1	Ecological theory of mutualism: Models generalizing across different mechanisms
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- 28 manuscript.
- 29 Code availability: Mathematica notebooks used to analyze the models are available by
- 30 request and will be available on GitHub upon acceptance.

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Abstract

32 Mutualisms are ubiquitous in nature, provide important ecosystem services, and 33 involve many species of interest for conservation. Theoretical progress on the population 34 dynamics of mutualistic interactions, however, has comparatively lagged behind that of 35 trophic and competitive interactions. Consequently, ecologists still lack a generalized 36 framework to investigate the population dynamics of mutualisms. Here, we propose 37 extensible models for two-species mutualisms focusing on nutritional, protection, and 38 transportation mechanisms and evaluate the population-level consequences of those 39 mechanisms. We introduce a novel theoretical framework that highlights characteristic 40 dynamics when the effects of mutualism are directly dependent or independent of recipient 41 density and when they saturate due to inter- or intra-specific density-dependence. We end 42 by integrating our work into the broader historical context of population-dynamic models of 43 mutualism and conclude that a general ecological theory of mutualism exists.

4

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Introduction

45 Mutually beneficial interactions are ubiquitous in nature. Nearly all species on Earth 46 participate in at least one of four main types of mutualism: seed dispersal, pollination, 47 protection, and resource exchange including with symbionts (Janzen 1985, Bronstein 48 2015a,b). These interactions also support an immense amount of ecosystem function. For 49 example, up to $\sim 3/4$ of phosphorus and nitrogen acquired by plants is provided by 50 mycorrhizal fungi and nitrogen-fixing bacteria (van der Heijden *et al.* 2008) and $\sim 1/3$ of 51 crop production is dependent on animal pollination (Klein *et al.* 2007). Yet, the importance 52 of mutualism for ecological communities has only recently been recognized (Bronstein 53 2015b) and, accordingly, theory has lagged behind. Such theory is critical as anthropogenic 54 perturbations like climate change, nutrient runoff, pesticide use, and invasive species 55 increasingly threaten many mutualisms and the ecosystem services they provide 56 (Stachowicz 2001, Tylianakis *et al.* 2008). Here, we develop simple but extensible theory 57 (i.e., can be specified to particular systems or generalized to networks of species 58 interactions) on the population dynamics of two-species mutualisms, which integrates 59 mutualisms into the broader framework of community ecology. 60 Theoretical study of mutualism has lagged behind the other two "pillars" of 61 community ecology: competition and predator-prey interactions (Callaway 2007). This has 62 been attributed to many reasons, three of which we highlight here. First, the terms used to 63 identify interactions as "mutualism" have changed over time. Previous theory treated 64 mutualism as a subset of facilitation, in which one species alters the environment to benefit a neighboring species (Callaway 2007), or symbiosis, in which species coexist in 65

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66 "prolonged physical intimacy" (Bronstein 2015b), or used those terms interchangeably. We
67 limit our scope to mutualism defined as reciprocally beneficial interactions between species
68 without reference to the partners' intimacy or environmental effects, though our work could
69 be adapted to these other cases (see, e.g., Thompson *et al.* 2006).

Second, incredible diversity among mutualisms led researchers to focus on natural
history, resulting in a heterogeneous set of case studies with little to no theory to unify or
partition them (Addicott 1981, Bronstein 2015b). Some conceptual frameworks have
attempted to organize this rich diversity, for example, by the types of benefits exchanged,
the mechanisms of exchange, or the obligacy of each partner (reviewed in Bronstein 2015b,
Douglas 2015).

76 Third, the development of population dynamic models for mutualism was stifled by 77 the belief that simple mathematical approaches make unrealistic predictions. Foundational 78 theory in community ecology developed from Lotka-Volterra models, which use linear 79 functional responses to describe the effect of the interaction on each species. The Lotka-80 Volterra model can predict stable cycles (oscillations) for predator-prey interactions (Lotka 81 1925, Volterra 1926) or competitive exclusion for competition interactions (Volterra 1926, Gause 1934) - outcomes that stimulated fruitful empirical and theoretical work. In contrast, 82 83 the Lotka-Volterra model for mutualistic interactions (Kostitzin 1934, Gause & Witt 1935) 84 can predict unbounded population growth of both species ("the orgy of mutual 85 benefaction," May 1976). Theoretical work stagnated for nearly fifty years as authors 86 attributed the supposed rarity of mutualism in natural ecosystems to the unstable nature of 87 this outcome (e.g. Williamson 1972, May 1973, Goh 1979).

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88 Population dynamic studies of mutualism began to reemerge in the 1980s, perhaps due 89 to an increasing awareness of the prevalence and importance of mutualistic interactions 90 (Boucher 1985, Bronstein 2015b). Authors showed that mutualism could be stabilized by 91 incorporating negative density-dependence or mechanistic detail that explicitly limits 92 benefit acquired from mutualism (see Table A1 of Appendix A). However, these models 93 were criticized as either too case-specific to be useful or too abstract to be applicable 94 (Bronstein 2015a). A handful of works have attempted to bridge this gap by organizing 95 extant knowledge both conceptually and mathematically. For example, Addicott (1981) 96 organized models by their effects on per-capita growth rate and/or equilibrium density for 97 both participating species. Wolin and Lawlor (1984) categorized ways in which 98 intraspecific density-dependence could limit benefits and stabilize mutualisms. Thompson 99 et al. (2006) proposed a theoretical framework that organized mutualisms into those that 100 affect birth rate, death rate, or habitat acquisition for each partner and predicted their 101 ecological dynamics when immigration and emigration occur (i.e., in open systems). Most 102 recently, Holland and DeAngelis (2010) categorized mutualisms as following 103 "unidirectional" or "bidirectional" consumer-resource dynamics, in which one or both partners benefit from consuming costly resources provided by the other. 104 105 Despite these past advances, an "ecological theory of mutualism" has not penetrated 106 into the greater ecological community (see recent textbooks, e.g., Gotelli 2008, Vandermeer 107 & Goldberg 2013, Mittlebach & McGuill 2019). Calls continue for simple but usable 108 theory that synthesizes among mutualisms to identify patterns in population dynamics and 109 in the mechanisms that generate them (e.g. Addicott 1981, Callaway 2007, Bronstein

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110	2015a). To that end, we develop theory in which the "benefits" of mutualism are an
111	outcome of mechanisms that increase the per-capita growth rate of a population compared
112	to that rate in the absence of its mutualistic partner. We derive models focusing on
113	observable mechanisms so that each mathematical expression represents biological
114	phenomena justified with empirical examples. Then, we synthesize a conceptual and
115	mathematical framework that predicts population dynamics across mutualisms. Our work
116	demonstrates that there is an ecological theory of mutualism that deserves attention from
117	ecologists in general.

118

Methods

119 Growth rate of any population *i* can be described as the difference between the 120 population's reproduction and mortality rates, which are functions of the density-121 independent per-capita birth (b_i) and death (d_i) rates, as well as per-capita self-limitation 122 and other density-dependent processes (s_i) . In the absence of mutualism, we represent 123 changes in population density (N_i) over time (t) as:

124
$$\frac{dN_i}{dt} = N_i [b_i (1 - s_i N_i) - d_i].$$
 Eqn. 1

Eqn. 1 is continuous, deterministic, and ignores migration, which accommodates species
with overlapping generations and allows us to focus on how the balance of births and
deaths in a population leads to different dynamics, unobscured by stochasticity and the
dynamics of other patches.

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129	Nearly all mutualisms consist of an exchange of nutrition, protection, or
130	transportation benefits. We derive and analyze models from Eqn. 1 for the most common
131	exchanges: nutrition-for-nutrition, nutrition-for-protection, and nutrition-for-transportation
132	(hereafter "nutrition," "protection," and "transport" mutualisms, respectively). Our
133	equations for each type of benefit can be mixed-and-matched for different systems, like the
134	protection-for-protection mutualism between clownfish and anemones (Table 1). Each of
135	our models accommodates populations of both "obligate" mutualists that cannot persist in
136	the absence of their partner and "facultative" mutualists that are self-sustaining. Table 2
137	summarizes our parameter definitions for all models.
138	

Type of Mutualism	Examples	Dynamics of Sp. 1	Dynamics of Sp. 2
	Sp. 1 / Sp. 2		
Nutrition-for- Nutrition	Plant / Microbe (<i>mycorrhizae, rhizobia</i>)	Eqn. 2 w/ M-M	Eqn. 2 w/ M-M
Nutrition-for- Protection	Plant / Ant Animal (lycaenid caterpillars, scale insects, aphids) / Ant	Eqn. 3	Eqn. 2 w/ H-II
Nutrition-for- Transportation	Plant / Pollinator Plant / Seed Disperser	Eqn. 4	Eqn. 2 w/ H-II
	(ants, frugivores)	Eqn. 5	
Protection-for- Protection	Anemone / Clownfish	Eqn. 3	Eqn. 3

139 Table 1. Population dynamic models for different types of mutualism. Mutualisms are grouped by the

140 types of benefits exchanged (nutrition, protection, and transportation) between species (Sp. 1: N_1 , Sp. 2: N_2),

141 and their functional responses (M-M: Michaelis-Menten, H-II: Holling Type II). Additional models (with

142 qualitatively similar results) are presented in Appendices A, C.

9

Nutrition

143

144 A unifying feature of many mutualisms is that they involve nutritional mechanisms, 145 in which the benefit to one species is gained by consuming nutritional rewards from its 146 partner (Thompson 1982, Janzen 1985, Table 1 of Holland & DeAngelis 2010). For 147 example, pollinators forage on nectar from flowers and mycorrhizal fungi uptake carbon 148 from root nodules. We modify Eqn. 1 so that when *i* consumes the rewards of *j* with rate 149 $C_R(N_i)$, the per-capita growth rate of *i* increases proportionally: $\frac{dN_i}{dt} = N_i \left[b_i (1 - s_i N_i) + c_{ij} C_R \left(N_i, N_j \right) - d_i \right]$ 150 Eqn. 2 where c_{ij} is the conversion efficiency of j's rewards to new individuals of i. If i forages for 151 the rewards, the per-capita consumption $C_R(N_i, N_j) = \frac{a_{ij}N_j}{1 + a_{ij}h_{ij}N_i}$ follows a Holling Type II 152 153 functional response with attack rate a_{ij} and handling time h_{ij} . If i uptakes the rewards directly (e.g., via diffusion), the per-capita consumption $C_R(N_i, N_j) = \frac{v_i N_j}{k_{ij} + N_j}$ follows 154 Michaelis-Menten kinetics with maximum uptake rate v_i and half-saturation constant k_{ii} 155 (i.e., the density of *j* at which half the maximum uptake rate is achieved). Both forms 156 157 encode the reasonable assumption that i's consumption rate on j's rewards saturates with increasing density of j. Indeed, the expressions are identical when $a_{ij} = v_i/k_{ij}$, $h_{ij} = v_i/k_{ij}$ 158 $1/v_i$. Species *i* is an obligate partner of *j* when $r_i = b_i - d_i < 0$; otherwise $(r_i \ge 0)$, *i* is 159 160 facultative.

161 Eqn. 2 is the most similar of our models to previous theory. It is an extension of the 162 consumer equation of Rosenzweig and MacArthur's (1963) model when $b_i > 0$, and

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163	identical to Wright's (1989) model in which nutritional benefits saturate as a result of
164	constraints on handling time during foraging. It is also identical to Holland and DeAngelis'
165	(2010) equation for consumer mutualists that do not supply rewards (Table A1).
166	

Internretation

Parameter	for recipient <i>i</i> of benefit from resource or partner <i>j</i>	Units	
a _{ij}	Per-resource attack rate	Resource ⁻¹ Time ⁻¹	
b _i	Per-capita birth rate or seed production	Time ⁻¹	
C _{ij}	Conversion efficiency of resource to offspring	Unitless	
d_i	Per-capita death rate	Time ⁻¹	
g_i	Maximum fraction of seeds that recruit to maturity	Unitless	
h _{ij}	Handling time on resource	Time	
k _{ij}	Half-saturation density of resource	Resource	
s _i	Per-birth, per-capita negative density-dependence due to, e.g. self-limitation during recruitment, Janzen-Connell effect	Density ⁻²	
v_{ij}	Maximum uptake rate of resource	Time ⁻¹	
<i>Y</i> _{ij}	Per-partner average seed set	Partner ⁻¹	

168 positive (> 0). The unit "Density" refers to population *i*, while the units "Resource" and "Partner" (depending

169 on the system) refer to densities of population *j*. Subscripts max, min, and diff indicate the maximum,

170 minimum, and difference, respectively, in a parameter value due to mutualism.

