et al., 2012; Netz et al., 2020). In all scenarios, the movement decision-making weights are subject to independent random mutations with a probability of 0.001. The mutational step size (either positive or negative) is drawn from a Cauchy distribution with a scale of 0.01 centred on zero. This allows for a small number of very large mutations while the majority of mutations are small. In scenarios 1 and 2, the foraging-decision weights are not relevant. However, in scenario 2 we allow a forager to mutate into a kleptoparasite (or *vice versa*) with a probability of 0.001. In scenario 3, the foraging weights mutate in the same way as the movement weights, described above. We intialised each offspring at a random location on the landscape; this potentially forces individuals to contend with conditions very different from those of their direct parent.

#### 2.4 Simulation Output and Analysis

Population Activities and Intake We counted the number of times foragers were searching for prey, kleptoparasites were searching for handlers, and the number of timesteps that individuals of either strategy were handling a prey item. We refer to the ratio of time spent foraging, stealing, and handling as the population's 'activity budget'. We examined how the population activity budget developed over evolutionary time, and whether a stable ecological

equilibrium was reached. Furthermore, we counted the total population intake — the number of items consumed in each generation — as a measure of population productivity.

Resource Landscape and Individual Distribution Snapshots To visualise the effect of different foraging strategies on the resource landscape, we exported snapshots of the entire simulation landscape at the mid-point of each generation (t = 200). This snapshot contained data on (1) the number of prey items, (2) the number of handling individuals, and the number of individuals using either a (3) searching strategy or (4) kleptoparasitic strategy, on each grid cell. We used only a subset of the total landscape ( $60^2$  of  $512^2$  cells) for further analyses to speed up computation.

**Testing the Input Matching Rule** To examine whether foragers in our model achieved an 251 IFD, we used the snapshots to test a basic prediction of the IFD and the related matching rule: 252 that the number of individuals on occupied patches should be proportional with patch pro-253 ductivity (Fretwell and Lucas, 1970; Parker, 1978; Houston, 2008). In real world systems, patch 254 productivity is challenging to measure, but not so in simulation models, where it is among 255 the model's building blocks. We calculated the correlation coefficient between the number of 256 individuals (excluding handlers) and the cell-specific productivity r, and plotted it over gen-257 erations for each replicate. 258

Informativeness of Resource Landscapes Another measure of whether foragers have achieved
the IFD on their resource landscape is whether individuals can improve their intake by moving to another location; in our model, this would be to a neighbouring cell. We calculated the
cell-specific item gradient for each landscape snapshot, as the difference in item counts between each cell and its neighbouring cells. We then calculated the proportion of grid cells from
which it was possible to sense differences in prey items, i.e., a cell with either more of fewer
items. When it is impossible to sense such differences, movement informed by relative prey
item abundances is difficult, and achieving the IFD becomes a challenge.

Visualising Decision-Making Weights To understand the evolutionary consequences of our simulation on the individual decision making weights, we exported the weights of each indi-

vidual in every generation of the simulation. To depict as much as possible of the typical variation of weights, which could take arbitrarily large values and therefore vary by orders of magnitude, we multiplied each weight by 20 and applied a hyperbolic tangent transform. This scaled the weights between -1 and +1.

Model Code, Analysis Code, and Data Availability The simulation model code can be
found on Github (https://github.com/pratikunterwegs/Kleptomove) and archived on Zenodo (https://zenodo.org/record/4905476). Simulation data used in this study are available
on the Dryad/IRODS/Zenodo repository REPOSITORY LINK HERE. Code for data analysis
and preparing the figures in the main text and Supplementary Material is available on Github
(https://github.com/pratikunterwegs/kleptomove-ms) and archived on Zenodo (https://doi.org/10.5281/z

# 79 3 Results

# 3.1 Scenario 1: No Kleptoparasitism

When only foragers are present in the population, individuals deplete prey items faster than 281 they can be replenished, and the overall number of prey items is drastically reduced within 282 only a few generations (Fig. 1A). The population's activity budget is split between searching 283 and handling (Fig. 1B). The proportion of time spent handling and the population intake are both initially low, but then peak within ten generations (Fig. 1C). This is because individuals 285 can easily acquire prey items from the fully stocked landscape in the first few generations. 286 As the number of prey items reduces, handling as a share of the activity budget declines to a 287 stable  $\sim 45\%$  within 50 generations; this is because fewer searching foragers find a prey item. 288 This leads to a similar stabilisation in population intake (Fig. 1C). Though in early generations, 289 foragers are attracted to resource peaks and tend to accumulate on resource-rich locations (Fig. 290 1A), the correlation between the number of foragers on a cell and the productivity of that cell is 291 only slightly positive (Fig. 1D). This is in contrast with the perfect correspondence between re-292 source input rate and forager density (the 'input matching rule'), which is a defining property 293 of the IFD (Parker, 1978; Houston, 2008). Contrary to standard IFD assumptions, foragers can-294 not directly "sense" the local cell productivity r; instead they can only use the (small) number

of prey items available in a cell as a cue for local productivity ("cell quality").

#### 3.2 Scenario 2: Co-existence of Foragers and Kleptoparasites

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When both foraging and kleptoparasitism is allowed, the spatial distribution of consumers and 298 prey items at equilibrium are very different from a forager-only population. Consumers gather 299 on resource peaks in early generations, grazing them down until very few prey items remain 300 on the landscape and consumers are dispersed; however, within 50 generations the resource 301 landscape recovers with prey abundances higher than in the earliest generations (Fig. 2A). 302 This is explained by the presence of kleptoparasites (Fig. 2B), which reduce the prey intake 303 rate of the population, and accordingly lead to a higher prey abundance. In early generations, 304 kleptoparasites are very rare, and the activity budget, the population intake, and the distribu-305 tion of consumers over the landscape show the same patterns as in Fig. 1. Population intake 306 also spikes in early generations as individuals successfully acquire prey items from the fully 307 stocked prey landscape (Fig. 2C). At this stage, it becomes more likely for a kleptoparasite to 308 encounter a handler than for a searching forager to find a prey item, and from generation 30 309 onwards, as kleptoparasitism becomes the dominant strategy (a stable  $\sim$ 70% of the popula-310 tion; see Fig. 2B), searching for handlers from whom to steal becomes the dominant activity. 311 However, the high frequency of this activity, and the low frequency of handling, indicate that 312 many kleptoparasites are actually unsuccessful at finding handlers. With few searching for-313 agers, fewer prey items are extracted from the landscape, which recovers beyond its initial 314 prey abundance within 50 generations (Fig. 2A). 315

