LETTER

Imperfect prey selectivity of predators promotes biodiversity and irregularity in food webs

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Abstract

Ecological communities are often characterised by many species occupying the same trophic level and competing over a small number of vital resources. The mechanisms maintaining high biodiversity in such systems are still poorly understood. Here, we revisit the role of prey selectivity by generalist predators in promoting biodiversity. We consider a generic tri-trophic food web, consisting of a single limiting resource, a large number of primary producers and a generalist predator. We suggest a framework to describe the predator functional response, combining food selectivity for distinctly different functional prey groups with proportion-based consumption of similar prey species. Our simulations reveal that intermediate levels of prey selectivity can explain a high species richness, functional biodiversity, and variability among prey species. In contrast, perfect food selectivity or purely proportion-based food consumption leads to a collapse of prey functional biodiversity. Our results are in agreement with empirical phytoplankton rank-abundance curves in lakes.

INTRODUCTION

Revealing the mechanisms which account for the high biodiversity observed in nature remains one of the most crucial ecological challenges (Tilman 1982; Kondoh 2003; Ives & Carpenter 2007). Several mechanisms have been suggested to resolve the famous 'paradox of plankton' – the coexistence of many phytoplankton species competing over a few vital resources in an apparently homogeneous environment (Hutchinson 1961). These include spatial and temporal heterogeneity of the environment, environmental fluctuations, non-equilibrium intrinsic dynamics, and non-competitive interactions with other species (Huisman *et al.* 2001; Amarasekare 2003; Scheffer *et al.* 2003; Roy & Chattopadhyay 2007; Ryabov & Blasius 2011).

A body of empirical evidence suggests that predation pressure on competing species occupying the same trophic level can play an important role in promoting biodiversity (Risch & Carroll 1982; Proulx *et al.* 1996; Koen-Alonso & Yodzis 2005). These observations, however, are not fully reflected in ecological theory. Most conceptual models assume that food consumption is non-selective and determined by the relative abundances of prey species, in which case one predator can mediate the coexistence of maximally two prey species sharing a single resource (Holt *et al.* 1994; Leibold 1996). Even in complex 3D ocean marine ecosystem models which incorporate both spatial and temporal heterogeneity, the number of locally coexisting phytoplankton species under proportion-based grazing by zooplankton typically does not exceed three (Follows *et al.* 2007).

This discrepancy can be resolved by assuming food selectivity, or active switching, between multiple prey species (Murdoch 1969). Prey selectivity means that a predator can adaptively adjust its preference for more abundant or more profitable prey, which can arise due to several generic mechanisms. For instance, the consumption of a particular type of prey might require specific strategies or some acclimation time to produce specific digestion ferments (Murdoch 1969; Allen 1988; Kiørboe *et al.* 1996; Gentleman *et al.* 2003; Loeuille 2010). Prey selectivity can enhance species coexistence and food web stability (Roughgarden & Feldman 1975; Hutson 1984; Kondoh 2003; Prowe *et al.* 2012a,b) since the predation pressure on highly abundant competitors disproportionally increases with their population density, thus providing a virtual refuge for weaker competitors (Hambäck 1998; Abrams & Matsuda 2003).

The concept of prey selectivity has been experimentally established for rather small communities and it is not immediately obvious how to scale it up to diverse communities with hundreds of interacting species. The key problem is an appropriate description of the multi-prey functional response of a generalist predator exhibiting food selectivity behaviour (Gentleman *et al.* 2003). A thorough analysis shows that most functional forms which have been proposed in the literature may not be applicable when the number of resources is large (Morozov & Petrovskii 2013). These standard formulations of the functional response assume that the ability of a predator to distinguish between different prey species is independent of the overall number of species. In contrast, here we propose that prey species form functional groups. A predator can only distinguish the species between groups, but has a limited ability to distinguish the species within a group since they are morphologically close. Consequently, the rate at which a prey species is consumed is determined not only by the relative abundance (proportion) of this particular species, but also by the relative abundances of conspecifics with close life traits.

To capture this mechanism we implement a transitional type of functional response with *imperfect prey selectivity,* which combines food selectivity of distinctly different prey species and proportion-based consumption of similar prey (van Leeuwen *et al.* 2013; Morozov & Petrovskii 2013). The implementation of this idea has profound consequences for the prey community composition and can resolve discrepancies between ecological theory and field observations.