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Protection

172 Protection mechanisms characterize a wide array of interactions in which the 173 presence or behavior of a species protects another from natural enemies. The best-studied 174 protection mutualisms are between ants and rewards-provisioning species like plants, 175 lycaenid caterpillars, scale insects, and aphids (Ness et al. 2010). Ants harvest rewards like 176 nectar, food bodies, and honeydew while cultivating and defending their resources through 177 deterrence, attendance, and direct attack. Though these protection services have been 178 observed to increase reproduction, the primary benefit to the resource species is a reduction 179 in mortality due to, e.g., natural enemies including herbivores, predators, and parasitoids 180 (Ness et al. 2010, Trager et al. 2010). Therefore, we assume that benefits of protection 181 services (S) are exclusively reductions in per-capita death rate. We model these reductions 182 as the difference between the maximum per-capita death rate of *i* inflicted by its natural enemies $(d_{i_{max}})$ and the protection services provided by j, $d_{i_{diff}}S(N_i, N_j)$, which 183 184 incorporated in Eqn. 1 yields:

185
$$\frac{dN_i}{dt} = N_i \left[b_i (1 - s_i N_i) - \left(d_{i_{max}} - d_{i_{diff}} S(N_i, N_j) \right) \right]$$
Eqn. 3

186 where $d_{i_{diff}}$ is the maximum reduction in *i*'s death rate caused by *j*'s protection, with 187 minimum death rate $d_{i_{min}} = d_{i_{max}} - d_{i_{diff}} \ge 0$. Species *i* is obligate upon *j* when $r_i =$ 188 $b_i - d_i < 0$; otherwise *i* is facultative.

We assume that the protector population *j* benefits from foraging on rewards
provided by *i* and, therefore, model its dynamics with Eqn. 2 using the foraging functional

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191 response (Table 1). If *j* reduces mortality via simple deterrence ("scaring off" natural enemies), we choose $S(N_i, N_j) = \frac{N_j}{k_{ij} + N_j}$ so that per-capita death rate declines proportional 192 193 to j's perceived abundance around the recipient species, saturating when j's density is high. 194 We consider other mechanisms of protection in Appendix C. 195 The nutrition (Eqn. 2) and protection (Eqn. 3) equations are identical when using 196 the Michaelis-Menten functional response, with $d_{i_{max}} = d_i, d_{i_{diff}} = c_{ij}v_i$. Eqn. 3 is also similar to Thompson *et al.*'s (2006) model for protection mutualisms in open systems. 197 198 when immigration and habitat provisioning are assumed to be negligible (Table A1). 199 Transport 200 Transportation mechanisms characterize the best studied mutualisms, perhaps due to 201 the astonishing diversity by which immobile species attract more-mobile species to disperse 202 their gametes. In the most common interactions (pollination and seed dispersal), animals 203 visit plants to feed on rewards (including nectar and fruits), providing reproductive services 204 (transport of pollen and seeds) incidentally during foraging. Except in special cases (e.g., 205 male bees visiting flowers to collect "perfume"), these rewards offer primarily nutritional 206 benefit (Willmer 2011). Thus, we model the dynamics of transporter populations (i) using 207 Eqn. 2 with the foraging functional response (Table 1).

For plant populations (*i*) that receive reproductive services (*S*), we define b_i as percapita seed set, g_i (> 0, \leq 1) as the constant fraction of total seed set that germinates, and s_i as negative density-dependence (e.g., Janzen-Connell effect, seed competition for recruitment). Plant *i* is obligate upon *j* when $r_i = g_i b_i - d_i < 0$; otherwise *i* is facultative.

212Reproductive services are functions of *j*'s visitation to *i* (see below) and increase the213number of mature individuals in *i*. We derive separate models for pollination services214(which increase seed set) and seed dispersal services (which decrease mortality during215recruitment). We assume that foraging rate on rewards (
$$C_R$$
) is a good proxy for visitation216rate. Though some visits are unsuccessful due to depleted rewards or deception, we217consider this mathematically similar to a predator unsuccessfully attacking a prey.218Modifying Eqn. 1 for pollination benefits yields:219 $\frac{dN_i}{at} = N_i [g_i (b_i + y_{ij} S(N_i, N_j))(1 - s_i N_i) - d_i]$ 210requires the transfer of pollen from one individual's flower to the stigma of a conspecific211plant individual, which occurs when animals visit flowers to forage. We therefore assume223 $S(N_i, N_j) = C_R(N_i, N_j) * N_i = \frac{a_{il}N_j}{1 + a_{ij}h_i/N_i}N_i$, where the contribution of the animal224population (*j*) to per-capita seed set is proportional to *j*'s total foraging rate on *i*, calculated225by multiplying *j*'s per-capita foraging rate on *i*'s rewards with plant density (N_i). This226expression accounts for the repeated interactions between plant and animal individuals227required for conspecific pollen transfer (Vázquez *et al.* 2005).28In seed dispersal interactions, animals visit plants to forage on fruit or claiosomes,29later depositing the seed away from the parent plant. This process may increase germination226rate by improving seed condition during passage throu

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232 predators and pathogens, which are most abundant near adult plants (Fricke *et al.* 2013). We assume that negative density-dependence $(s_{i_{max}})$ can be reduced to a minimum of 233 $s_{i_{min}} = s_{i_{max}} - s_{i_{diff}} \ge 0$ when dispersal services (S) are maximally effective. Modifying 234 235 Eqn. 1 yields: $\frac{dN_i}{dt} = N_i \left[g_i b_i \left(1 - \left(s_{i_{max}} - s_{i_{diff}} S(N_i, N_j) \right) N_i \right) - d_i \right]$ 236 Eqn. 5 We assume $S(N_i, N_j) = C_R(N_i, N_j) = \frac{a_{ji}N_j}{1 + a_{ji}h_{ii}N_i}$, where the contribution of animals (*j*) to 237 238 per-capita seed set is proportional to *i*'s per-capita (instead of total) foraging rate on *i*, 239 because repeated interactions between plant and animal individuals are possible but not 240 required for effective seed dispersal (as opposed to the requirement for effective pollination). To ensure that $s_{i_{min}} = s_{i_{max}} - s_{i_{diff}} \ge 0$, we choose parameter values that 241 fulfill $s_{i_{max}} - \frac{s_{i_{diff}}}{h_{ii}} \ge 0.$ 242 243 Eqn. 5 differs from previous models mathematically, but is conceptually similar to 244 earlier theory that modeled mutualistic benefits as increasing carrying capacity (Whittaker 245 1975, Dean 1983, Wolin & Lawlor 1984, Neuhauser & Fargione 2004, Graves et al. 2006, 246 see Table A1), which is analogous to reducing the magnitude of negative density-

247 dependence. However, our pollination model (Eqn. 4) differs substantially from previous

work in the two-species population dynamic literature (Table A1). Its uniqueness is due to

- the conceptually-important choice for negative density-dependence to limit (using a
- 250 multiplied term) the fraction of fertilized ovules that survive as seedlings to mature to
- 251 reproductive adults. If we instead assume that negative density-dependence limits overall

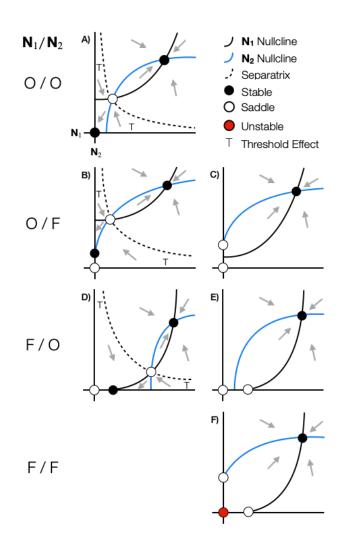
per-capita growth (using an additive term) as in previous works, our pollination and seeddispersal models would be mathematically identical.

254

Rewards and Other Costs of Mutualism

255 Species that receive services often offer nutritional "rewards" to attract their partner. 256 These rewards are often partitioned from other components of the individual and have a 257 unique chemical composition. Plants can produce nectar, a simple sugary solution, in 258 flowers or nectaries separate from their vegetation, which is constructed from more 259 complex carbohydrates and defensive compounds. Aphids and other hemipterans secrete 260 honeydew that can be harvested separately from the rest of their body mass without killing 261 individuals in the population. Nutritional mutualisms also follow this rewards paradigm 262 with species provisioning a non-limiting resource in exchange for the acquisition of a 263 limiting resource (Bronstein 2009). 264 Are rewards costly to offer? Evidence is sparse. Some rewards are waste products 265 (Ness *et al.* 2010, e.g. honeydew is partially-digested phloem) that can even harm 266 individuals if not removed (Gullan 1997), while other rewards are costly to individuals to 267 construct (Brandenburg et al. 2012) or to have exploited (Yao & Akimoto 2001). However, 268 these individual-level costs are likely to be buffered at the population level (see discussion 269 in Appendix A). We therefore assume that costs associated with rewards do not 270 substantially impact population density or, if they do, the impact could be represented as 271 small changes to per-capita birth and death rates approximated as constant with respect to 272 the producing species' density. Other costs including increased handling time when 273 foraging or increased exposure to parasites transported by visitors are also likely to be

274	negligible or fixed at the population level (i.e., absorbed in parameter values, Holland &
275	DeAngelis 2010). Therefore, we do not include explicit cost terms in our models.
276	Nonetheless, individual-level costs that scale with rewards exploitation are often assumed
277	to have population-level impacts (e.g. Aizen et al. 2014). To understand the impact of this
278	assumption, we compare the dynamics of our simpler models to extended models with
279	rewards exploitation (see Appendix C and discussion of overexploitation dynamics, below).
280	Results
281	We found that mutualisms have important similarities in their dynamics and
282	stability. First, our models always predict stable coexistence when both species are
283	facultative (Fig. 1F, 2F-G, 3F-G). Second, threshold or Allee effects may destabilize the
284	system when at least one species is obligate and one or both partners are at low density
285	(Figs. 1-3, left-column panels). Then, depending on initial conditions, both species go
286	extinct or the facultative species persists at low density in the absence of its partner. Third,
287	our models always display threshold effects when both partners are obligate which result in
288	extinction at low densities (Fig. 1A, 2A, 3A).
289	Below we give a detailed description of the dynamic outcomes of each of our
290	models, assuming coexistence is feasible. We organize our results by common and unique
291	outcomes including Extinction, Single-Species Persistence, Coexistence, Threshold Effects,
292	Allee Effects, and Bistability (see definitions below and Appendix B for mathematical
293	details).





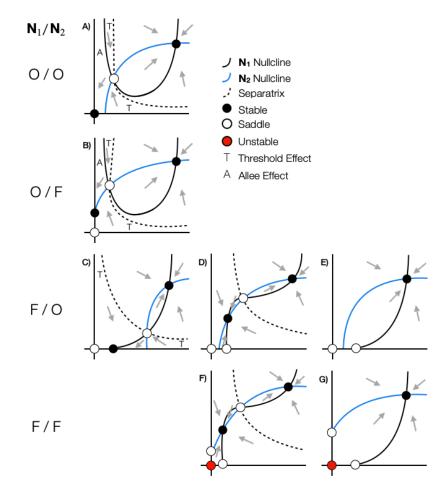
295 Figure 1. Phase plane diagrams for nutritional and protection mutualisms. Curves represent nullclines 296 along which population growth for each species is zero. Trivial nullclines (at $N_1 = 0, N_2 = 0$) are omitted for 297 clarity. Rows illustrate all possible qualitative dynamics when coexistence is feasible for each combination of 298 obligate (O) and facultative (F) partners. The x and y axes are the densities of species 1 (N_1) and 2 (N_2), 299 respectively. Only the quadrant with positive abundances is shown. Arrows illustrate the direction of 300 population change in each region of the phase plane. Equilibria occur where the nullclines for N_1 (black) and 301 N_2 (gray) intersect. Filled black equilibria are stable attractors, filled red equilibria are unstable repellers, and 302 hollow equilibria are half-stable saddle points. Here, saddle points induce threshold effects (T) in which one 303 population declines under a threshold of its partner's density (the separatrix, dashed line), leading to single-304 species persistence of the facultative partner (\mathbf{B}, \mathbf{D}) or extinction when both partners are obligate (\mathbf{A}) . Above 305 the threshold (in A, B, D) or in systems without a threshold (C, E, F), the system always achieves stable 306 *coexistence*. In fact, stable coexistence is the only possible outcome when both partners are facultative (F) or 307 in some configurations of nullclines when one partner is facultative and the other obligate (C, D).