Despite the strong spatial structure of the resource landscape within 50 generations, the correlation between consumer abundance and cell productivity remains weak or zero across generations (Fig. 2D). This may be explained by the dynamics of kleptoparasitism: foragers fleeing a kleptoparasitic attack are displaced far from their original location, and kleptoparasites must track these foragers if they are to acquire resources. As kleptoparasites, the numerically dominant strategy, seek to move towards handlers (rather than prey), they are not strongly influenced by prey item abundances.

The increase of kleptoparasitism from a negligible fraction to the dominant strategy (Fig. 3A) is associated with the evolutionary divergence of the movement strategies in foragers and

kleptoparasites. While foragers and kleptoparasites respond to prey density and non-handler 325 density in a similar way (see Supplementary Figure S5), preferring higher prey density while 326 avoiding high non-handler density, the two types of competition strategy differ substantially 327 in their response to handlers (Fig. 3B, 3C). Kleptoparasites very rapidly (within 3 generations) 328 evolve a strong preference for moving towards handlers, which are their primary resource 329 (Fig. 3B). In the absence of kleptoparasites, foragers would evolve a preference for moving 330 towards handlers (see Supplementary Figure S4), because the presence of handlers is an indi-331 rect indicator of productive cells. However, with kleptoparasites common in the population, 332 searching foragers both avoid and prefer handlers in about equal proportions (Fig. 3C). While 333 all kleptoparasites evolve to prefer moving towards handlers, the strength of the attraction to 334 handlers shows multiple, distinct values or 'morphs', which are remarkably persistent across 335 generations (Fig. 3B). In replicate 3, for example, the dominant movement strategy exhibits 336 only a weak attraction to handlers, but this strategy coexists with various strategies that all 337 show a much stronger attraction to handlers (Fig. 3B). The movement strategies of foragers 338 show an even higher degree of polymorphism (Fig. 3C). Typically, there are no predominant 339 movement strategies. Instead, a wide range of coexisting handler attraction/repulsion values 340 emerges. In other words, some foragers are strongly attracted by handlers, others are strongly 341 repelled by handlers, and yet others are neutral to the presence of handlers. 342

#### 3.3 Scenario 3: Condition-dependent Kleptoparasitism

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When individuals are allowed to choose their competition strategy (foraging or kleptopara-344 sitism) based on local environmental cues, the distribution of individuals and prey items is substantially different from the two previous scenarios (Fig. 4A). Initially, as in scenario 1, 346 depletion of prey items results in the degradation of the resource landscape within ten gener-347 ations. By generation 50, the resource landscape recovers some of the spatial structure of the 348 first generation, but prey-item abundances do not reach the level of the similar recovery seen 349 in scenario 2. This too is explained by the observation that by generation 30, all individuals have a propensity to steal from handlers, i.e., when handlers are present in the vicinity, con-351 sumers will choose to target handlers for prey items, rather than forage for prey themselves 352 ("opportunistic kleptoparasitism"; Fig. 4B; orange line). However, unlike scenario 2, individu-

als search for prey more often and steal less (at or below 25%; compare with Fig. 2B), leading 354 to a sustained high population intake rate and the depletion of the resource landscape. Con-355 sequently, population intake stabilises (after an initial spike, as in scenarios 1 and 2) within 356 ten generations to a level similar to scenario 1 (Fig. 4C). The reduced depletion following the 357 evolution and persistence of kleptoparasitism leads to a resource landscape recovery interme-358 diate between scenarios 1 and 2 within 50 generations (Fig. 4A). As individuals move and 359 choose foraging strategies conditionally, they are able to better choose between the payoff of 360 more prey items, more handling foragers from which to steal, and the risk of falling victim to 361 kleptoparasites. Thus, while not as strong as predicted by IFD theory, the correlations between 362 consumer abundance and cell productivity are weakly positive (Fig. 4D). 363

## 3.4 Evolution, the Ideal Free Distribution, and Alternative Movement Cues

Orienting movement towards resources (Nathan et al., 2008, ; where to move) can be a chal-365 lenge in a system with low densities of discrete prey items, because the local prey density may 366 provide very limited information about local productivity. In fact, major parts of the resource 367 landscape may be a 'clueless plateau' (Perkins, 1992); on most cells, foragers cannot make di-368 rected movement decisions based on prey-item abundances alone, as all neighbouring items 369 abundances are identical (see white areas in Fig. 5A; A1: scenario 1, A2: scenario 2, A3: sce-370 nario 3). At the beginning of all three scenarios, about 75% of landscape cells have a different 371 number of prey-items from the cells around them; these are primarily the cells with an in-372 termediate r, which have more prey than the lowest productivity cells at the peripheries of 373 resource peaks, but fewer prey than the peaks themselves. This proportion rapidly declines to 374 a much lower value within 10 generations in all three scenarios. 375

The scenarios differ, however, regarding the 'cluelessness' of the landscape on evolutionary timescales (Fig. 5B). In scenario 1, the proportion of cells from which it is possible to move to a neighbouring cell with more items is initially very high (Fig. 5A1). This proportion rapidly declines to  $\sim$ 25% within 10 generations, as foragers deplete most cells on the landscape until they are devoid of prey items, and the majority of the landscape is a clueless plateau. In this context, foragers evolve to move towards handlers — with > 75% of individuals showing a preference for handlers within 100 generations (Fig. 5B1 – blue line). Forager preference for

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handlers (which do not represent a direct resource in scenario 1), may be explained as the sensing of a long-term cue of local productivity. Since handlers are immobilised on the cell where they find a prey item, cells with handlers are (1) certain to have a non-zero rate of prey item generation, and (2) likely to border cells which can generate prey items, due to the autocorrelation (spatial patterning) of the landscape.