We assess the role of imperfect prey selectivity in a generic tri-trophic planktonic system, consisting of a single limiting resource, a large number of primary producers and a generalist predator. Using this system as a paradigm of multi-species communities, we show that imperfect food selectivity allows the maintenance of realistic biodiversity patterns and ecosystem functions, which would not be observable in the context of proportion-based consumption. In particular, we show that an intermediate imperfectness in prey selectivity (1) leads to maximal species richness in the prey guild; (2) is crucial for providing high functional biodiversity (whereas perfect selectivity results in the survival of a single prey group with low resource requirements); (3) gives rise to an irregular structure in the biomass distribution across life traits of prey; (4) has a strong impact on the relaxation time of the community; (5) leads to hump-shaped diversity-productivity relationships, and (6) is able to produce rank-abundance distributions that conform to empirical observations. Our proposed framework is general and should be applicable a wide range of prey–predator systems.

METHODS

Functional response of a generalist predator with imperfect selectivity

Consider a generalist predator feeding on a number of prey species $i = 1, \ldots, n$ with densities P_i. The standard approach to quantify the predator intake rate of prey P_i suggests that

$$f_i = \frac{a_i \rho_i P_i}{1 + \sum_k a_k \rho_k h_k P_k} \tag{1}$$

where ρ_i describes the predator preference, a_i is the attack rate, and h_i the handling time for prey species i. This functional response can be obtained in various ecological scenarios (Koen-Alonso & Yodzis 2005). Most studies assume a constant value of ρ_i for each prey species, independent of the abundance of the others. In this case expression (1) yields the so-called *proportion-based functional response* (Gentleman *et al.* 2003). However, in general ρ_i can be functions of prey densities.

An increasing body of empirical and theoretical evidence suggests that many predators (e.g. zooplankton, fish, birds) exhibit pronounced food selectivity towards more abundant prey (Greenwood and Elton, 1979; Allen 1988; Hughes & Croy 1993; Kiørboe *et al.* 1996; Strom & Loukos 1998; Elliott 2006; Bond 2007; Saha *et al.* 2010; Smout *et al.* 2010). Such frequency-dependent predation can be modelled according to the idea of Koen-Alonso & Yodzis (2005): the predator preference dynamically changes to increase the intake of more abundant species so that the preference for prey species i is proportional to its relative biomass

$$\rho_i = \frac{\eta_i P_i}{\sum_j \eta_j P_j} \tag{2}$$

where the η_i describe the density-independent preferences of the predator for prey species i. We will refer to approach (1,2) as the *perfect prey selectivity* of the predator.

Nonetheless, perfect selectivity is an unrealistic assumption in communities with a broad resource spectrum (Morozov & Petrovskii 2013). Perfect selectivity implies that the predator needs a unique strategy for every single prey species it catches, which reduces its ability to consume any other prey species. As a consequence perfect prey selectivity yields a strong dilution effect, i.e. the reduction in feeding rates with prey richness. Assume for simplicity that all prey are characterised by the same values a, h, and η and the total prey biomass P is uniformly distributed among n species, so that $P_i = P/n$. In the case of perfect prey selectivity (2) we obtain $\rho_i = 1/n$ and the total intake rate

$$f = \sum_i f_i = \frac{aP/n}{1 + ahP/n} \tag{3}$$

equals the intake rate of a predator which either feeds on $1/n$ of the prey population or has an n times lower attack rate (see further detail in online Appendix S6).

In reality, the possible number of predator hunting strategies will typically be much smaller than the number of potential prey. To overcome these problems, we propose that the preference to feed on a particular species should depend on the relative abundance of closely related species. Namely, we define the dynamic preference for prey species i as

$$\rho_i = \frac{\sum_j \eta_j \varepsilon_{ij} P_j}{\sum_j \eta_j P_j} \tag{4}$$

Here, the weight coefficients $\varepsilon_{ij} \in [0, 1]$ describe the pairwise similarities between prey species i and j in terms of the predator's ability to consume prey j when it searches for prey i. The similarity is close to one if feeding on this species requires the same strategy and it is close to zero if feeding requires distinctly different strategies. We also postulate that $\varepsilon_{ii} = 1$. Substituting (4) into (1) we obtain the functional response with *imperfect prey selectivity*.

This framework of imperfect prey selectivity interpolates the previous two functional responses: If all prey species are similar ($\varepsilon_{ij} = 1$) then $\rho_i = 1$ and we obtain the proportion-based response. In contrast, when the consumption of each single prey species requires a unique strategy, then $\varepsilon_{ij} = 0 (i \neq j)$, the ρ_i are given by (2), and we obtain a perfect switching response. In between these two extreme scenarios imperfect prey selectivity (4) yields a transitional functional response. A nearly identical functional response was mechanistically derived by van Leeuwen *et al.* (2013) under the assumption that a predator prefers to feed on species which are similar to previously consumed prey. If the handling times are independent from previous prey, this response corresponds to (1) and

(4) for the case that the density-independent preferences are proportional to the attack rates, $\eta_i \sim a_i$.