308	Nutrition and Protection
309	Nutrition and protection mutualisms have the same mathematical form and identical
310	dynamical results despite their different derivations. We call N_1 the plant (or attendee)
311	population and N_2 the microbe (or protector) population for nutrition (or protection)
312	mutualisms (Table 1). Microbial and protector nullclines (gray curves, Fig. 1) are concave
313	down, increasing functions that saturate with respect to plant or attendee density. The plant
314	and attendee populations follow the same dynamics yielding symmetrical nullclines (black
315	curves, Fig. 1). Together, these result in the following outcomes:
316	1. Extinction (Fig. 1, all panels, circles at the origin). The extinction equilibrium is
317	attracting (a stable point) only when both partners are obligate (Fig. 1A). Otherwise,
318	one or both populations are repelled from extinction. The origin is a saddle point for
319	facultative-obligate pairs (Fig. 1B-E) or an unstable point when both partners are
320	facultative (Fig. 1F).
321	2. Single-Species Persistence (Fig. 1B-F, circles on axes). Facultative species can persist
322	at density $r_i/b_i s_i$ in the absence of their partner. These single-species equilibria are
323	attracting when threshold effects are present (Fig. 1B, 1D). Otherwise (Fig. 1C, 1E, 1F),
324	they are saddle points and the system will tend towards stable coexistence.
325	3. Stable Coexistence (Fig. 1, all panels, off-axes black circles). The coexistence
326	equilibrium is a stable node (no oscillations) at higher density than either species could
327	achieve alone. Increased density past this equilibrium in either species causes its
328	population to decrease due to negative density-dependence. Therefore, the "orgy of
329	mutual benefaction" (May 1976) cannot occur.

330	4. Threshold Effects (Fig. 1, left-column panels, "T"). The nullclines intersect twice
331	under some parameterizations when at least one species is an obligate partner. This
332	yields a saddle point (Fig. 1A, 1B, 1D, off-axes unfilled circle) at densities intermediate
333	to the stable coexistence and single-species persistence or extinction equilibria. The
334	saddle determines a threshold (the "separatrix," dashed line) below which obligate
335	partners go extinct even if initially highly abundant (e.g., left "T" region in Fig. 1d).
336	This means that one species is too low in density to provide sufficient benefits to its
337	partner, causing the partner's population to decline. The low-density species continues
338	to benefit from mutualism but its increase in density cannot occur fast enough to save
339	the system from extinction. Above the separatrix, one or both species are of high
340	enough density that benefits from mutualism cause positive population growth in their
341	partners and the system will achieve stable coexistence.
342	Alternative protection mechanisms of different mathematical forms yield qualitatively
343	similar results (Appendix C).
344	Transport
345	We call N_1 the plant population and N_2 the animal population (Table 1). The
346	animal nullclines (gray curves) are identical to the microbe/protector nullclines in Fig. 1.
347	The plant nullclines in the pollination and seed dispersal models are both top-open humps
348	bounded on the left side by a vertical asymptote at zero (Figs. 2A-B, 3A-B) despite
349	different derivations. These nullclines differ in their high-density behaviors, where the
350	pollination nullcline is concave up and saturates to $1/s_1$ (Fig. 2), while the seed-dispersal

351 nullcline is concave down when facultative (Fig. 3C-G) and continues to increase with a

352 linear slope
$$\frac{h_{21}s_{1max}}{s_{1_{diff}}} \ge 1$$





354 Figure 2. Phase plane diagrams for pollination mutualisms. All formatting and terminology follows Fig. 1. 355 Here, saddle points can induce threshold effects (T) when at least one species is obligate (A, B, C). When 356 species' densities are above the threshold, they achieve stable coexistence; below the threshold, the system 357 collapses to extinction (A) or single-species persistence (B, C) of the facultative partner. When the plant 358 partner (N_1, black) is obligate (A, B), threshold effects additionally lead to strong, demographic Allee effects 359 (A, Kramer et al. 2009) in which the plant population declines under a threshold of its own density. Saddle 360 points can also induce bistability (i.e., two stable coexistence equilibria, **D**, **F**), where species stably coexist at 361 the low-density equilibrium if their density were initially below the separatrix (dashed line) or at the high-362 density equilibrium otherwise. Finally, when plants are facultative, stable coexistence is the only possible

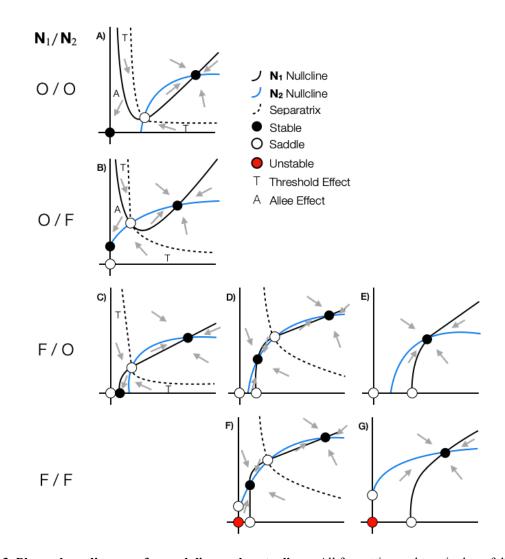
363 outcome for some nullclines configurations (E, G).

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364		Differences in the plant nullclines between seed dispersal and pollination
365	int	eractions manifest in different nullcline geometries but similar dynamical outcomes.
366	Ma	any of the outcomes are similar to those described for nutrition and protection
367	mı	tualisms, which we do not restate. We describe only dynamics unique to the transport
368	m	odels:
369	1.	Extinction (Figs. 2-3, all panels, circles at the origin).
370	2.	Single-Species Persistence (Figs. 2B-G, 3B-G, circles on axes). Facultative plants can
371		persist at density $r_1/g_1b_1s_1$ in the absence of their partner.
372	3.	Stable Coexistence (Figs. 2-3, all panels, off-axes black circles). One stable
373		coexistence equilibrium is present when plants are obligate mutualists (Fig. 2A-B, Fig.
374		3A-B). Two stable coexistence equilibria (bistability) are possible when plants are
375		facultative (Fig. 2D, 2F, 3D, 3F).
376	4.	Bistability (Figs. 2-3, middle-column panels). When plants are facultative, the plant
377		and animal nullclines intersect three times under some parameterizations. This yields a
378		saddle point (off-axes unfilled circle) bisected by a separatrix (dashed line) that divides
379		the plane into two basins of attraction corresponding to a lower- and higher-density
380		stable coexistence, both at higher density than either species could achieve alone. The
381		system will tend to either coexistence equilibrium depending on initial conditions.
382	5.	Threshold Effects (Figs. 2-3, left-column panels, "T").
383	6.	Allee Effects (Figs. 2A-B, 3A-B, "A"). When plants are obligate, their population
384		declines under a threshold of their own density regardless of the density of their partner.
385		This results from the asymptotic behavior of the plant nullcline at $N_1 = 0$, which occurs

by different mechanisms depending on the transport model. In the pollination model, it
occurs because benefit is proportional to the total consumption rate by animals, whereas
in the seed-dispersal model it occurs because benefit affects the density-dependent term.

389



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Figure 3. Phase plane diagrams for seed dispersal mutualisms. All formatting and terminology follows
 Figs. 1-2. All dynamics described in Fig. 1 also apply here. Pollination and seed dispersal mutualisms differ

393 only the geometry of the plant nullcline (N_1 , black), but not in their dynamical outcomes.

394	Discussion
395	Previous models have been criticized as too case-specific or too phenomenological
396	to further empirical and theoretical understanding of generalities in the ecologies of diverse
397	mutualisms (Bronstein 2015a). To address this, we derived models that balance mechanistic
398	detail with the potential for mechanisms to have population-level effects. We found that
399	predictions for the population dynamics of mutualisms are qualitatively robust across
400	derivations, including level of detail, types of benefit, and inspiring systems. We now
401	organize these predictions in a (novel) theoretical framework that synthesizes our
402	conceptual and mathematical results (Table 3, Fig. 4). We then highlight the assumptions
403	that restrict the applicability of our work and identify how these assumptions can be
404	relaxed. We conclude that a coherent and well-developed ecological theory of mutualism
405	exists.
406	Synthesizing Mechanisms in a Mathematical Framework
407	We followed previous conceptual work to develop models for species benefiting
408	from nutritional, protection, and transportation mechanisms, as these putatively mapped
409	onto the processes of consumption, mortality, and reproduction (Table 3). Our
410	mathematical results revealed that nutritional and protection mechanisms are similar to
411	each other because they modify density-independent rates (per-capita birth, death, or both)
412	by saturating processes directly dependent on partner density or per-capita behavior rates
413	(i.e., partner or recipient consumption, deterrence, attendance; see Appendices A, C).
414	Similarly, transportation mechanisms are similar to each other because they both directly
415	depend on and saturate in terms of recipient density, either because they are proportional to

		ONCEDTUAT									
CONCEPTUAL					Nullcline Geometry			Dynamical Outcomes			
Type of Benefit	Process	Mechanism	Means of Effect	Effect	Obligacy (recipient)	Low Density	High Density	Low Density		High Density	
								\mathbf{O}^{P}	\mathbf{F}^{P}	$O^p = F^p$	
Nutrition	Consumption	Consumption	Per-capita consumption on partner	Density- independent $(\uparrow b_i, \downarrow d_i$ or both)	0	_	Saturating, concave up	Т	Т	Stable coexistence	
					F	_		Т	_		
Protection	Mortality	↓ Mortality	Per-capita deterrence/ attendance by partner	Density- independent $(\downarrow d_i)$	0	_	Saturating, concave up	Т	Т	Stable coexistence	
					F	_		Т	-		
Transportation:	Reproduction	↑ Seed production	Total consumption by partner	Density- dependent $(\uparrow b_i)$	0	Asymptote at 0	Saturating, concave up	Τ, Α	T, A	Stable	
Pollination					F Changing concavity	Changing		Т, А	В		
							В	D			
Seed dispersal	Reproduction	↓ Density- dependent mortality during recruitment	Per-capita consumption by partner	Density- dependent $(\downarrow s_i)$	0	Asymptote at 0	Linear growth	Τ, Α	T, A	Stable coexistence	
					F	Concave down		T, A B	B;		

CONCEPTIAL

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417 Table 3. Theoretical framework. Synthesis of Conceptual and Mathematical results for each type of mutualism. All 418 entries are with respect to the recipient of mutualistic benefits (Eqns. 2-5) and assume that the partner is a nutritional 419 mutualist as in our Figs. 1-3. Dashes (-) indicate no notable behavior in that region. The mapping of different "Types 420 of Benefits" to "Processes" and "Mechanisms" is a conceptual simplification that represents general patterns among 421 mutualisms. Mechanisms can result from different behaviors of partners and recipients; we specify one characteristic 422 behavior for each of our models ("Means of Effect"). In all cases, per-capita benefits are a function of partner 423 density. Additionally, the "Effects" of mutualism are either directly dependent or independent of recipient density. 424 All effects are saturating, either due to interspecific density-dependence (nutrition, protection) or intraspecific 425 density-dependence (transport, alternate protection models [Appendix C]). These distinctions, in addition to whether 426 the recipient species is obligate (O) or facultative (F), determine different "Nullcline Geometries" and "Dynamical 427 Outcomes". For example, both models with "density-dependent" effects have nullclines with a vertical asymptote at 428 zero when obligate, and can change concavity between low and high density when facultative. Different dynamical 429 outcomes are dependent on parameterization of the model, the type of partner species, and whether the partner is 430 obligate or facultative. Outcomes are separated into columns (headed O/F) when dependent on partner obligacy 431 (highlighted with a superscripted P) and are separated by line-breaks when dependent on parameterization. In all our 432 models, stable coexistence can always occur at higher density than either species could achieve alone. Our models 433 are thus our distinguished by their low density-behavior: "T" and "A" refer to threshold and Allee effects. 434 respectively. "B" refers to stable coexistence at low density, which gives two stable coexistence equilibria 435 (bistability). When facultative, species can also potentially persist at a low-density, single-species equilibrium (not 436 included in the table).