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Scenario 2 landscapes follow a similar pattern to scenario 1 in the first 10 generations ( $r_{max}$  = 388 0.01; Fig. 5A2). However, within 50 generations, the reduction in prey item extraction allows 389 most cells to regenerate prey items, with differences among cells according to their produc-390 tivity r (see also Fig. 2A). Thus it is possible to move to a neighbouring cell with more items 391 from > 75% of the landscape (Fig. 5A2 – panel *gen:* 50, 5B2). However, since the majority 392 of foragers are kleptoparasites, which seek out handlers, this recovery of the resource land-393 scape provides only indirect movement cues, as searching foragers are more likely to convert 394 to handlers on cells with more prey items. Unlike scenario 1, the rapid increase in handler 395 preference is driven by correlational selection on kleptoparasites (see subsection above). Sce-396 nario 3 is similar to scenario 2, except that only about half the landscape allows movement to a 397 neighbouring cell with more prey items (Fig. 5A3, 5B3). Here, the rapid evolution of a handler 398 preference in movement decisions cannot be assigned a clear cause, since handlers are both a 399 potential direct resource as well as indirect cues to the location of productive cells. 400

#### 3.5 Effect of Landscape Productivity on Evolutionary Outcomes

The prey-item regrowth rate that characterises the peaks of the resource landscape  $(r_{max})$  is 402 a measure of the productivity of the resource landscape overall. Having thus far focused on 403 scenarios with  $r_{max} = 0.01$  (corresponding to a peak production of 4 food times per consumer 404 lifetime), we find that, not unexpectedly, the value of  $r_{max}$  has a marked effect on evolved 405 population activity budgets, total intake, and even evolved strategies. The frequency of for-406 aging reduces with  $r_{max}$  in scenarios 1 and 3; this is caused by more frequent acquisition of 407 prey items (as regrowth keeps pace with depletion), which results in a greater frequency of 408 handling rather than foraging. 409

In scenario 2 however, the frequency of handling is relatively unaffected by increasing  $r_{max}$  (Fig. 6A). The difference between scenarios 2 and 3 has to do with the change in the frequency

of kleptoparasitism (Fig. 6B). In scenario 2, kleptoparasitism forms > 75% of all activities at 412 very low  $r_{max}$ , and is much more common than in scenario 3 populations at the same regrowth 413 rate. However, at relatively high  $r_{max}$  (0.03), the fixed kleptoparasitic strategy goes extinct. 414 This is because at high  $r_{max}$ , the probability of a forager finding prey is much greater than the 415 probability of a kleptoparasite finding a handler, in both initial (< 10) and later generations (> 50). Consequently, kleptoparasites are responsible for only a very small fraction of the total population intake, have relatively much lower fitness, and do not proliferate. Thus at these 418 regrowth rates, a scenario 2 population is nearly identical to a scenario 1 population; while 419 some kleptoparasites may be seen in later generations, these are more likely due to mutation 420 in the forager strategy, rather than longstanding lineages of kleptoparasites. 421 In scenario 3, kleptoparasitism persists at low frequencies even at the highest regrowth rates 422 (Fig. 6B); thus some foragers lose time in extracting items which are then stolen from them. 423 Consequently, while populations in all three scenarios achieve very similar intakes at low  $r_{max}$ , 424 at intermediate regrowth rates (0.01 – 0.025), conditionally kleptoparasitic populations achieve 425 a higher intake than populations using fixed strategies. Only at high regrowth rates, when 426 fixed strategy populations (scenario 2) effectively convert to purely forager populations (sce-427

#### 429 4 Discussion

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Our spatially-explicit individual-based model implements the ecology and evolution of move-430 ment and foraging decisions, as well as resource dynamics, in biologically plausible ways, and 431 offers a new perspective about the distribution of animals in relation to their resources under 432 different scenarios of competition. First, we show that when moving with a limited percep-433 tion range and competing only by exploitation, individuals evolve movement strategies for 434 both direct and indirect resource cues (prey items and handlers, respectively). Regardless, on 435 a resource landscape with discrete prey items, large areas may become devoid of any move-436 ment cues, leading to a mismatch between individual distribution, prey item distribution, and 437 landscape productivity. Second, we show that when interference competition in the form of kleptoparasitism is allowed as a fixed strategy, it rapidly establishes itself on landscapes where

nario 1), do they achieve a higher intake than scenario 3 populations (Fig. 6C).

stealing is more time-efficient than searching for prey. This rapid increase in kleptoparasitism
as a strategy is accompanied by the evolution of movement strategies that favour moving towards handlers, which are the primary resource of the kleptoparasites. In this sense, obligate
kleptoparasites may be thought of as forming a higher trophic level, with any handling consumers as their prey. Third, we show that when foraging strategy is allowed to be conditional
on local cues, (1) the population's intake is significantly higher than that of a population with
fixed strategies, and (2) unlike fixed strategy populations, kleptoparasitism as a strategy does
not go extinct on high-productivity landscapes.

TO BE RE-DONE: In both the fixed and conditional strategy scenarios, however, foragers are unable to match their resource landscape, as would be predicted by IFD models.