The similarity of prey species, ε_{ij}, can correlate with any morphological or biological trait of the prey. We, therefore, associate every prey species with its position in trait space and define the similarity ε_{ij} as a decaying function of the difference in life traits. In the main text we assume that the similarity decays exponentially with the trait difference as

$$\varepsilon_{ij} = \exp\left(-\frac{|H_i - H_j|}{\sigma}\right) \qquad (5)$$

where H_i is a life trait (specified below) and the key parameter σ characterises the degree of imperfectness in the food selectivity of the predator. In the extreme case of $\sigma_i = 0$, all $\varepsilon_{ij} = 0 (i \neq j)$, and for large $\sigma_i (\sigma \gg 1)$, we find that all $\varepsilon_{ij} \to 1$. Note that our main results are generally independent of the shape of the decaying function in (5), for instance, we obtain similar findings when the ε_{ij} are described by a Gaussian function of the trait differences (see Appendix S5).

The food web model

We consider a standard tri-trophic food chain in which a generalist predator of density Z feeds on a number of prey species with densities $P_j(j = 1, \ldots, n)$, which in turn compete for a single limiting resource of density N

$$\frac{dN}{dt} = D(N_0 - N) - \alpha \sum_j r_j(N)P_j \qquad (6)$$

$$\frac{dP_j}{dt} = P_j(r_j(N) - m) - f_j(\vec{P})Z \qquad (7)$$

$$\frac{dZ}{dt} = Z\left(\theta \sum_j f_j(\vec{P}) - m_Z\right) \qquad (8)$$

Here, N_0 is the equilibrium concentration of the resource in the absence of prey, D is the resource supply rate, α is the amount of the limiting nutrient consumed to produce a unit of prey biomass, m is the prey mortality rate, r_j the growth rate of prey j, θ is the food efficiency and m_Z is the mortality of the predator.

The growth rate of each prey species j is described by standard Monod kinetics (Monod 1950)

$$r_j(N) = \mu\frac{N}{N + H_j} \qquad (9)$$

where μ is the maximal growth rate and H_j is the half-saturation constant. From the condition $r_j(N) = m_j$ we obtain the critical resource requirement R_j^* for a monoculture of prey species J, growing in the absence of the predator (Tilman 1982)

$$R_j^* = H_j\frac{m}{\mu - m} \qquad (10)$$

The critical resource requirements are an important physiological characteristic: different functional groups typically possess different resource requirements (Litchman *et al.* 2007). In the case of phytoplankton, cell size – one of the most important morphological characteristics – correlates with species competitive ability for resource acquisition (Edwards *et al.* 2011). Consequently, it is reasonable to assume that species

which occupy close ecological niches also possess close resource requirements, which is expressed in our model by the assumption that the similarity of prey species is associated with their half-saturation constants, H_i.

The predator ingestion rate is given by the functional response of imperfect prey selectivity, eqns (1), (4) and (5). In addition, we assume a linear trade-off between the predator attack rate a and the resource requirements H_i of the prey (i.e. prey species may invest either in resource uptake efficiency or in predator defence).

We parameterise the model to represent a typical plankton community, where N is associated to nitrogen, P_j correspond to the densities of phytoplankton species and Z to that of a zooplankton predator (see Table 1 in Appendix S1). We assume that the critical resource requirements R_j^* of prey species are uniformly randomly distributed within the range $[R_{min}^*, R_{max}^*]$ if the number of the prey species is > 10; otherwise, to minimise the role of random choice for small prey communities, the R_j^* are distributed equidistantly. To achieve a consecutive colonisation of the system, prey species with randomly chosen R^* are subsequently introduced with small initial density at random time instances during the first 25% of the total simulation time. Every simulation is based on a new set of traits. Further model details are found in Appendix S1.

RESULTS

Figure 1 shows the simulated abundance distributions of the prey guild for different numbers n of prey species that have subsequently been introduced into the system. A first insight on the relative abundances is provided by the equilibrium rank-abundance curves (McGill *et al.* 2007), constructed for the cases of perfect ($\sigma = 0$) and imperfect ($\sigma = 0.1$) prey selectivity (Fig. 1a and b). The rank-abundance distributions reveal the typical community patterns of a small number of dominant prey species coexisting with a large number of rare species (see Fig. S3 in the online Appendix S4 for an example of empirical data). In particular, the width of the rank-abundance curve indicates the realised prey species richness. Since some of the n introduced prey species cannot survive the invasion process (i.e. their abundance decreases exponentially to extremely low values) this realised species richness is less than n. Nevertheless, for both selectivity scenarios the realised species richness increases with n and can reach high values. In contrast, in the absence of prey selectivity (i.e. proportion-based feeding response, $\sigma \gg 1$) we find that the maximal possible number of coexisting prey species is limited to two (cf. Leibold 1996). Thus, the coexistence of a large number of prey species can be mediated by prey selectivity of the generalist predator.