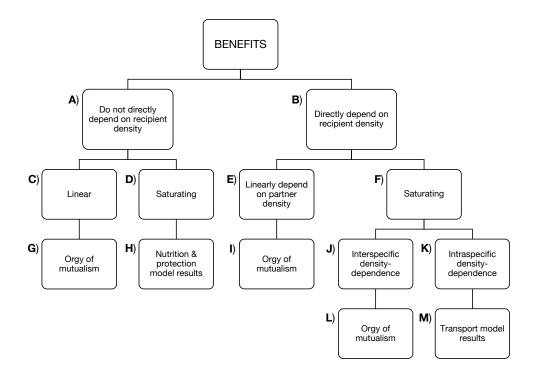
437

438 the partner's total behavior rates (pollination) or because the partner's per-capita behavior

439 modifies a density-dependent rate (seed dispersal).

This suggests a more informative way to group mutualisms: by whether their effects are directly dependent on recipient populations (Fig. 4). This scheme predicts that some interactions will be dynamically similar despite differing in their types of benefit. For example, protection services in some systems may reduce density-dependent sources of mortality such as disease (e.g., cleaning by ants reduces aphid mortality, Nielsen *et al.* 2010, Durak *et al.* 2016). Modeling this similarly to seed dispersal, where benefits are directly dependent on recipient density.





446

447 Figure 4. An ecological theory of mutualism. By synthesizing the results of our models with historical models 448 derived with varying levels of mechanism for diverse motivating systems (Appendix A), we demonstrate that 449 ecological models of mutualism have predictable dynamical outcomes. This synthesis assumes that benefits of 450 mutualisms strictly increase per-capita growth rate of the recipient population, affect only a single ecological 451 process, and depend on partner density. Benefits may furthermore (B) directly depend or (A) not directly depend on 452 recipient density. (C) If benefits simply accumulate linearly as function of partner density (i.e., do not directly 453 depend on recipient density), models predict (G) unstable coexistence – the "orgy of mutual[ism]." (D) If benefits 454 instead saturate (either due to interspecific density-dependence, intraspecific density-dependence, or both), 455 mutualisms exhibit (H) the same dynamical outcomes as our nutrition and protection models. That is, stable 456 coexistence and threshold effects when one partner is obligate. Many historical models fall into this category and 457 predict identical outcomes. (B) When benefits directly depend on recipient density, they may additionally (E) 458 accumulate linearly as a function of partner density, leading to (I) the orgy of mutualism, or (F) saturate. (J) If 459 benefits saturate with respect to partner density, models predict (L) the orgy of mutualism. (K) If benefits instead 460 saturate with respect to recipient density, as in our pollination and seed dispersal models, mutualisms exhibit (M) 461 stable coexistence, threshold effects when one partner is obligate, Allee effects when plants are obligate, and 462 potential bistability when plants are facultative. The combination of both direct dependence and saturation in terms 463 of recipient density in our transport models appears to be unique among historical models. See Appendix A for 464 historical models and descriptions of their dynamical outcomes.

465	predicts an Allee effect at low density in obligate partners (Appendix C). Alternatively,
466	when its effects are not directly dependent on recipient density, mutualism will have
467	indistinguishable impacts on population dynamics, whether resulting from nutritional, protection,
468	or transportation mechanisms (of the same functional form). For example, seed dispersal services
469	(per-capita visitation) may increase (density-independent) germination rate (g_i) in some systems
470	(e.g., Fricke et al. 2013). Modeling this yields qualitatively identical results to our nutrition and
471	protection models (Appendix C).
472	Synthesizing Population Dynamic Behavior
473	All four mutualism models studied here exhibit similar dynamical outcomes (Table 3),
474	which were also predicted by several historical models (Appendix A). Specifically, when
475	feasible, coexistence is stable, non-oscillatory, and populations grow with bound. All obligate-
476	obligate mutualisms and certain interactions between obligate and facultative mutualists exhibit
477	thresholds, under which the low density of one partner destabilizes the system.
478	Mutualisms are commonly modeled as having effects independent of recipient density
479	(Appendix A). We modeled the benefits provided by pollination and seed dispersal as both
480	directly dependent on and saturating in terms of recipient (plant) density, yielding the additional
481	dynamical outcomes of Allee effects or bistability when plants are obligate or facultative,
482	respectively. Other mutualisms may exhibit these outcomes if they: i) modify a density-
483	dependent process, ii) affect a total rate (e.g., visitation) on the recipient population, or iii)
484	include a facultative partner that follows a Type III functional response (Appendix C).
485	Understanding how frequently the effects of mutualisms are directly dependent or independent of

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recipient density is an important avenue for future work. For example, empirical work could
distinguish between these effects by testing for a dynamical transition from threshold to Allee
effects in obligate plants when their pollinators are at very high density (compare Fig. 1A-B to
Fig. 2A-B).

490 Our nutrition and protection models are identical to those proposed by Holland and 491 DeAngelis (2010) when excluding their cost terms for supplying resources (like rewards). The 492 cost terms in their models lead to lobe-shaped nullclines and substantially different dynamical 493 outcomes. Specifically, our models (no cost terms) predict a threshold effect where the high-494 density partner decreases and the low-density partner increases, while their models (with cost 495 terms) predict overexploitation where the high-density partner increases and the low-density 496 partner decreases (shifting the interaction from mutualism to parasitism), eventually causing an 497 Allee effect and extinction of one or both partners. Empirical studies could test these alternative 498 predictions by tracking population sizes over time when one partner is at low density. 499 Interestingly, overexploitation in their models occurs due to the increased costs to the exploited 500 partner of supplying resources. Extensions to our models with exploitation (as opposed to 501 rewards production) costs can also predict overexploitation dynamics with fewer parameters 502 (Appendices C).

503 *Population-Level Impacts of Benefits and Costs Occurring at the Individual Level*

504 Population dynamic models of mutualistic interactions, including ours, assume that 505 mutualisms have population-level impacts. However, most empirical studies quantify the benefits 506 and costs of mutualisms at the individual level in terms of fitness or even by using a single proxy

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for fitness (Bronstein 2001, Ford *et al.* 2015). Those effects do not necessarily imply populationand community-level impacts of mutualism (Williamson 1972, Flatt & Weisser 2000, Ford *et al.*2015, Fredrickson 2015). Therefore, empirical work on population dynamics of mutualisms is of
foremost importance to evaluate historical and current ecological theory on mutualisms.

511 To derive our models, we synthesized available knowledge across mutualisms on 512 population-level costs of offering rewards (Appendix A). Using this synthesis, we assumed that 513 costs associated with rewards did not have population-level effects or that they were of low or 514 "fixed" cost which could be accounted for in demographic parameters. In contrast, high 515 magnitude or "variable" costs that are a function of partner density should be accounted for 516 explicitly (Holland et al. 2002, Morris et al. 2010). More generally, we expect that "construction" 517 costs (attracting partners, rewards production) are more likely to be negligible than "exploitation" 518 costs (rewards consumption, interference, destruction, mortality; Holland et al. 2002) which scale 519 with a partner's visitation rate, and thus are more likely to have impacts on the recipient 520 population (see extensions, Appendix C). Similar conceptual and empirical syntheses among 521 mutualisms are needed to provide insight into how mechanisms that affect fitness also impact 522 population dynamics.

523

Applying Our Models

524 Our simple models can be applied to a variety of mutualisms. This final subsection 525 discusses our most important assumptions in order to clarify the conditions under which our 526 models apply. See Gotelli (2008) for a review of basic assumptions of population dynamic 527 models and their consequences.

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528 **Benefit via a single mechanism**. The predictions of our models apply when there is one primary 529 mechanism of mutualistic benefit to each partner. For example, we assume that a nutritional 530 mutualist benefits exclusively from consuming its partner's rewards – not other components of 531 the partner's biomass and not from other aspects of the interaction that affect different vital rates. 532 An interesting extension of our work would be to synthesize population dynamic behavior for 533 "double mutualisms," in which there are two mechanisms of mutualistic benefit to a partner 534 (Fuster *et al.* 2019). Double mutualisms may play important ecological roles in ecosystems with 535 limited resources, such as islands.

Negative density-dependence. We made the broad assumption that resources for reproduction and growth are limited, so vital rates are dependent on population size (Gotelli 2008). We included a negative density-dependence term in each of our population dynamic equations to represent, e.g., self-limitation due to competition or the Janzen-Connell effect (a common assumption, Table A1). The combination of negative density-dependence and saturating functional responses in our models curves the nullclines so that they intersect and result in stable coexistence.

Functional forms. Density-dependent functional responses limit positive feedbacks that cause unbounded population growth (the "orgy of mutual[ism]") observed, e.g., in Lotka-Volterra models with density-independent (linear) functional responses. Historically, authors focused on intraspecific density dependence, where per-capita benefits decrease and saturate with increasing recipient density (but see Appendix A). Recent work advocates for interspecific density dependence, where per-capita benefits saturate with increasing *partner* density, to integrate

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549 mutualism into broader consumer-resource theory (Wright 1989, Holland & DeAngelis 2010, 550 Holland 2015). Our work primarily studied saturating (Holling Type II and Michaelis-Menten) 551 functional responses with either inter- or intraspecific density-dependence (also see Appendix C). 552 We used interspecific density-dependence for nutritional and protection mutualists, where 553 recipients benefit from consuming their partners' rewards or from deterrence of enemies by their 554 partners, respectively. We used intraspecific density-dependence for transportation mutualists, 555 where recipients benefit from their partners' consumption of their own rewards. However, the 556 distinction between intra- and inter-specific density dependence is not predictive of different 557 population dynamics when the effects of mutualism do not directly depend on recipient density 558 (Fig. 4). For example, protection services could instead be modeled with intraspecific density 559 dependence if benefits are proportional to protectors' recruitment on recipients (e.g., Morales 560 2000). This does not modify the qualitative dynamics of our protection model (Appendix C). 561 In summary, we proposed a theoretical framework that ties mechanisms to predicted

562 population dynamics (Table 3, Fig. 4). The predictions of this framework apply when population-563 level benefits accumulate via a single mechanism and when population-level costs are negligible, 564 are fixed effects, or simply diminish population-level benefits. Additionally, functional forms 565 should be chosen according to the system. Then, effects of mutualism could potentially be 566 identified experimentally by testing where per-capita benefits increase proportionally to or are 567 independent of recipient density, respectively. Finally, our models could be falsified by assessing 568 transient population dynamics for threshold effects, Allee effects, or overexploitation when one 569 species is at low density.

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Conclusion

571 A critical part of elevating mutualism to the "third pillar of ecology" is developing theory 572 that underpins fitness, population dynamics, and community dynamics of mutualistic interactions 573 - but work on population dynamics is notably underrepresented. Here, we united conceptual 574 mathematical approaches to identify patterns in the processes that generate mutualisms and the 575 population dynamics that result. Despite different derivations, mechanisms, and inspiring 576 systems, our models and many historical models make similar qualitative predictions when 577 grouped by whether the effects of mutualism are directly dependent or independent of recipient 578 density. This suggests that there exists a robust population dynamic theory of mutualism that can 579 make general predictions. These predictions (including stable coexistence, threshold effects, 580 Allee effects, and overexploitation) can be tested by combining empirical and theoretical 581 approaches (e.g. Breton & Addicott 1992, Morales 2000, Palmer et al. 2010, Kang et al. 2011, 582 Ford et al. 2015, also see Holland 2015). Such work will contribute to our understanding of 583 general patterns and processes within and among mutualisms, and inform efforts to preserve 584 mutualistic systems (Bronstein 2001, Callaway 2007, Bronstein 2015a,b).