# 4.1 Modelling the Joint Evolution of Movement and Foraging Strategies

Our model stands in stark contrast with existing models of individual foraging and move-451 ment decisions, in which movement strategies are imposed to mimic either ideal or non-ideal 452 foragers (Vickery et al., 1991; Cressman and Křivan, 2006; Amano et al., 2006; Beauchamp, 453 2008; Stillman and Goss-Custard, 2010), We, however, allow selection to determine how in-454 dividuals should weigh local environmental cues for movement decisions (resource selection 455 Manly et al., 2007, ; but see Getz et al. 2015). Modelling prey items on the resource landscape 456 as discrete and exclusive (in the sense of a private good), contrary to most IFD models (Tre-457 genza, 1995; Amano et al., 2006) also allows for a more plausible, fine-scale consideration of 458 exploitation competition, which is often neglected. Similarly, breaking with the convention of 459 determining foraging style (searching or stealing) probabilistically or ideally (Vickery et al., 1991; Beauchamp, 2008; Tania et al., 2012), our individuals' foraging decisions are also shaped 461 by selection (in scenarios 2 and 3). The majority of literature in the field, despite sometimes 462 including variation among individuals, typically only considers ecological scenarios within 463 a single generation (see a review in Stillman and Goss-Custard, 2010). Our model explicitly 464 considers the evolutionary process, where previous mechanistic models of individual movement and competition decisions have used evolutionary algorithms to 'optimise' individuals' 466 behaviour (Beauchamp, 2008; Getz et al., 2015, 2016). First, instead of allowing the fittest 50% 467 of the population to replicate, we determined the number of offspring to be proportional to individual fitness (our 'weighted lottery'; see a similar idea in Tania et al., 2012). Second, the
weight loci are subject to mutations independently, rather than subjecting all loci of an individual to simultaneous mutation. Finally, we abstained from using an artificial mutation regime
such as 'simulated annealing', which (intentionally) leads to a reduction in the magnitude of
mutations to the decision making weights over generations. Mutations were instead drawn
from a Cauchy distribution centred on the current weight value, that consistently allows for
the occurrence of large-effect mutations throughout the simulation.

# 4.2 The Evolutionary Ecology of Movement Rules

Modelling the resource landscape as comprised of depletable prey items has significant ecological and evolutionary consequences not predicted by simpler models, even those focused
on foraging birds (Stillman and Goss-Custard, 2010). The possibility of all discrete prey being
depleted from a cell can leave many cells empty, forming 'clueless regions', i.e., areas within
which movement informed by a gradient of resource cues is impossible (Perkins, 1992). In
our scenario 1, this leads to a kind of local IFD — no move in a clueless region can improve
resource intake — and to the conclusion that at IFD, all individuals in a population must move
randomly, if at all (Cressman and Křivan, 2006).

In a clueless region, the presence of successful consumers is likely to indicate a suitable foraging spot (local enhancement; see Giraldeau and Beauchamp, 1999; Beauchamp, 2008). The presence of unsuccessful individuals, meanwhile, signals potential costs — due to exploitation or interference competition, or even in the absence of other individuals, the time cost of searching for prey on an unproductive cell. This selects for movement strategies that integrate individuals' assessment of the condition of intraspecific competitors — an important aspect of using 'social information' (see Danchin et al., 2004; Dall et al., 2005) — and thus aggregating on cells with handlers. When population density is high, and resources are spatially auto-correlated, individuals can evolve polymorphisms in movement strategies such that only a fraction of the population tracks resource cues, while a larger proportion is relatively insensitive to resource cues, and follows the resource-tracking 'informed leaders' (Guttal and Couzin, 2010). In our model however, the relatively low density of foragers, the inability to share discrete prey items, and the breakdown of spatial autocorrelation in prey abundance due

to foraging, means that such a polymorphism does not evolve; all individuals must sense and track resources, while eventually also evolving to aggregate with handlers.

Foragers are expected, from IFD theory, to aggregate on the most productive patches; this 500 is an emergent outcome of individuals balancing competition costs with higher intake. In 501 our scenarios, cell productivity cannot be known, and individuals evolve movement strategies 502 such that between two cells with identical prey densities, but different handler counts, they 503 would move into the cell with more handlers. Such aggregation, especially on resource-scarce 504 landscapes where competition for food is expected to be more intense, is counter-intuitive; it 505 has usually been explained by invoking external costs, such as predation risks, which can be 506 spread over grouping individuals (Krause and Ruxton, 2002; Folmer et al., 2012). We suggest 507 that information on the location of productive areas of the resource landscape alone may be 508 a sufficient benefit to promote the evolution of social information use, and consequently ag-509 gregation. Thus, in contrast with expectations, resource-scarce landscapes are likely to have 510 larger groups of foragers than would be expected under by IFD theory (Fretwell and Lucas, 511 1970; Parker, 1978). 512

In our scenarios 2 and 3, social information use is even more critical and strongly selected for by fixed or conditional kleptoparasitism. This coupling of movement and behavioural strategy is expected when certain combinations of traits are favoured by selection (the 'correlational selection hypothesis'; see Sih et al., 2004; Wolf and Weissing, 2010).

#### 4.3 The Evolutionary Ecology of Competitive Strategies

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Competition is a key process in determining animal space use across scales (Fretwell and Lucas, 1970; van der Meer and Ens, 1997), and is often suggested as a driver of phenotypic, behavioural, and foraging polymorphisms (Baldauf et al., 2014). In our scenario 2, the modelling
of kleptoparasitic interference as a fixed strategy leads to the dimorphism between obligate
searching foragers and kleptoparasites. This strategic constraint on scenario 2 individuals
prevents the population from converging on a single behavioural and movement phenotype
(but see below), as kleptoparasites are dependent on searching foragers for intake, and can
almost always invade a pure searching forager population. The proportion of kleptoparasites
to searching foragers in scenario 2 is quite tightly controlled by the density-dependent success

of either strategy.

In scenario 3, the frequency of stealing attempts better reflects the encounter rate of han-528 dlers, rather than the frequency of opportunistic stealing propensity in the population (which 529 is nearly always 100%). Our implementation of strategic choice as conditional on local cues, 530 rather than probabilistic or learned (see Tania et al., 2012) allows scenario 3 individuals' be-531 haviour to be fine-tuned to immediate, local conditions; they lose much less time in futile 532 stealing attempts than scenario 2 foragers, and thus achieve better intakes. Consequently, sce-533 nario 3 individuals rapidly converge upon a single, optimal strategy, which is to steal when 534 handlers are available, and to search for prey otherwise. In this scenario, global natal dispersal 535 is likely redundant; all foragers can (nearly optimally) choose their strategy in each turn, and 536 there is no spatial segregation between the strategies.