A drastic difference between perfect and imperfect prey selectivity becomes apparent from the trait-abundance curves, which show the correlation between species abundances and their life trait, R^* (Fig. 1, bottom). For the case of perfect prey selectivity ($\sigma = 0$), with increasing number n of introduced species the trait-abundance distribution is shifted to the left and ultimately only species with low R^* values survive (Fig 1c). Thus, although the total number of coexisting spe-
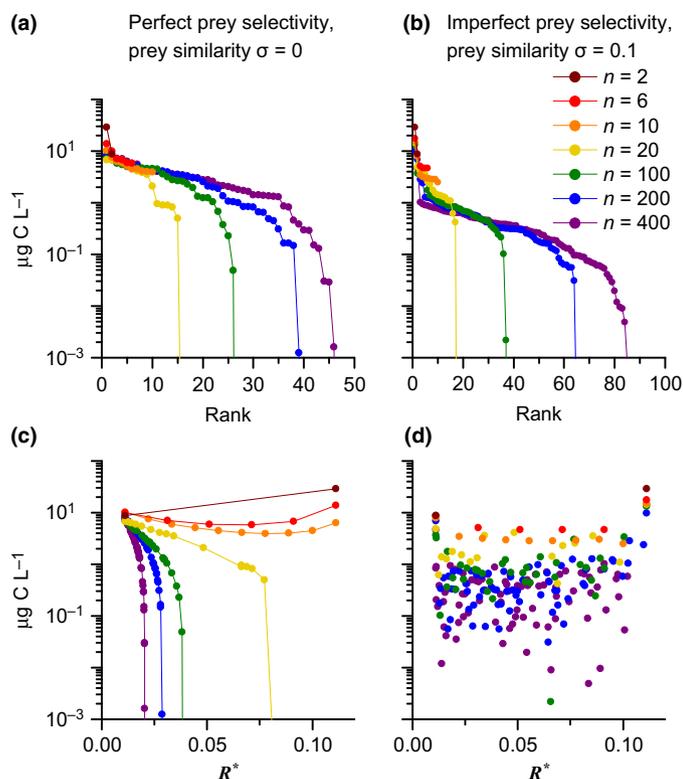
(a) Perfect prey selectivity, prey similarity σ = 0

(b) Imperfect prey selectivity, prey similarity σ = 0.1

- $n = 2$
- $n = 6$
- $n = 10$
- $n = 20$
- $n = 100$
- $n = 200$
- $n = 400$

Figure 1 Long-term density distributions of primary producers (P_i) in the food web model. The figure shows the equilibrium density of each species sorted by species rank (i.e. the rank-abundance curve, top panel) and as a function of its R^* value (i.e. the trait-abundance curve, bottom panel). Only the species with a final biomass > 10^{-5} of the most abundant species are shown. Left column: perfect prey selectivity (σ = 0), right column: imperfect prey selectivity (σ = 0.1). Different colours indicate the number n of species that have subsequently been introduced into the system (i.e. the number of invasion attempts). Parameter values are provided in Appendix S1.

cies formally increases, the functional biodiversity of this assemblage collapses: all surviving species are functionally close to each other and in fact form a single functional group. In contrast, in the case of imperfect prey selectivity (σ = 0.1) increasing n does not affect the trait range of predator-mediated coexisting competitors, and therefore it does not reduce the functional biodiversity (Fig. 1d). Furthermore, in this case the distribution of species abundances appears to be irregular, which means that the relative abundance of a prey species is weakly correlated with its R^* value. We observe this irregular pattern even after very long simulation times under stationary conditions. In contrast, in the case of perfect prey selectivity, the trait-abundance distribution is highly regular and the relative prey species abundance sharply drops for higher R^* values if the community is large enough (Fig. 1c).