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Appendix A: Additional Discussion

Costs of Rewards at the Population Level

706 Offering rewards to mutualistic partners can incur costs to individuals (Bronstein 2001). 707 To our knowledge, however, there are not empirical studies that have measured how these costs 708 result in changes to population growth. Given this lack of empirical information, we chose to 709 assume that costs associated with rewards are negligible at the population level (or can otherwise 710 be accounted for in parameter values). This is justified for at least four reasons: First, costs 711 associated with rewards can simply act to reduce benefit provided by mutualism (e.g., reduced 712 seed set due to nectar production, Brandenburg et al. 2012). Second, rewards and the organs that 713 produce them are typically ephemeral in comparison to individuals in the population. They can be 714 damaged or decay, but, instantaneously, these costs are unlikely to result in death or damage to 715 individuals (Revilla 2015). Third, many costs associated with rewards are "fixed" in that they are 716 independent of partner density (e.g., sunk costs of molecular machinery used to produce rewards, 717 Holland *et al.* 2002) or are otherwise compensated for within individuals (e.g., carbon costs of 718 supporting microbial mutualists stimulate compensatory photosynthesis, Kaschuk et al. 2010). 719 Fourth, changes in metrics of individual fitness like fecundity do not necessarily manifest in 720 changes in the per-capita growth rate of the population (Ford *et al.* 2015; e.g., soil rhizobia 721 populations often stay constant despite the >100,000-fold increase in descendants released into 722 soil produced by a plant-associated rhizobium, Denison & Kiers 2011).

41

Patterns in Historical Models

723

724	A surprising result of our work is that many of our model predictions are robust across
725	types of mutualism and their mechanistic derivations – even among historical models (Table A1).
726	Despite diverse approaches, many historical models predict stable coexistence and threshold
727	effects when at least one species is obligate (May 1978, Soberón & Martinez Del Rio 1981,
728	Wells 1983, Wolin & Lawlor 1984: Eqn. A8, Pierce & Young 1986, Wright 1989, Graves et al.
729	2006, Thompson et al. 2006: Eqns. A12-A13, Kang et al. 2011, Revilla 2015), suggesting that
730	these outcomes could be general among mutualisms. Some historical models are even
731	mathematically identical, despite derivations ranging from phenomenological to extremely
732	detailed (e.g., Soberón & Martinez del Rio 1981: Eqn. A6, Wright 1989, Bazykin 1998, our Eqns.
733	2-3).

734 A theme among these historical models is that the benefits of mutualism (Fig. 4A) do not 735 directly depend on recipient density and (Fig. 4D) are saturating, either due to interspecific 736 density-dependence (Soberón & Martinez del Rio 1981: Eqn. A6, Dean 1983, Wright 1989, 737 Graves et al. 2006, Thompson et al. 2006: Eqn. A12-A13, Holland & DeAngelis 2010, Kang et 738 al. 2011), intraspecific density-dependence (Soberón & Martinez del Rio 1981: Eqn. A5, Wolin 739 & Lawlor 1984: Eqn. A8, Revilla 2015: Eqn. A17), or both (May 1978, Wells 1983). Our 740 nutrition and protection models are also in this tradition: benefits do not directly depend on 741 recipient density and saturate due to interspecific (main text models, Eqns. 2-3) or intraspecific 742 (alternative protection models, Appendix C) density-dependence, with qualitatively identical 743 results (Fig. 4H).

42

744	Historical models in which mutualistic benefits directly depend on recipient density (Fig.
745	4B) typically describe an increase in carrying capacity due to mutualism (Whittaker 1975, Wolin
746	& Lawlor 1984: Eqns. A6, A7, Pierce & Young 1986: Eqn. A10, Neuhauser & Fargione 2004,
747	Thompson et al. 2006: Eqn. A14). Interestingly, both models with saturating benefits (Wolin &
748	Lawlor 1984: Eqns. A6-A7) saturate without inflection (no changes in concavity) due to
749	interspecific density-dependence (Fig. 4J). Note though that these models have been referred to
750	as examples of <i>intra</i> -specific density dependence (e.g. Holland 2015), presumably because
751	saturating benefits reduce negative density-dependence in the recipient population. The models
752	predict stable coexistence (Eqns. A6-A7) or unstable coexistence (Eqn. A7, Fig. 4L), but not
753	bistability, and can be applied to facultative mutualists only. This is in contrast to our transport
754	models (Eqns. 4-5), which are both directly dependent on recipient density and saturate due to
755	intraspecific density-dependence because benefits are proportional to a partner's per-capita
756	visitation or consumption rate on the recipient population (Fig. 4K, 4M). Additionally, high
757	degree terms $(N_i^2, N_i N_j)$ in their nullclines allow inflection points that can lead to bistability.

A more recent pattern in population dynamic models of mutualism investigates the stability of interactions that can shift from mutualism to parasitism, either as controlled by an interaction coefficient that increases or depresses, respectively, equilibrium density in the presence of the partner (Pierce & Young 1986, Neuhauser & Fargione 2004), or as a balance between costs and benefits that depend dynamically on partner density (Holland & DeAngelis 2010, Kang *et al.* 2011). Pierce and Young's (1986) and Neuhauser and Fargione's (2004) models reproduce the qualitative results of our nutrition and protection models when the

43

765	interactions are mutualistic. Kang et al.'s (2011) model for leaf-cutter ants and their fungal
766	gardens includes a linear cost term of fungal biomass consumption, but still reproduces the
767	qualitative results of our nutrition and protection models between partners with Type I and Type
768	III functional responses. Holland and DeAngelis' (2010) models also reproduce our qualitative
769	results when costs, which they specify are saturating costs of supplying resources to consumers,
770	are set to zero ($q_i = 0$ in Eqn. A15). However, their full models (when $q_i > 0$) are unique
771	because nonzero costs may exceed benefits instantaneously ("parasitism") due to the unique
772	dynamical outcome of overexploitation even if in the long run benefits are greater ("mutualism").
773	Testing for overexploitation dynamics may illuminate the prevalence of nonlinear population-
774	level costs among mutualisms. Also see our proposed models with cost terms and comparison to
775	Holland and DeAngelis' work in Appendix C.
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Reference	Model	Unique Eqn. Number	Motivating System	Notes
Gause & Witt 1935	$\frac{d\boldsymbol{N}_i}{dt} = r_i \boldsymbol{N}_i \left(\frac{K_i + \alpha_{ij} \boldsymbol{N}_j - \boldsymbol{N}_i}{K_i}\right)$	A1	n/a	Facultative only
Whittaker 1975	$\begin{cases} \frac{dN_1}{dt} = r_1 N_1 \left(\frac{K_1 + \alpha_{12} N_2 - N_1}{K_1 + \alpha_{12} N_2} \right) \\ N_2 \text{ follows Eqn. A1} \end{cases}$	A2 A1	Symbiont (N ₁)- Host (N ₂) mutualism	N_1 is obligate when $K_1 = 0$
May 1978	$\begin{cases} \frac{dN_1}{dt} = N_1 \left(\frac{l_{12}N_2}{CD + CN_1 + N_1N_2} - d_1 \right) \\ N_2 \text{ follows Eqn. A2} \end{cases}$	A3 A2	Plant (N ₁)- Pollinator (N ₂) and others	 <i>N</i>₂ is obligate as defined by Whittaker 1975
Vandermeer & Boucher 1978	$\frac{dN_i}{dt} = N_i(r_i + \alpha_{ij}N_j - \alpha_{ii}N_i),$	A1	Legume (N_1) - <i>Rhizobium</i> (N_2) and others	Obligate when $K_i = r_i / \alpha_{ii} \le 0$
Addicott 1981	$\frac{d\boldsymbol{N}_i}{dt} = r_i \boldsymbol{N}_i \left(\frac{K_i - \boldsymbol{N}_i}{K_i}\right) \left(1 + \frac{\alpha_{ij} \boldsymbol{N}_j}{K_i}\right)$	A4	Aphid (N ₁)-Ant (N ₂)	Facultative only
Soberón & Martinez del Rio 1981	$\begin{cases} \frac{dN_1}{dt} = N_1 \left(\frac{k_1 \sigma \mu N_2}{1 + \sigma \phi \mu^2 N_1} - \gamma \right) \\ \frac{dN_2}{dt} = N_2 \left(\epsilon (K_2 - N_2) + \frac{k_2 \sigma \mu^2 N_1}{1 + \sigma \phi \mu^2 N_1} \right) \end{cases}$	A5 A6	Plant (N ₁)- Pollinator (N ₂)	N_1 is always obligate; N_2 is obligate when $K_2 = 0$

Dean 1983	$\frac{dN_{i}}{dt} = r_{i}N_{i}\left(\frac{k_{i} - N_{i}}{k_{i}}\right)$ where $k_{i} = K_{i_{max}}\left(1 - e^{-\left((a_{i}N_{j} + C_{i})/K_{i_{max}}\right)}\right)$	Α7	n/a	Unintended behaviors; replaced by Graves <i>et al.</i> 2006
Wells 1983	$\begin{cases} \frac{dN_1}{dt} = N_1 \left(\frac{b_{12}N_2}{a_1N_1 + N_2 + h_{12}} - d_1f_1N_1 - d_1 \right) \\ dN_1 = N_1 \left(\frac{b_{12}N_2}{a_1N_1 + N_2 + h_{12}} - d_1f_1N_1 - d_1 \right) \end{cases}$	A8	Plant (N ₁)- Pollinator (N ₂)	Obligate only
	$\begin{cases} \frac{dN_2}{dt} = N_2 \left(\frac{b_{21}N_1}{a_2N_2 + N_1 + h_{21}} - d_2 \right) \end{cases}$	A9		
Wolin & Lawlor 1984	$\frac{d\boldsymbol{N}_i}{dt} = \boldsymbol{N}_i \left(r_i - \frac{b\boldsymbol{N}_i}{1 + m\boldsymbol{N}_j} - d\boldsymbol{N}_i \right)$	A6	n/a	Multiple models presented with proposed similar
	$\frac{dN_i}{dt} = N_i (r_i - (b - mN_j + d)N_i)$	A7		derivations for mutualisms that reduce
	$\frac{dN_i}{dt} = N_i \left(r_i \left(1 - \frac{N_i}{K} \right) + mN_j e^{-\alpha N_i} \right)$	A8		mortality. Facultative only
				2
Pierce & Young 1986	$\begin{cases} \frac{dN_1}{dt} = N_1 \left(r_1(N_2) - \frac{N_1}{K_1} \right) \\ \frac{dN_2}{dt} = r_2 N_2 \left(1 - \frac{N_2}{K_2(N_1)} \right) \end{cases}$	A9	Lycaenid (N ₁)- Ant (N ₂)	$r_1(N_2)$ is 1's growth rate as a fn. of N_2 ; $K_2(N_1)$ is 2's
	$\left(\frac{dt}{dt} = r_2 N_2 \left(1 - \frac{1}{K_2(N_1)}\right)\right)$	A10		equilibrium density of 2 as a fn. of N ₁
Wright 1989	$\frac{d\boldsymbol{N}_i}{dt} = \boldsymbol{N}_i \left(r_i (1 - c_i \boldsymbol{N}_i) + b_{ij} \frac{a_{ij} \boldsymbol{N}_j}{1 + a_{ij} h_{ij} \boldsymbol{N}_j} \right)$	A6	Pollinators and other mutualists that behave as foragers	Obligate when $r_i < 0$