## 4.4 Competitive Strategies and Landscape Productivity

Landscape productivity determines the probability of a searching forager to find prey and be-539 come a handler, but population density determines the probability of a kleptoparasite to find 540 a handler. The balance of productivity and population density controls whether obligate klep-541 toparasitism is a viable strategy (scenario 2), leading to the counterintuitive pattern of lower kleptoparasitism on higher productivity landscapes at the same population density. On more 543 productive landscapes ( $r_{max} \ge 0.02$ ), exploitation competition is reduced, and the probabil-544 ity of a forager-prey item encounter is much higher than the probability of a kleptoparasite-545 handler encounter. Consequently, fixed-strategy kleptoparasites rarely match the per-capita 546 intakes of foragers, and rapidly go extinct. Thus high  $r_{max}$  instances of scenario 2 consistently produce populations that are functionally identical to scenario 1 populations, with no 548 kleptoparasitism. Our implementation of a fixed population size contributes to our scenario 549 2 results, and a model with flexible population sizes might allow kleptoparasites to persist. 550 Conditional strategy populations (scenario 3) are free from constraints on behavioural strat-551 egy, and can extract and handle prey items directly; their intakes are thus higher than those of fixed-strategy populations, and similar to forager populations on low productivity landscapes. 553 However, at high  $r_{max}$ , opportunistic kleptoparasites in scenario 3 have a greater per-capita in-554 take rate than pure foragers, as kleptoparasitic prey acquisition deprives a (foraging) handler 555

- of its prey. Since scenario 3 kleptoparasitic behaviour is conditional, it persists even in popu-
- lations on high productivity landscapes.

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# References

- <sup>568</sup> Amano, T., K. Ushiyama, S. Moriguchi, G. Fujita, and H. Higuchi. 2006. Decision-Making
- in Group Foragers with Incomplete Information: Test of Individual-Based Model in Geese.
- Ecological Monographs 76:601–616.
- Baldauf, S. A., L. Engqvist, and F. J. Weissing. 2014. Diversifying evolution of competitiveness.
- Nature Communications 5:5233.
- Barnard, C. J., and R. M. Sibly. 1981. Producers and scroungers: A general model and its application to captive flocks of house sparrows. Animal behaviour 29:543–550.
- Beauchamp, G. 2008. A spatial model of producing and scrounging. Animal Behaviour 76:1935–1942.
- Bijleveld, A. I., E. O. Folmer, and T. Piersma. 2012. Experimental evidence for cryptic interference among socially foraging shorebirds. Behavioral Ecology 23:806–814.
- 579 Birch, L. C. 1957. The Meanings of Competition. The American Naturalist 91:5–18.
- Brockmann, H., and C. Barnard. 1979. Kleptoparasitism in birds. Animal Behaviour 27:487–581 514.
- Case, T. J., and M. E. Gilpin. 1974. Interference Competition and Niche Theory. Proceedings of
   the National Academy of Sciences 71:3073–3077.
- Clutton-Brock, T., and B. C. Sheldon. 2010. Individuals and populations: The role of long-term,
   individual-based studies of animals in ecology and evolutionary biology. Trends in Ecology
- <sup>586</sup> & Evolution 25:562–573.

- Cressman, R., and V. Křivan. 2006. Migration Dynamics for the Ideal Free Distribution. The
   American Naturalist 168:384–397.
- Dall, S. R. X., L.-A. Giraldeau, O. Olsson, J. M. McNamara, and D. W. Stephens. 2005. Information and its use by animals in evolutionary ecology. Trends in Ecology & Evolution 20:187–193.
- Danchin, É., L.-A. Giraldeau, T. J. Valone, and R. H. Wagner. 2004. Public Information: From
   Nosy Neighbors to Cultural Evolution. Science 305:487–491.
- de Jager, M., J. van de Koppel, E. J. Weerman, and F. J. Weissing. 2020. Patterning in Mussel Beds Explained by the Interplay of Multi-Level Selection and Spatial Self-Organization. Frontiers in Ecology and Evolution 8.
- de Jager, M., F. J. Weissing, P. M. J. Herman, B. A. Nolet, and J. van de Koppel. 2011. Lévy Walks
   Evolve Through Interaction Between Movement and Environmental Complexity. Science
   332:1551–1553.
- DeAngelis, D. L., and S. G. Diaz. 2019. Decision-Making in Agent-Based Modeling: A Current
   Review and Future Prospectus. Frontiers in Ecology and Evolution 6.
- Duckworth, R. A., and A. V. Badyaev. 2007. Coupling of dispersal and aggression facilitates the rapid range expansion of a passerine bird. Proceedings of the National Academy of Sciences of the United States of America 104:15017–22.
- Folmer, E. O., H. Olff, and T. Piersma. 2012. The spatial distribution of flocking foragers: Disentangling the effects of food availability, interference and conspecific attraction by means of spatial autoregressive modeling. Oikos 121:551–561.
- Fortin, D., H. L. Beyer, M. S. Boyce, D. W. Smith, T. Duchesne, and J. S. Mao. 2005. Wolves
   Influence Elk Movements: Behavior Shapes a Trophic Cascade in Yellowstone National Park.
   Ecology 86:1320–1330.
- Fretwell, S. D., and H. L. Lucas. 1970. On territorial behavior and other factors influencing habitat distribution in birds. Acta Biotheoretica 19:16–36.
- Garay, J., R. Cressman, F. Xu, M. Broom, V. Csiszár, and T. F. Móri. 2020. When optimal foragers
   meet in a game theoretical conflict: A model of kleptoparasitism. Journal of Theoretical
   Biology 502:110306.
- Getz, W. M., R. Salter, A. J. Lyons, and N. Sippl-Swezey. 2015. Panmictic and Clonal Evolution on a Single Patchy Resource Produces Polymorphic Foraging Guilds. PLOS ONE 10:e0133732–e0133732.
- Getz, W. M., R. Salter, D. P. Seidel, and P. van Hooft. 2016. Sympatric speciation in structureless
   environments. BMC Evolutionary Biology 16:50–50.
- Giraldeau, L.-A., and G. Beauchamp. 1999. Food exploitation: Searching for the optimal joining
   policy. Trends in Ecology & Evolution 14:102–106.
- Goss-Custard, J. D. 1980. Competition for food and interference among waders. Ardea 55:31–53.