Another difference between the cases of perfect and imperfect prey selectivity is related to the system relaxation time, i.e. the typical time scale for species to reach equilibrium densities. Species densities approach equilibria much faster for perfect selectivity than for imperfect selectivity. In fact, the relaxation times in these two cases differ by more than 1–2 orders of magnitude. In our model the community with σ = 0 requires ~ 0.5–3 years to reach an equilibrium,
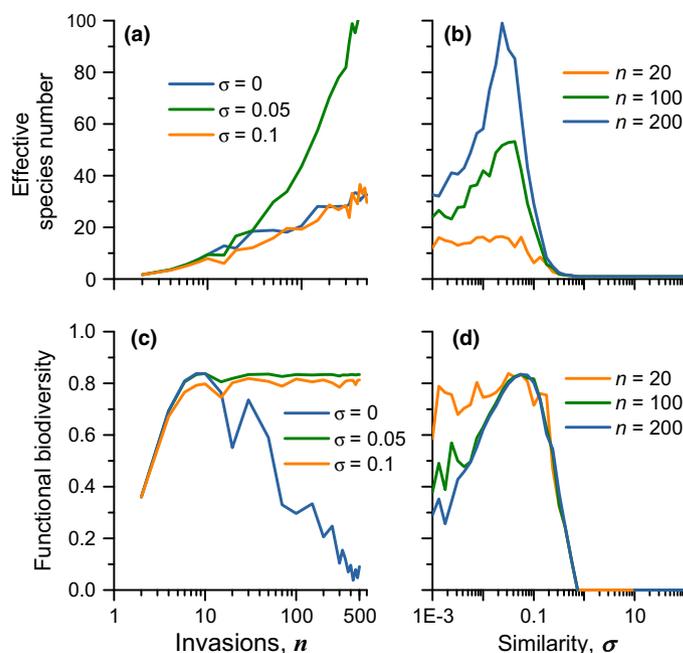

Figure 2 Realised biodiversity of the prey guild. The figure shows the effective species richness (top panel) and the functional biodiversity by Rao's entropy (bottom panel) as functions of the number of introduced species n (left column) and the degree of prey selectivity σ by the predator (right column). Model parameters are as in Fig. 1.

whereas for σ = 0.1 it can take more than 10–100 years. Furthermore, for imperfect selectivity the relaxation time essentially increases with the number of competitors, and the characteristic time scale for species extinction increases with the realised biodiversity (see Appendix S2 for further details).

To quantify the diversity and functionality of the prey community (Mouchet *et al.* 2010) we calculate the effective number of species as the exponential of the Shannon–Wiener index, and the functional biodiversity as Rao's entropy (see Appendix S3 for details). Both for perfect (σ = 0) and imperfect (σ > 0) prey selectivity the effective number of coexisting competitors increases with the number n of introduced prey species (Fig. 2a). This increase in realised species richness shows no signs of saturation with further introductions and it is most pronounced for intermediate levels of prey selectivity (σ = 0.05). In contrast, the indices of functional biodiversity (Fig. 2c) increase with n only for small communities until all open ecological niches are occupied. When this threshold is reached (at about $n \approx 10$ with further species introductions the reaction of the functional biodiversity depends on the degree of prey selectivity: For perfect selectivity (σ = 0) the functional biodiversity starts to drop with n, whereas for imperfect selectivity (σ > 0) it reaches a maximum level and becomes independent of n. This difference in the functional diversity for σ = 0 and σ > 0 formally reflects the structure of the trait-abundance curves shown in Fig. 1c and d. For perfect prey selectivity the addition of new species leads to a collapse of functional diversity. In contrast, the assumption of imperfect prey selectivity leads to a rather intuitive result:

adding new species, which are similar to the resident species does not affect ecosystem functioning.

The resulting community biodiversity strongly depends on the degree of imperfectness in prey selectivity, σ. For instance, the shift from $\sigma = 0.1$ to $\sigma = 0.05$ can triple the effective species richness (Fig. 2a). In Fig. 2b and d we show the effective species number and functional biodiversity as functions of σ. In both cases we find a hump-shaped relationship, with a maximal diversity at an intermediate level of prey selectivity ($\sigma \approx 0.1$). For a further increase of σ both diversity indexes decline rapidly, which corresponds to the small prey diversity in the limit of a proportion-based feeding response. Finally, as described above, the effective species number increases with n in the whole range of σ (see Fig. 2b), but the functional diversity gradually decreases with n at small σ (the range of high prey selectivity) and is independent of n for large σ (Fig. 2d).