Neuhauser &
Fargione 2004
$$\begin{cases} \frac{dN_1}{dt} = r_1 N_1 \left(1 - \frac{N_1}{K_1 + \gamma_{12} N_2}\right) - a N_1 N_2 \\ N_2 follows Eqn. A1 \end{cases}$$
A11
A1Plant (N_1)-
Mycorrhizae (N_2) \end{cases}Facultative onlyGraves et al.
2006 $\frac{dN_i}{dt} = N_i (r_{i0} + (r_{i1} - r_{i0})(1 - e^{-k_i N_i}) - s_i N_i)$ A7Lichens and
other nutritional
mutualismsReplaces Dean's
1983 model.
Obligate when $r_0 < 0, r_{i1} + r_{i0} > 0$ Thompson et al.
2006 $\frac{dN_i}{dt} = \left(\rho_i \left(b_i N_i + \frac{a_i N_j}{\beta_i + N_j} N_i\right) + l_i\right) \left(1 - \frac{N_i}{S_i}\right)$ A12Many: systems
where
mutualism:
lncreases birth
 $\frac{dM_i}{dt} = (\rho_i b_i N_i + l_i) \left(1 - \frac{N_i}{S_i}\right) - \left(d_{imin} + \frac{d_{idiff}}{1 + c_i N_j}\right) N_i$ A13Multiple models are
presented with
different
combinations of
benefit. Alosed
system when $l_i = 0$.
Obligate when
 $\rho_i b_i < d_{imax}$ Holland &
DeAngelis 2010 $\frac{dN_i}{dt} = N_i \left(r_i + c_i \left(\frac{a_{ij}N_j}{h_j + N_j}\right) - q_i \left(\frac{\beta_{ij}N_j}{e_i + N_i}\right) - s_i N_i\right), i \in 1,2$ A15Bidirectional, e.g.
Plant (N_1)-
Mycorrhize (N_2)Holland &
Mage et al. 2011 $\left\{\frac{dN_1}{dt} = N_1 \left(r_1 \left(\frac{a_{12}N_2^2}{h_2 + a_{12}N_2^2}\right) - c_{12}N_2 - d_1N_1\right)$
 $N_2 follows Eqn. A15$ A16Fungus (N_1)-
Leaf-cutter Ant
(N_2)

$$\frac{dN_{i}}{dt} = N_{i} \left(r_{i} - c_{i}N_{i} + \frac{\sigma_{i}\beta_{i}\alpha_{j}N_{j}}{\omega_{j} + \beta_{i}N_{i}} \right), i \in 1,2$$

$$\begin{cases} \frac{dN_{1}}{dt} = N_{1} \left(r_{1} - c_{1}N_{1} + \frac{\sigma_{0}\beta_{0}\alpha_{0}N_{0} + \sigma_{1}\beta\alpha N_{2}}{\omega + \beta_{0}N_{0} + \beta N_{2}} \right) \\ \frac{dN_{2}}{dt} = N_{2} \left(r_{2} - c_{2}N_{2} + \frac{\sigma_{2}\beta\alpha N_{1}}{\omega + \beta_{0}N_{0} + \beta N_{2}} \right) \\ A17 \quad \text{Exchanges of resources for times resources, e.g. rew Lichens replents much far population of the second secon$$

A6 resources for services, e.g. e.g. Plant (N_1) -Disperser (N_2) A17

ning the scale of vards shment is ster than on change

823 Table A1. Historic population dynamic models of mutualism. This list is not comprehensive. In general, we 824 included only a sampling of deterministic, continuous-time population dynamic models of two equations for two 825 species that were intended by the authors to generalize across mutualistic systems. However, we also included a few 826 specific models (e.g. Soberón & Martinez del Rio 1981, Pierce & Young 1986, Kang et al. 2011) if we considered 827 their approach notable or reference their work in the text. Equations with the same numbering are not significantly 828 different mathematically. Additionally, many models, despite different mathematical features, predict similar 829 qualitative dynamics in the ecologically-relevant region (Appendix A). Equations largely follow the notation from 830 the original citations. Only unique models from each citation were included. We encourage the readers to refer to the 831 citations for the model derivations and interpretation of parameters.

$\frac{dN_i}{dt} = N_i \left(\frac{1}{2} + \frac{1$

Appendix B: Mathematical Details

832

Analysis 833 We first analyze Eqn. 1 to serve as a reference for the effects of mutualism. In the 834 835 absence of a potential partner (N_i) , the nullclines for Eqn. 1 are also equilibria. There are two: one "trivial" ($\overline{N_i} = 0$, "extinction") and one nontrivial: 836 $\overline{N}_i = \frac{r_i}{b_i s_i}.$ 837 Eqn. B1 The nontrivial equilibrium is feasible (exists) when $r_i = b_i - d_i \ge 0$. Because we are 838 839 concerned only with dynamics when both species have non-negative density, in this work 840 we call equilibria "stable" or "unstable" when they are attracting or repelling, respectively, in this ecological region (when $N_i \ge 0$). When $r_i > 0$, the trivial equilibrium is always 841 842 unstable, allowing positive population growth when N_i is at low density, and the nontrivial 843 equilibrium is stable allowing population persistence at constant density. Specifically, when $N_i < r_i/b_i s_i$ population density increases due to positive intrinsic growth whereas when 844 $N_i > r_i/b_i s_i$, population density decreases due to negative density-dependence. 845 In all of our models (Table 1), both species have "trivial" nullclines: $\overline{N_1} = 0$, a 846 vertical line along the y-axis, and $\overline{N_2} = 0$, a horizontal line along the x-axis. The 847 intersection of both species' trivial nullclines gives a trivial extinction equilibrium ($\overline{N_1} = 0$, 848 $\overline{N_2} = 0$) in every model. Additionally, one species N_2 follows the same dynamic equation 849 (Eqn. 2) and thus has the same nontrivial nullclines (hereafter, simply "nullclines"). We use 850 851 the Holling Type II notation in the following analysis but it is easy to substitute parameters

for Michaelis-Menten kinetics. The nullcline (Figs. 1-3, gray) is a concave down,

853 increasing function that saturates with respect to its partner's abundance:

854
$$\overline{N_2} = \frac{r_2}{b_2 s_2} + \frac{c_2}{b_2 s_2} \frac{a_{21} N_1}{(1 + a_{21} h_{21} N_1)}.$$
 Eqn. B2

Eqn. B2 is the curve showing the balance between negative density-dependence (exerted by

the $(1 - s_i N_i)$ term in Eqn. 2), benefit from mutualism, and positive intrinsic growth (when

857 N_2 is facultative). When $N_2 > \overline{N_2}$, negative density-dependence is stronger than benefit

from mutualism and/or intrinsic growth causing N_2 to decrease. When $N_2 < \overline{N_2}$, negative

859 density-dependence is weaker and N_2 increases.

860 Comparing Eqns. B1 and B2, we can isolate the benefits of mutualism to N_2 as

861 $\frac{c_{21}}{b_2 s_2} \frac{a_{21} N_1}{(1+a_{21}h_{21}N_1)}$. Importantly, benefits saturate with respect to partner density. In particular, 862 as plant density becomes extremely high, N_2 saturates to a higher value than it could 863 achieve in the absence of its partner:

864
$$\lim_{N_1 \to \infty} \overline{N_2} = \frac{r_2}{b_2 s_2} + \frac{c_{21}}{b_2 h_{21} s_2}.$$
 Eqn. B3

This horizontal asymptote is an upper bound on the density of N_2 . When N_2 is facultative ($r_2 > 0$), its nullcline intersects the y-axis in the ecological region (when $N_i \ge 0$) at

867
$$\overline{N_2}_{0,y} = \frac{r_2}{b_2 s_2}.$$
 Eqn. B4

53

All else being equal, decreasing r_2 pushes the visible part of N_2 's nullcline down so that when N_2 is obligate ($r_2 \le 0$), it intersects the at y-axis at zero or negative values (not

shown). Then, in the ecological region, the nullcline instead intersects the x-axis at

871
$$\overline{N}_{2_{x,0}} = \frac{-r_2}{a_{21}(c_{21}+h_{21}r_2)}$$
. Eqn. B5

Below, we calculate the nontrivial nullclines for N_1 (Figs. 1-3, black) and similarly analyze their dynamics in the ecological region of the plane. See Methods and Tables 1-2 for terminology.

875 Nutrition

876 Plants (N_1) follow the same dynamics as microbes (N_2) , so their nullcline is 877 symmetrical to Eqn. B2:

878
$$\overline{N_1} = \frac{r_1}{b_1 s_1} + \frac{c_{12}}{b_1 s_1} \frac{a_{12} N_2}{(1 + a_{12} h_{12} N_2)}.$$
 Eqn. B6

Clearly, Eqn. B6 is an increasing function that saturates with respect to microbe density. It can be rearranged to be a function of N_1 :

881
$$N_2 = \frac{r_1 - b_1 s_1 \overline{N_1}}{a_{12} (b_1 h_{12} s_1 \overline{N_1} - h_{12} r_1 - c_{12})}.$$
 Eqn. B7

Then, plant density increases to the left of its nullcline (Fig. 1, black) due to mutualism and decreases to the right of it due to strong negative density-dependence. All other properties are likewise symmetrical (i.e. Eqns. B3-B5 apply with the *x* and *y* axes switched and indices 1 and 2 swapped).

54

886 **Protection**

887 Species that benefit from protection mutualisms (N_1) follow the same dynamics as 888 nutritional mutualists. In the protection notation, their nontrivial nullcline (Fig. 1, black) is:

889
$$\overline{N_1} = \frac{r_1}{b_1 s_1} + \frac{d_{1_{diff}}}{b_1 s_1} \frac{N_2}{(k_{12} + N_2)}.$$
 Eqn. B8

890 $\overline{N_1}$ approaches a vertical asymptote at

891
$$\lim_{N_2 \to \infty} \overline{N_1} = \frac{r_1}{b_1 s_1} + \frac{d_{1_{diff}}}{b_1 s_1}.$$
 Eqn. B9

892 When obligate $(r_1 < 0)$, $\overline{N_1}$ intersects the y-axis in at

893
$$\overline{N}_{2_{0,y}} = -\frac{r_1 k_{12}}{b_1 - d_{1_{min}}}.$$
 Eqn. B10

894 When facultative $(r_1 > 0)$, $\overline{N_1}$ intersects the x-axis at

895
$$\overline{N}_{2_{x,0}} = \frac{r_1}{b_1 s_1}.$$
 Eqn. B11

896 Transport

897 The equation for the nullcline of animal-pollinated plants (Fig. 2, black) is:

898
$$N_2 = \frac{(b_1 g_1 s_1 \overline{N_1} - r_1)(1 + a_{21} h_{21} \overline{N_1})}{y_{12} a_{21} g_1 (1 - s_1 \overline{N_1}) \overline{N_1}}.$$
 Eqn. B12

899 When plants are obligate $(r_1 = g_1 b_1 - d_1 \le 0, \text{ Fig. 2a-b})$, the nullcline is a top-open hump 900 bounded by vertical asymptotes at $N_1 = 0$ and $N_1 = 1/s_1$. When plants are facultative 901 $(r_1 > 0, \text{ Fig. 2c-g})$, at high density the nullcline is increasing, concave up, and saturates at

902 $1/s_1$. At low density, the nullcline is concave down, though this may not be visible in the 903 ecological region of the plane. Regardless, it has x-intercept

904
$$\overline{N}_{1_{0,y}} = \frac{r_1}{g_1 b_1 s_1}.$$
 Eqn. B13

905 The equation for the nullcline of animal-dispersed plants (Fig. 3, black) is:

906
$$N_2 = \frac{(b_1 g_1 s_{1max} \overline{N_1} - r_1)(1 + a_{21} h_{21} \overline{N_1})}{s_{1diff} a_{21} \overline{N_1}}.$$
 Eqn. B14

At high plant density, the nullcline has a linear slope of $h_{21}s_{1max}/s_{1diff}$, which is ≥ 1 due to our condition that negative density-dependence can be reduced at most to zero (see Methods). When plants are obligate ($r_1 = g_1b_1 - d_1 \leq 0$, Fig. 3a-b), the nullcline is a topopen hump bounded on the left side by a vertical asymptote at $N_1 = 0$. When plants are facultative ($r_1 > 0$, Fig. 3c-g), the nullcline is concave down at low density, with xintercept

913
$$\overline{N}_{1_{0,y}} = \frac{r_1}{g_1 b_1 s_{1_{max}}}.$$
 Eqn. B15

For both Eqns. B12 and B14, inside the hump or to the left of the curve plant density

915 increases; to the right, plant density decreases due to strong negative density-dependence.

916 Feasibility

All of our models are structurally unstable (Rohr et al. 2014), such that smooth
transitions in parameter values shift the nontrivial nullclines (hereafter, "nullclines") so that
they may intersect in various ways or even fail to intersect, with different dynamical

56

920	outcomes for each case (Fig. B1). In the main text, we focused on "feasible" systems, that
921	is, where coexistence of the partners with non-negative density (i.e. in the ecological
922	region) was possible. There are many parameterizations that lead to feasibility, but it is not
923	easy to provide an ecological interpretation for the conditions to achieve them. Below we
924	enumerate the geometric conditions that lead to feasibility by describing the required
925	positioning of the nullclines.
926	Nutrition and Protection
927	There are three cases for how the nullclines of N_1 and N_2 intersect:
928	(1) The nullclines never intersect (Fig. B1a). Coexistence is not possible. Depending on the
929	initial conditions, both species may be extinct or a facultative species may persist at N_i =
930	$\frac{r_i}{b_i s_i} \text{ with } N_j = 0.$
931	(2) The nullclines intersect exactly once (Fig. B1b). This case is extremely sensitive to the
932	vital rates like birth and death rates of both species; it is highly unlikely in nature these
933	rates would be maintained at such precise values, especially in the presence of stochasticity
934	We neglect this case.