- Guttal, V., and I. D. Couzin. 2010. Social interactions, information use, and the evolution of
   collective migration. Proceedings of the National Academy of Sciences 107:16172.
- Houston, A. I. 2008. Matching and ideal free distributions. Oikos 117:978–983.
- Huston, M., D. DeAngelis, and W. Post. 1988. New Computer Models Unify Ecological TheoryComputer simulations show that many ecological patterns can be explained by interactions among individual organisms. BioScience 38:682–691.
- Iyengar, E. V. 2008. Kleptoparasitic interactions throughout the animal kingdom and a re evaluation, based on participant mobility, of the conditions promoting the evolution of klep toparasitism. Biological Journal of the Linnean Society 93:745–762.
- Keddy, P. A. 2001. Studying competition. Pages 1–59 in P. A. Keddy, ed. Competition, Popula tion and Community Biology Series. Springer Netherlands, Dordrecht.
- 636 Krause, J., and G. D. Ruxton. 2002. Living in Groups. Oxford University Press.
- Krebs, J., and N. Davies. 1978. Behavioural Ecology: An Evolutionary Approach.
- Kuijper, B., I. Pen, and F. J. Weissing. 2012. A guide to sexual selection theory. Annual Review
   of Ecology, Evolution, and Systematics 43:287–311.
- Long, X., and F. J. Weissing. 2020. Individual variation in parental care drives divergence of
   sex roles. bioRxiv page 2020.10.18.344218.
- Manly, B., L. McDonald, D. L. Thomas, T. L. McDonald, and W. P. Erickson. 2007. Resource
   Selection by Animals: Statistical Design and Analysis for Field Studies. Springer Science &
   Business Media.
- Nathan, R., W. M. Getz, E. Revilla, M. Holyoak, R. Kadmon, D. Saltz, and P. E. Smouse. 2008.

  A movement ecology paradigm for unifying organismal movement research. Proceedings of the National Academy of Sciences 105:19052–19059.
- Netz, C., H. Hildenbrandt, and F. J. Weissing. 2020. Complex eco-evolutionary dynamics induced by the coevolution of predator-prey movement strategies. bioRxiv page 2020.12.14.422657.
- Parker, G. 1978. Searching for mates.[In: Behavioural ecology. An evolutionary approach. JR Krebs and NB Davies, eds] .
- Perkins, D. N. 1992. Topography of Invention. Page 238 *in* Inventive Minds: Creativity in Technology, vol. 10. Oxford University Press, New York, NY, USA.
- Rutten, A. L., K. Oosterbeek, J. van der Meer, S. Verhulst, and B. J. Ens. 2010a. Experimental evidence for interference competition in oystercatchers, Haematopus ostralegus. I. Captive birds. Behavioral Ecology 21:1251–1260.
- Rutten, A. L., K. Oosterbeek, S. Verhulst, N. J. Dingemanse, and B. J. Ens. 2010b. Experimental evidence for interference competition in oystercatchers, Haematopus ostralegus. II. Freeliving birds. Behavioral Ecology 21:1261–1270.

- Schlägel, U. E., V. Grimm, N. Blaum, P. Colangeli, M. Dammhahn, J. A. Eccard, S. L. Hausmann, A. Herde, H. Hofer, J. Joshi, S. Kramer-Schadt, M. Litwin, S. D. Lozada-Gobilard,
- M. E. H. Müller, T. Müller, R. Nathan, J. S. Petermann, K. Pirhofer-Walzl, V. Radchuk, M. C.
- Rillig, M. Roeleke, M. Schäfer, C. Scherer, G. Schiro, C. Scholz, L. Teckentrup, R. Tiedemann,
- 665 W. Ullmann, C. C. Voigt, G. Weithoff, and F. Jeltsch. 2020. Movement-mediated community
- assembly and coexistence. Biological Reviews.
- Sih, A., A. Bell, and J. C. Johnson. 2004. Behavioral syndromes: An ecological and evolutionary
   overview. Trends in Ecology & Evolution 19:372–378.
- Stillman, R. A., and J. D. Goss-Custard. 2010. Individual-based ecology of coastal birds. Bio logical Reviews 85:413–434.
- Tania, N., B. Vanderlei, J. P. Heath, and L. Edelstein-Keshet. 2012. Role of social interactions in
   dynamic patterns of resource patches and forager aggregation. Proceedings of the National
   Academy of Sciences 109:11228–11233.
- Tregenza, T. 1995. Building on the Ideal Free Distribution. Pages 253–307 *in* Advances in Ecological Research, vol. 26. Elsevier.
- Vahl, W. K., T. Lok, J. van der Meer, T. Piersma, and F. J. Weissing. 2005a. Spatial clumping of
   food and social dominance affect interference competition among ruddy turnstones. Behavioral Ecology 16:834–844.
- Vahl, W. K., J. Van Der Meer, K. Meijer, T. Piersma, and F. J. Weissing. 2007. Interference competition, the spatial distribution of food and free-living foragers. Animal Behaviour 74:1493–1503.
- Vahl, W. K., J. van der Meer, F. J. Weissing, D. van Dullemen, and T. Piersma. 2005b. The mechanisms of interference competition: Two experiments on foraging waders. Behavioral Ecology 16:845–855.
- van der Meer, J., and B. J. Ens. 1997. Models of Interference and Their Consequences for the Spatial Distribution of Ideal and Free Predators. The Journal of Animal Ecology 66:846.
- Vickery, W. L., L.-A. Giraldeau, J. J. Templeton, D. L. Kramer, and C. A. Chapman. 1991. Producers, Scroungers, and Group Foraging. The American Naturalist 137:847–863.
- Wolf, M., and F. J. Weissing. 2010. An explanatory framework for adaptive personality differences. Philosophical Transactions of the Royal Society B: Biological Sciences 365:3959–3968.