To assess the role of imperfectness in prey selectivity for diversity-productivity relationships, we explore the effect of eutrophication (an increase of N_0) on the effective species number and functional biodiversity of the prey guild. For the scenario of imperfect prey selectivity ($\sigma = 0.1$), both biodiversity characteristics exhibit a hump-shaped dependence on the resource supply (solid curves in Fig. 3). In accordance with the theory of apparent resource competition (Leibold 1996) we obtain the dominance of good nutrient competitors at low concentrations of the supplied resource, the dominance of better defended prey with high resource requirements at high N_0 (i.e. the dominance of prey with large resource requirements and low attack rates from predators due to the built-in trade-off), and the maximal biodiversity at intermediate N_0 when both the resource and predator limitations play a role (see Appendix S4 for corresponding trait-abundance curves). This hump-shaped relationship is lost with perfect prey selectivity ($\sigma = 0$), where both biodiversity measures increase monotonically with N_0 (dashed curves in Fig. 3). Thereby, similar to Fig. 2, the functional diversity is greatly reduced with the introduction of new prey species for ($\sigma = 0$), but it is retained for imperfect prey selectivity.

To study the influence of the prey community diversity more systematically, in Fig. 4 we investigate the ambient resource concentrations and the total biomass accumulated in each trophic level in dependence of the number of introduced prey species n. Assuming perfect prey selectivity ($\sigma = 0$) we find that an increase in n leads to a drastic decrease in predator density, whereas the overall prey density increases (blue curves, see also Prowe *et al.* 2012b) – which leads us to the counterintuitive conclusion that an abundant and diverse prey community might favour predator extinction (Fig. 4a). This peculiar behaviour does not occur in the more realistic scenario of imperfect food selectivity. In this case ($\sigma > 0$), the realised biomasses vary with the number of introduced prey only for small community sizes, when all prey species are well distinguishable and the predator must choose between these prey types. As soon as all functional niches are occupied (for the given parameters at about $n \approx 10$, further species introductions do not change the overall prey and predator biomass, or the resource concentration. In particular, in this case a large prey community does not drive the predator towards extinction.
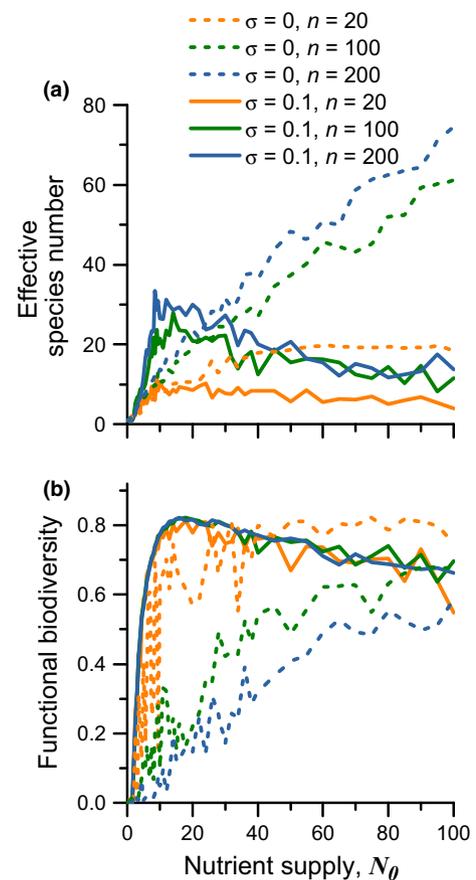

Figure 3 Effect of nutrient enrichment on biodiversity. (a) Effective species number and (B) functional biodiversity by Rao's entropy in dependence of the nutrient supply N_0, for the case of perfect prey selectivity ($\sigma = 0$, dashed curves) and imperfect prey selectivity ($\sigma = 0.1$., solid curves). Different colours indicate the number of introduced species $n = 20$ (orange), $n = 100$ (green) and $n = 200$ (blue). Model parameters are as in Fig. 1.