935 (3) The nullclines intersect twice (Fig. B1c-d), yielding exactly one saddle point at low

936 density and one stable equilibrium at high density. Coexistence is feasible when at least one

937 of the intersections is in the ecological region (Fig. B1c, d: two, one intersection(s) in the

938 ecological region, respectively). When only one intersection occurs in the ecological

939 region, it is the stable coexistence equilibrium.

940 **Transport**

- 941 There are four cases for how the plant and animal nullclines intersect:
- 942 (1) If the nullclines never intersect (Fig. B1e), then coexistence is not possible.
- 943 (2) If the nullclines intersect exactly once when plants are obligate (Fig. B1f), this is an944 ecologically unlikely case that we neglect.
- 945 (3) If the nullclines intersect twice with at least one intersection in the ecological region
- 946 (e.g. Fig. B1g, B1h), then coexistence is feasible. The low-density equilibrium is a saddle
- point while the high-density equilibrium is stable. When only one intersection occurs in the
- 948 ecological region, it is the stable coexistence equilibrium.
- (4) If the nullclines intersect three times in the ecological region (e.g. Fig. B1i), then
- 950 coexistence is feasible. The low and high density equilibria are stable ("bistability") and the
- 951 intermediate equilibrium is a saddle point. Bistability appears to only occur when at least
- one nullcline changes concavity in the ecological region. Our transport models display
- bistability because their nullclines change from concave up to concave down (pollination,
- Figs. 2d, 2f) or from concave down to linear growth (seed dispersal, Figs. 3d, 3f). However,
- bistability can more generally result from Type III functional responses in facultative
- 956 mutualists (see Appendix C).
- 957

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Rohr, R. P., S. Saavedra, and J. Bascompte. 2014. On the structural stability of mutualistic
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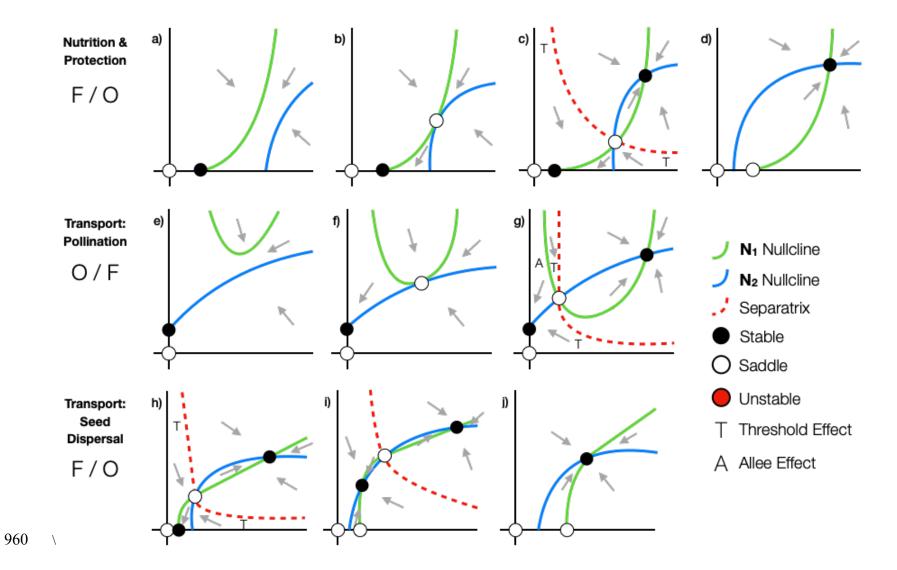


Figure B1. Examples of structural instability. Phase plane diagrams illustrating smooth transitions from infeasible to feasible coexistence (from left to right
 panels within a row). Formatting follows Figs. 1-3. Labels for each row identify the models being illustrated (Table 1) and species 1 / species 2 as obligate (O) or

963 facultative (F). (a-d) The N_2 nullcline shifts smoothly to the left, due to, for example, increasing conversion efficiency (c_{21}). This moves the system from (a) 964 infeasible, to (b) ecologically unlikely, through a "blue sky" bifurcation in which (c) coexistence is feasible and stable but will not occur if species' initial 965 densities fall below a threshold, to (d) guaranteed stable coexistence. This type of structural instability occurs in both our nutrition and protection models (shown) 966 and in our pollination model when plants are facultative (not shown). (e-g) the vertex of the N_1 nullcline shifts smoothly down, due to, for example, increasing 967 partner quality (y_{12}) . This moves the system from (e) infeasible, to (f) ecologically unlikely, through a blue sky bifurcation in which (g) coexistence is feasible 968 and stable but threshold and Allee effects are present. (h-j) The N_1 nullcline shifts smoothly to the right, due to, for example, decreasing maximum negative 969 density-dependence (s1max), i.e. negative density-dependence in the absence of the partner. This moves the system from infeasible (not shown), to ecologically 970 unlikely (not shown), through a blue sky bifurcation in which (h) coexistence is feasible and stable but threshold effects are present, to (i) bistability in which 971 stable coexistence is guaranteed but occurs either at a low- or high-density equilibrium, to (i) guaranteed stable coexistence. This type of structural instability

972 occurs in both our seed dispersal model (shown) and in our pollination model when plants are facultative (not shown).

60

973	Appendix C
974	Functional Forms
975	To understand the robustness of our results, we analyzed our models (Table 1) using other
976	functional forms in addition to the saturating forms presented in the main text. Specifically, we
977	report all possible dynamical outcomes for every combination of obligate and facultative partners
978	with Holling Type I, II, and III functional responses. Table C1 specifies the mathematical
979	expressions used for each model. Notice that in the transport models, reproductive services (S) to
980	population <i>i</i> are a function of partner <i>j</i> 's consumption or visitation rate (C_R) on <i>i</i> , so only the
981	functional form for <i>j</i> needs to be specified.
982	Our results are generally robust to variation in functional form (Figs. C1-C3). We
983	highlight the exceptions to that pattern here. In our nutrition and protection models (Fig. C1),
984	coexistence is infeasible or leads to the orgy of mutualism (that is, unstable coexistence) when
985	both partners have Type I functional responses. Additionally, bistability becomes a possible
986	dynamical outcome when a facultative partner has a Type III functional response. In our
987	pollination model (Fig. C2), all dynamical outcomes are as reported in the main text, even when
988	pollinators follow a Type I functional response. In our seed dispersal model (Fig. C3), the orgy of
989	mutualism always occurs when dispersers follow a Type I functional response.
990	Though we do not analyze them here, other functional forms including the Beddington-
991	DeAngelis formula, ratio-dependent forms, and unimodal forms should be used in our models
992	according to the specific system (reviewed by Holland 2015). Note that for nutrition and transport
993	mutualisms, we derived models in which the functional responses (or more precisely, numerical

61

responses, Revilla 2015) are direct functions of recipient or partner consumption rate. However,
our models can also accommodate functional responses interpreted as "net benefit" curves (e.g.,
Holland *et al.* 2002, Morris *et al.* 2010) if costs and benefits affect the same vital rate (i.e., if
"costs" simply reduce the benefits that accrue to a given vital rate). Under this interpretation,
unimodal functional forms may arise (e.g. Morris *et al.* 2010) which could lead to substantially
different dynamical predictions than those presented here.

1000 *Alternative Models*

1001 In the main text, we presented a protection model for species *i* in which the partner

population (N_j) reduces mortality (d) by deterring natural enemies (Eqn. 3). If *j* instead reduces mortality via attendance on the recipient population (e.g. Morales 2000), we choose $S(N_i, N_j) =$ $\frac{N_j}{k+N_i}$ or $S(N_i, N_j) = C_R(N_i, N_j) = \frac{a_{ij}N_j}{1+a_{ij}h_{ij}N_i}$ so that per-capita death rate declines proportional to

1005 j's recruitment rate or consumption rate on i's rewards, respectively. Then, benefit saturates

1006 when *i*'s density is high. Here, we analyze the specific model:

1007
$$\frac{dN_1}{dt} = N_1 \left[b_1 (1 - s_1 N_1) - \left(d_{1_{max}} - d_{1_{diff}} \frac{a_{12} N_2}{1 + a_{12} h_{12} N_1} \right) \right]$$
Eqn. C1

1008 where attendees (N_1) are obligate on protectors (N_2) when $r_1 = b_1 - d_{1_{max}} < 0$ and facultative 1009 otherwise. We additionally require $d_{1_{diff}} = d_{1_{max}} - d_{1_{min}} \le d_{1_{max}} h_{ij}$, so that net mortality is 1010 always non-negative.

1011 Alternatively, we could choose the simplest function so that mortality is reduced 1012 monotonically with saturation when partner density is high, as proposed by Thompson *et al.* 1013 (2006). In this case, we modify Eqn. 3 to give the specific model:

62

1014
$$\frac{dN_1}{dt} = N_1 \left[b_1 (1 - s_1 N_1) - \left(d_{1_{min}} + d_{1_{diff}} \frac{1}{k + N_2} \right) \right]$$
Eqn. C2

1015 where, again, attendees (N_1) are obligate on protectors (N_2) when $r_1 = b_1 - d_{1_{max}} < 0$ and 1016 facultative otherwise.

1017 Another alternative is to assume that protection services increase attendees' maturation 1018 rate (*b*) as in the case where ants (N_2) guard the pupae of lycaenid butterflies (N_1 , Travassos & 1019 Pierce 2000). Then, we modify Eqn. 3 to give the specific model:

1020
$$\frac{dN_1}{dt} = N_1 \left[\left(b_{1_{min}} + b_{1_{diff}} S(N_1, N_2) \right) (1 - s_1 N_1) - d_1 \right]$$
 Eqn. C3

1021 where we choose $S(N_1, N_2) = \frac{N_2}{k+N_1}$ to represent ant recruitment rate. Lycaenids are obligate on 1022 ants when $r_1 = b_{1_{min}} - d_1 < 0$ and facultative otherwise.

Finally, we could assume that tending by protectors decrease attendees' mortality due to density-dependent processes (*s*), which may act over the course of attendees' lives. For example, ants reduce aphid mortality through cleaning and quarantining practices that (presumably) prevent the spread of fungal infections (Nielsen *et al.* 2010, Durak *et al.* 2016). Then, we modify Eqn. 3 to give the specific model:

1028
$$\frac{dN_1}{dt} = N_1 \left[b_1 - d_1 - \left(s_{1_{max}} - s_{1_{diff}} S(N_1, N_2) \right) N_1 \right]$$
Eqn. C4

1029 where we again choose $S(N_1, N_2) = \frac{N_2}{k+N_1}$ to represent ant recruitment rate. Aphids (N_1) are 1030 obligate on ants (N_2) when $r_1 = b_1 - d_1 < 0$ and facultative otherwise.

63

1031We can also consider an alternative model for seed dispersal. In the main text, we1032presented a model (Eqn. 5) wherein plants benefit from seed dispersal by escaping density-1033dependent sources of mortality during maturation (s). Some plants (N_1) instead benefit1034exclusively via an increase in seed survival/germination rate (g) because gut passage through1035avian or mammal dispersers (N_2) removes pathogens from seeds and provides chemical1036camouflage from seed predators (Fricke *et al.* 2013). In this case, we modify Eqn. 5 to give the1037specific model:

1038
$$\frac{dN_1}{dt} = N_1 \left[b_1 \left(g_{1_{min}} + g_{1_{diff}} S(N_1, N_2) \right) (1 - s_1 N_1) - d_1 \right]$$
Eqn. C5

1039 where plants are obligate on dispersers when $r_1 = b_1 g_{1_{min}} - d_1 < 0$ and facultative otherwise. 1040 We choose $S(N_1, N_2) = C_R(N_1, N_2) = \frac{a_{12}N_2}{1 + a_{12}h_{12}N_1}$ to represent the consumption rate of fruit by 1041 dispersers. Since we originally defined g as the fraction of seeds that germinate, we additionally 1042 require $g_{1_{diff}} = g_{1_{max}} - g_{1_{min}} \le (1 - g_{1_{min}})h_{12}$, so that net germination fraction is always 1043 between 0 and 1.