# 6 Figure legends

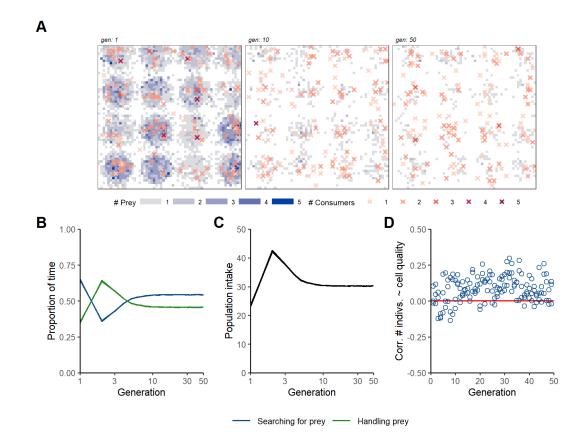


Figure 1: Eco-evolutionary implications of pure exploitation competition (scenario 1). (A) When a population is comprised solely of foragers seeking prey on a resource landscape, the initially well-stocked resource landscape is swiftly depleted within 10 generations (out of 1,000 simulated). This sparsity in prey-item abundance is maintained throughout the remaining generations of the simulation. Individuals, whose local density is shown by coloured crosses, are scattered over the landscape. These dynamics are explained by the fact that (B) within 20 generations of evolution, the population reaches an equilibrium in the relative proportion of time spent on searching prey and handling prey, and in (C) the total intake of the population. (D) In a departure from the intake matching rule of IFD theory, cell occupancy (number of foragers per cell) is only weakly correlated with cell productivity r. Panel A shows a single replicate, while panels B, C and D show three replicate simulations (lines overlap almost perfectly); all panels are for  $r_{max} = 0.01$ . NB: Both B, C show a log-scaled X axis to more clearly show dynamics in early generations.

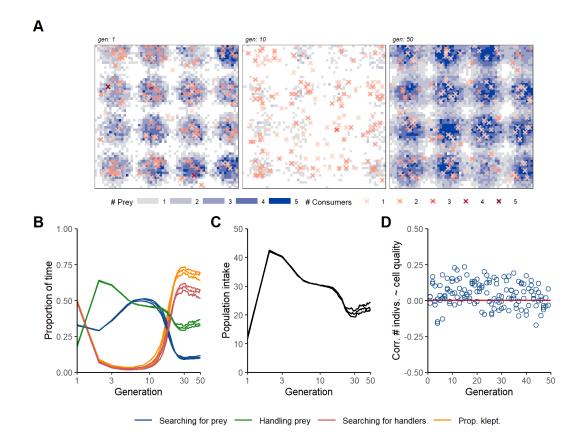


Figure 2: Eco-evolutionary implications of the coexistence of foragers and kleptoparasites (scenario 2). In populations with both foragers and kleptoparasites, (A) the initially wellstocked resource landscape is drastically depleted by generation 10; however, prey densities recover strongly by generation 50, even beyond the densities in generation 1. The local density of individuals on occupied cells is shown as coloured crosses. (B) An equilibrium between the strategies is reached within 30 generations, with the relative frequency of kleptoparasites (orange line) first dropping to very low levels but later recovering to reach a high level ( $\sim 70\%$ ) in all three replicates. The activity budget parallels the relative frequency of kleptoparasites, and at equilibrium, about 10% of the individuals are foragers searching for prey, 50% are kleptoparasites searching for handlers, and 40% are handlers (either foragers or kleptoparasites). (C) In early generations, when kleptoparasites are rare, the population intake rate exhibits the same pattern as in Fig. 1B, dropping to a lower level with the emergence of kleptoparasites. This is accompanied by an increase in the proportion of time spent on stealing attempts (red line − B), and a corresponding decrease in prey seeking (by searching foragers; blue line − B), and handling (green line – C). (D) Cell occupancy (local density of foragers per cell) is only weakly correlated with cell productivity r, dropping to zero at equilibrium. Panel A shows a single replicate, while **B**, **C** and **D** show three replicates; all panels are for  $r_{max} = 0.01$ .