The mechanism for the discrepancy between the scenarios of perfect and imperfect prey selectivity can be related to the structure of the intake rate (1). Perfect selectivity assumes that the preference for each prey species is proportional to its relative abundance, see (2). However, the accumulated biomass per species decreases with the number of species in the system, so, in the case of perfect selectivity the intake rate vanishes for diverse prey communities (see eqn (3) and Appendix S6). As a consequence, with increasing prey diversity, the system undergoes a transition from a predator driven community to a community shaped by competition for the limiting resource, in which prey species with the lowest resource requirements dominate (see Fig 1c). In contrast, the scenario of imperfect switching assumes that the preference ρ_i for a particular prey species i depends on the total abundance of the whole functional group, which in turn is only weakly related to the overall biodiversity, provided that all ecological niches are occupied. Thus, in the case of imperfect prey selectivity, the intake rate does not vanish with increasing prey biodiversity, and the same mechanism mediating the coexistence of a few prey species is retained for dozens of species.
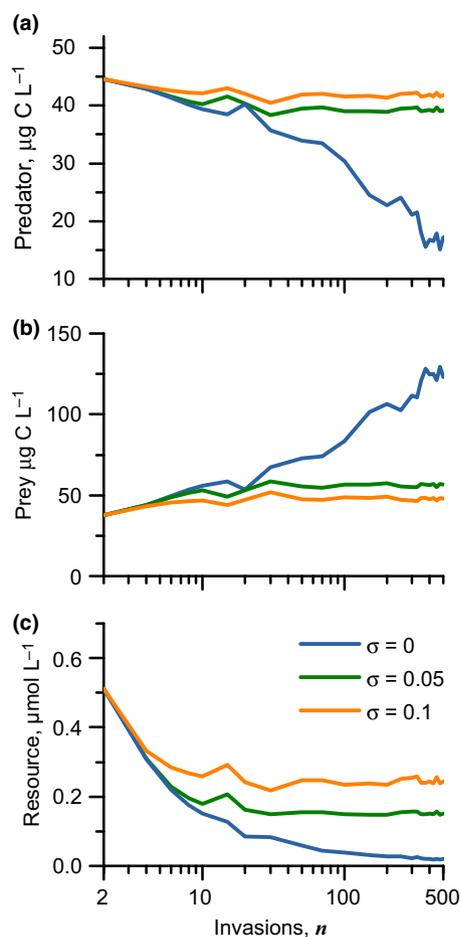
Figure 4 Effect of the number of introduced species n on the total predator biomass Z (top panel), the total biomass of primary producers $\sum P_i$ (middle panel), and the resource concentration N, for different levels of prey selectivity, $\sigma = 0$ (blue), $\sigma = 0.5$ (green) and $\sigma = 0.1$ (orange). Model parameters are as in Fig. 1.

DISCUSSION

We have introduced a functional response with imperfect prey selectivity by a generalist predator feeding on multiple prey. The main novelty here is that the preference for a certain prey species depends not only on the relative abundance of this prey but also on the abundances of other functionally close species. Thus, our approach combines patterns of selectivity for distinctly different prey species with patterns of proportion-based consumption within a group of prey with close life traits. Implementation of the new functional response in a generic food web model reveals important consequences for ecosystems functioning. It provides a straightforward solution to the famous paradox of plankton – the possibility of coexistence of a large number of species in an apparently homogeneous environment – and at the same time it is free from several biological artefacts inherent to the perfect switching scenario.

Our model can explain the high biodiversity observed in communities of species competing over a limited number of resources. The maximal effective species richness and functional diversity is reached for an intermediate level of prey

selectivity. In this range of imperfect prey selectivity our model is able to reproduce the characteristic shape that is observed in empirical abundance distributions (see online Appendix S4). Compare, for example our simulated rank-abundance curves (Fig. 1b and Fig. S2) with Fig. S3, which shows a typical rank-abundance distribution of a phytoplankton community in Lake Lugano (Pomati *et al.* 2011). In contrast, we were not able to match empirical abundance distributions with perfect prey selectivity: the simulated rank-abundance curves are always either flat or concave and do not show a group of highly abundant species (Fig. 1a, Fig. S2).

Our study provides a new solution to the long-standing ecological enigma of why plankton communities are never at equilibrium (Scheffer *et al.* 2003). We show that the assumption of imperfect predator switching results in extremely long times required to achieve equilibrium: non-equilibrium patterns are found even after more than 100 years of simulation time under stationary environmental conditions. The enlarged relaxation times can be explained by our key assumption that grazing depends on the total abundance of functionally close prey. Thus, density fluctuations within a functional prey group can compensate each other as they are added up in the grazing rate. Thereby, the feedback between abundance fluctuations and species specific grazing pressure is suppressed and all fluctuations decay extremely slowly, which can strongly limit our ability to observe ecological equilibria in realistic conditions.

We have shown that the assumption of perfect selectivity, which has been widely used to explain prey biodiversity, leads to a number of artefacts. In particular, increasing prey diversity n leads to a collapse of prey functional biodiversity (Fig. 1c) and to a decrease in the predator biomass with a simultaneous increase in the total prey biomass (Fig. 4). We have demonstrated that these effects mechanistically originate in a severe dilution effect, i.e. the reduction in feeding rates with increasing number of prey species (2). In contrast, these artefacts disappear with imperfect selectivity. In this case, increasing prey diversity n increases or has no effect on the functional biodiversity (Fig. 1c). The decay of predator biomass with increasing prey biomass arises only for small n where some ecological niches are available (Fig. 4). As soon as all ecological niches are occupied, any further increase in n does not affect the total prey and predator biomass. These findings are in agreement with experimental results (Loreau & Hector 2001) which show a saturation of productivity with increasing consumer richness.