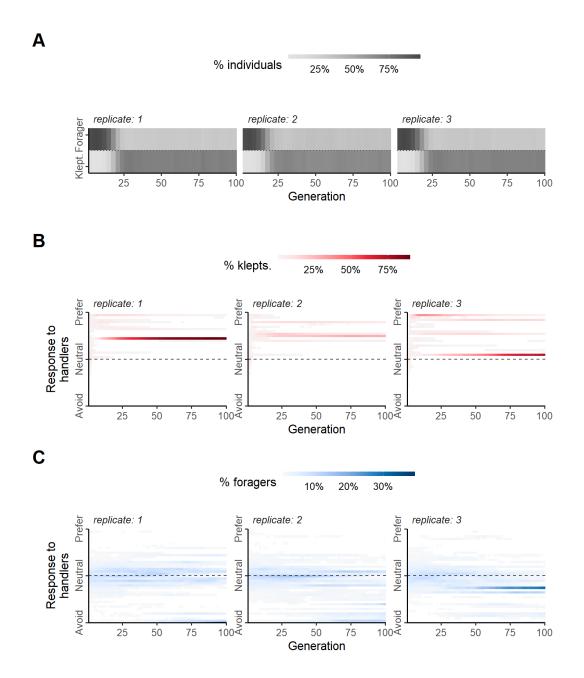
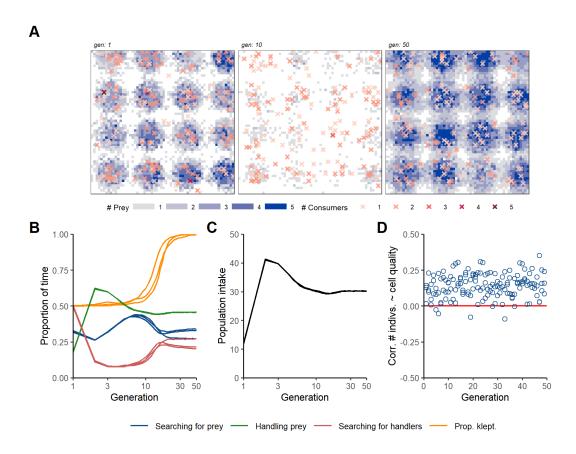
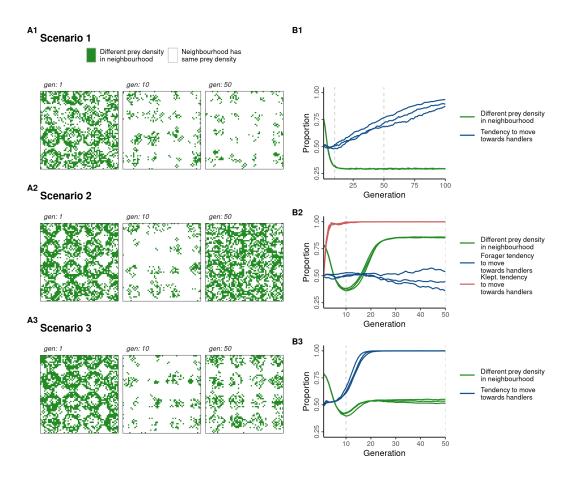


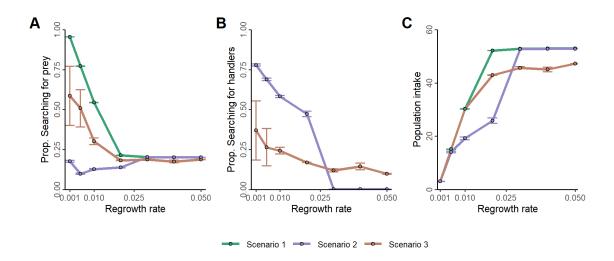
Figure 3: Divergence of movement strategies between foragers and kleptoparasites (scenario 2). (A) Kleptoparasitism rapidly becomes the more frequent strategy in scenario 2 populations for the parameters considered, with no differences across replicates. However, replicates differ considerably in the evolved movement strategies. This is illustrated by the distribution of the weighing factor  $s_H$  (describing the effect of local handler density on the movement decision) in kleptoparasites (B) and foragers (C), respectively. In kleptoparasites, the weights  $s_H$  are generally positive, indicating that kleptoparasites are attracted by handlers. However, different  $s_H$  values stably coexist, indicating that kleptoparasites are polymorphic in their movement strategy. Foragers are also polymorphic in their handler responses: foragers attracted by handlers (positive  $s_H$ ) coexist with foragers repelled by handlers (negative  $s_H$ ). All panels show three replicates at  $r_{max} = 0.01$ .



**Figure 4: Eco-evolutionary implications of conditional foraging strategies (scenario 3). (A)** The initially well-stocked resource landscape is rapidly depleted within 10 generations, yet within 50 generations, prey abundances recover on many cells, though not to the extent of scenario 2. The local density of individuals on occupied cells is shown as coloured crosses. **(B)** By generation 30, all individuals encountering handlers will choose to steal prey rather than search for prey themselves. The proportion of time spent searching (blue line), handling (green line), and stealing prey (red line) also reach an equilibrium that differs somewhat across replicates. **(C)** Yet, the total intake of the population reaches the same equilibrium value in all three replicates. **(D)** The correlation between the local density of individuals on a cell, and its productivity r is stronger than in scenario 2. Panel **A** shows a single replicate, while **B**, **C** and **D** show three replicates; all panels are for  $r_{max} = 0.01$ .



**Figure 5: Uninformative prey densities and the evolution of alternative movement cues. (A1, A2, A3)** On cells coloured green, local prey densities are informative for movement, as the central and neighbouring cells have different prey densities. While differences in local prey densities provide informative cues for 'adaptive' movement in early generations, this is much less true once the resource landscape is depleted of prey items (depending on the scenario). **(B1, B2, B3)** The proportion of cells where differences in local prey densities provide informative movement cues (green line), and the proportion of individuals preferring to move towards handlers (blue line), whose presence may be used as an alternative cue for movement towards higher-productivity areas of the landscape. In **(B2)** representing scenario 2, this proportion is shown separately for foragers (blue line) and kleptoparasites (red line). While panels in **(A)** show a single representative replicate for  $r_{max} = 0.01$ , panels in **(B)** show three replicates.



**Figure 6: Landscape productivity strongly affects scenario outcomes. (A)** The proportion of time spent searching for food decreases with increasing  $r_{max}$  in scenarios 1 and 3 but remains relatively stable within scenarios. This is partly due to a higher proportion of time spent handling at higher prey densities. **(B)** The proportion of time spent searching for handlers (in order to steal prey from them) also decreases with increasing  $r_{max}$ . In scenario 2, kleptoparasites go extinct for  $r_{max}$  values above 0.025. **(C)** At low productivity, the average intake is similar in all three scenarios. For higher  $r_{max}$  values the average intake rate is lowest in scenario, until  $r_{max}$  is larger than 0.025 and kleptoparasites go extinct (leading to the same kind of population as in scenario 1). At high  $r_{max}$ , the average intake rate in populations with conditional kleptoparasites (scenario 3) is substantially lower than in populations without kleptoparasitism.