Our results are in good agreement with keystone predation competition theory (Leibold 1996). Assuming a trade-off between prey resource requirements and vulnerability to predation, we find that with increasing nutrient loads the dominance of good nutrient competitors is replaced with the dominance of predator resistant prey species (Fig. S2). The transition in the prey assemblage can result in a hump-shaped diversity-productivity relationship, with a maximal biodiversity at an intermediate nutrient load (Fig. 3) – in accord to empirical observations (Chase & Leibold 2003).

We intentionally kept the model simple to identify the main mechanism of species coexistence. In particular, we varied only

two traits of the prey species: half-saturation constants vs. attack rates, we restricted the analysis to equilibrium situations and we did not consider the case of multiple predator species. While our findings are fairly robust, we found that the way we link the pairwise prey similarities ε_{ij} with species traits may play an important role. To test this we first assigned prey similarities in a random way, resulting in less diverse prey communities as the consumption of similar prey species with essentially different traits becomes density proportional and the outcome follows the keystone predation model. Second, we examined another generic case, when the prey similarities ε_{ij} in eqn (5) decay as a Gaussian function (see Appendix S5). Our main findings were unaffected, however, the competing species appear to form clusters of functionally similar prey species in niche space. Namely, the distribution of species over the trait axis is not homogenous as in Fig. 1d, but instead approaches a function with strong peaks at singular values of R^*, separated by almost empty ranges in which all competitors become extinct. Such clustering can provide a possible explanation for the non-homogeneous distribution of species in life traits that has been observed in empirical studies (e.g. Havlicek & Carpenter 2001; Litchman et al. 2009). The emergence of species clustering was previously found in other models using a non-local competition kernel (Roughgarden 1998; Scheffer & van Nes 2006). Our work emphasises a strong sensitivity of this phenomenon on the particular choice of this function (cf. Pigolotti et al. 2007). Notwithstanding, the other our conclusions are largely independent from the specific analytic form, and the associated ecological assumptions, of the used functional response. We have obtained qualitatively the same results with the functional response by Morozov & Petrovskii (2013) and with different parameterisations of our functional response (Appendix S7).

Overall, revealing the 'true' multi-prey functional response of a generalist predator remains a challenge. Even though active predator switching is well documented in natural ecosystems (Murdoch 1969; Gentleman et al. 2003), empirical support for imperfect switching is hard to come by. There is ample evidence that switching is related to a learning effect, search image formation or behavioural changes in foraging mode that increase the rate of encounter of certain prey species at the expense of encounters with others (Allen 1988; Loeuille 2010). Thereby predators frequently select for prey that are different in more or less continuous life traits, such as body size, colour, mobility, or habitat choice (Hughes & Croy 1993; Elliott 2006; Bond 2007; Saha et al. 2010; Klecka & Boukal 2012) – corresponding to our formulation of prey similarity in trait space, Eq (5). In this generic situation imperfect selection will result from any proximate mechanism that will cause a predator to select prey only within a degree of uncertainty in trait space, as expressed by our imperfectness parameter σ. For instance, many predators cannot easily distinguish close colours or shapes (Allen 1988; Bond 2007) or focus on prey from a narrow size range (Elliott 2006; Saha et al. 2010) so that the discovery or intake rate will be disproportionally higher for prey with close traits to the preferred prey, even if they are rare. As shown in our model simulations this effect has drastic consequences on a community level already when the level of imperfectness σ is very small. Thus, our model results should be relevant for a wide range of

ecological situations where predators can select for prey from a continuous spectrum of life traits.

Our theoretical results suggest that we may need to rethink the role of generalist predators in maintaining diversity. Further progress will ultimately depend on testing our predictions in natural communities. One crucial step in this direction will be the direct evaluation of the multi-species functional response in empirical studies or in laboratory experiments, which would require the precise measurement of predation rates for different combinations of prey frequencies. Ideally such experiments would be designed to allow a control of trait similarity (e.g. by different prey selections from a continuous spectrum of life traits, as described above) or imperfectness of prey selectivity (e.g. by manipulating the predator's search image formation or prey detection ability). In the least, such experiments should involve three prey species, but more informative results could be achieved with larger prey communities of more than 10 species, which would allow to observe rank-abundances curves, biomass distributions across life-history traits of prey and variability among prey. The combination of such empirical investigations with theoretical studies could provide us with the crucial information needed to advance our understanding about the role of imperfect prey selectivity for promoting biodiversity and irregularity in food webs.

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AUTHORSHIP

All authors designed this study. ABR and AM performed numerical simulations. All authors contributed substantially into writing the manuscript.

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SUPPORTING INFORMATION