1044 Protection models C1-C3 have similar qualitatively nullcline geometries as our main text 1045 protection model (Fig. C4a-d). Though the nullcline for model C1 does not saturate (Fig. C4b), it will vield the same dynamical outcomes as our main text model (Fig. 2) when paired with a 1046 1047 partner such as a nutritional mutualist with a concave down saturating or linear nullcline. Models 1048 C2-C3 have exactly the same qualitative nullcline geometries as our main text model, despite 1049 mutualism potentially affecting different vital rates in these models (Fig. C4c-d). In all cases 1050 (Eqns. C1-C3), as in our main text model (Eqn. 3), the effect of mutualism is independent of 1051 recipient density.

64

In contrast, protection model C4 has qualitatively identical nullcline geometry to our main text seed dispersal model (Fig. C4e), because in both cases the effect of mutualism is dependent on and saturating in terms of recipient density. In model C4, protection services affect a densitydependent process (modifying *s*) and benefit is proportional to attendance or recruitment rate by protectors on the recipient species (saturates via intraspecific density-dependence).

Finally, seed dispersal model C5 has qualitatively similar nullcline geometry to our main text nutrition and protection models (and to protection models C1-C3), because the benefits of seed dispersal (increased germination) are not directly dependent on recipient density.

1060

Extensions

1061 The extensions proposed here are not mutually exclusive and can be applied to any of our main text models. First, we consider an extension that accounts for the costs of rewards 1062 1063 exploitation, including the special case in which depletion of rewards due to exploitation induces 1064 variable and potentially high costs of rewards production. Exploitation costs are those incurred 1065 while a partner is acquiring rewards, such as damage to flowers by pollinators during foraging for 1066 nectar and pollen. Such costs accumulate proportionally to the exploiter's visitation or rewards 1067 consumption rate, which can affect individual fitness and demographic rates, and is often 1068 assumed to affect population growth rate as well (e.g. Aizen *et al.* 2014). Interestingly, rewards 1069 production costs can also accumulate proportionally to rewards consumption rate. For example, 1070 when tended by ants, some aphid species enrich their honeydew with synthesized sugars, which 1071 decreases their fecundity and body size, presumably due to carbohydrate depletion (Yao et al. 1072 2000, Yao & Akimoto 2001). Though honeydew enrichment is a construction cost (rewards

65

production), it can be modeled as proportional to rewards consumption (exploitation) becauseants' consumption behavior induces the metabolic costs of enriching depleted honeydew.

For easy comparison to previous works that include costs (e.g. Holland & DeAngelis
2010, Table A1), we modify our nutritional model with Michaelis-Menten functional responses
to include rewards exploitation costs as follows:

1078
$$\frac{dN_i}{dt} = N_i [b_i (1 - s_i N_i) + c_i C_R (N_j, N_i) - q_i C_R (N_i, N_j) - d_i]$$
Eqn. C6

1079 where costs to population *i* are related to the benefits to population *j* because they occur via the 1080 same mechanism: *j*'s exploitation of *i*'s rewards. Mathematically, this is a special case of 1081 Holland and DeAngelis' (2010) model (specifically, our model has four fewer parameters), which 1082 assumed independently parameterized functional responses for benefits and costs. The coefficient 1083 q_i controls the effect of rewards exploitation on population density. If rewards exploitation has 1084 minimal population-level effects, $0 \le q_i \ll 1$. Assuming both species incur exploitation costs 1085 yields the specific model:

1086
$$\begin{cases} \frac{dN_1}{dt} = N_1 \left[b_1 (1 - s_1 N_1) + c_1 \frac{v_1 N_2}{k_1 + N_2} - q_1 \frac{v_2 N_2}{k_2 + N_1} - d_1 \right] \\ \frac{dN_2}{dt} = N_2 \left[b_2 (1 - s_2 N_2) + c_2 \frac{v_2 N_1}{k_2 + N_1} - q_2 \frac{v_1 N_1}{k_1 + N_2} - d_2 \right]. \text{ Eqn. C7} \end{cases}$$

Our simple nutrition model (Eqn. 2) yields an increasing, concave down nullcline that saturates with respect to the partner's density. Including an explicit term for saturating costs of rewards consumption (Eqn. C7) bends species' nullcline towards the partner's axis at high partner density, eventually curving it back around towards the origin into a lobe shape (Fig. C5a). This is because high partner density exerts high saturating costs on the recipient due to rewards

66

1092	consumption, which may exceed the benefits that can be acquired. When coexistence is feasible,
1093	up to three non-trivial equilibria occur: a stable node flanked by two saddle points. Stable
1094	coexistence can occur at higher densities than either species could achieve alone. However,
1095	separatrices running through the saddle points define basins of attraction that lead to extinction
1096	or, if at least one species is facultative, single-species persistence. This ensures instability when
1097	one population is of substantially higher density than the other due to overexploitation of the rare
1098	partner (regions labeled "E," Fig. C5a). This is contrast to threshold effects defined in the main
1099	text wherein the low-density partner benefits from mutualism but cannot provide sufficient
1100	reciprocal services. When the low-density partner becomes even rarer, it experiences an Allee
1101	effect, leading to its extinction ("A," Fig. C35a). The high-density partner will also go extinct if it
1102	is obligate upon the low-density partner. See Holland and DeAngelis (2010) for a complete
1103	analysis and Cropp and Norbury (2018) for a summary of the model's behavior.

Second, we consider an extension that accounts for dynamics of consumption of individuals in a partner population. For example, butterflies and moths often act as herbivores as larvae (damaging or killing plant vegetation, V) and as pollinators (consuming nectar rewards, R) when mature. Similarly, protector ants sometimes consume individuals of their attendee population (aphids, lycaenids, plants, etc.) in addition to the provided rewards (honeydew, nectar, etc.). This 'vegetative' consumption ($C_V(N_i)$) directly reduces the attendees' density:

1110
$$\frac{dN_i}{dt} = N_i \left[b_i (1 - s_i N_i) - C_V (N_i, N_j) - \left(d_{i_{max}} - d_{i_{diff}} S(N_j) \right) \right]$$
Eqn. C8

1111 and increases the protectors' density:

67

1112
$$\frac{dN_i}{dt} = N_i [b_i (1 - s_i N_i) + C_R (N_j, N_i) + C_V (N_j, N_i) - d_i]$$
Eqn. C9

1113 Specifically, we assume that rewards density is proportional to the attendees' density 1114 (N_1) , and that ants (N_2) forage according to a Holling Type II functional response on both 1115 rewards and N_1 (attendee individuals) but with different attack rates (a_{2R}, a_{2V}) and handling 1116 times (h_{2R}, h_{2V}) :

1117
$$\begin{cases} \frac{dN_1}{dt} = N_1 \left[b_1 (1 - s_1 N_1) - \frac{a_{2V} N_2}{1 + a_{2V} h_{2V} N_1} - \left(d_{1_{max}} - d_{1_{diff}} \frac{N_2}{k_1 + N_2} \right) \right] \\ \frac{dN_2}{dt} = N_2 \left[b_2 (1 - s_2 N_2) + c_{2R} \frac{a_{2R} N_1}{1 + a_{2R} h_{2R} N_1} + c_{2V} \frac{a_{2V} N_1}{1 + a_{2V} h_{2V} N_1} - d_2 \right]. \quad \text{Eqn. C10}$$

Then, attendees exhibit dynamics of an identical mathematical form to nutritional mutualists with rewards exploitation costs (Eqn. C6 with q = 1 indicating consumption of individuals in the population). Protectors that access both rewards and individuals from their partner population exhibit qualitatively similar dynamics to protectors that consume only rewards (Eqn. 2): the nullclines are concave down, increasing curves that saturate with respect to attendee density. However, accessing an additional resource allows the protector population to saturate to a higher density (of $\overline{N_2} = \frac{r_2}{b_2 s_2} + \frac{c_V}{b_2 h_V} + \frac{c_R}{b_2 h_R}$) than could be supported by rewards alone.

In our extended model (Eqn. C10), protector and attendee nullclines may intersect once or twice with similar dynamical outcomes as in our simple model (Fig. 1). When the nullclines intersect exactly twice, the lower-density equilibrium is a saddle point that induces a separatrix, under which overexploitation of attendees by protectors destabilizes the system by inducing an Allee effect in the attendee population that causes extinction of facultative partners. Our simpler

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1130 model also exhibits destabilization that can result in extinction, but due to threshold effects

- 1131 instead of overexploitation (Fig. 1A, B, D).
- 1132 Our extended model also allows for the protector and attendee to intersect three times, 1133 leading to unique dynamical outcomes (Fig. C5b). Here, a separatrix divides the phase plane into 1134 two regions. On the right side, a basin of attraction allows stable coexistence to be maintained at a single high-density node (non-oscillatory coexistence). On the left side, overexploitation ("E," 1135 1136 Fig. C5b) by the protector population causes an Allee effect ("A") in the attendee population, which does not necessarily lead to extinction. After depleting their resource population, the 1137 1138 protector population also declines, eventually allowing the attendee population to receive 1139 sufficient benefit via protection compared to losses due to consumption. The system thus 1140 recovers and coexistence is maintained in this region via a limit cycle (i.e. oscillations) around a 1141 stable center, an outcome not seen in our simpler models.
- 1142

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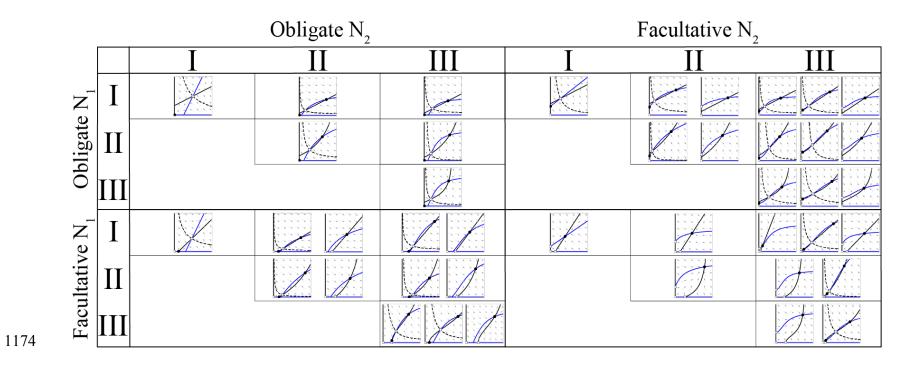
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Type of Benefit	Туре І	Type II	Type III	
Nutrition	- N	$a_{ij}N_j$	$a_{ij}N_j^2$	
$C_R(N_j)$	$a_{ij} N_j$	$\overline{1+a_{ij}h_{ij}N_j}$	$\frac{a_{ij}N_j^2}{1+a_{ij}h_{ij}N_j^2}$	
Protection		N_{j}	N_i^2	
$S(N_j)$	N_{j}	$\overline{k_{ij} + N_j}$	$\frac{N_j^2}{k_{ij} + N_j^2}$	
Transportation:			2	
Pollination	$N_j N_i$	$\frac{a_{ji} N_j N_i}{1 + a_{ji} h_{ji} N_i}$	$\frac{a_{ji}N_jN_i^2}{1+a_{ji}h_{ji}N_i^2}$	
$S(\boldsymbol{N}_i, \boldsymbol{N}_j) = C_R(\boldsymbol{N}_i, \boldsymbol{N}_j) * \boldsymbol{N}_i$				
Seed Dispersal	N _i	$a_{ji}N_j$	$\frac{a_{ji} N_j N_i}{1 + a_{ji} h_{ji} N_i^2}$	
$S(\boldsymbol{N}_i, \boldsymbol{N}_j) = C_R(\boldsymbol{N}_i, \boldsymbol{N}_j)$	14 j	$1 + a_{ji}h_{ji}N_i$	$1 + a_{ji}h_{ji}N_i^2$	

Table C1. Functional forms. Functional forms used to assess robustness of results for each model. Functional forms describe the consumption rate on a1172partner's rewards (C_R) or the accrual of services provided by a partner (S), which, in the transportation models, are a function of the partner's consumption1173rate. Indices i and j refer to the recipient and partner population, respectively. For the nutrition model, we use the Holling notation for convenience.



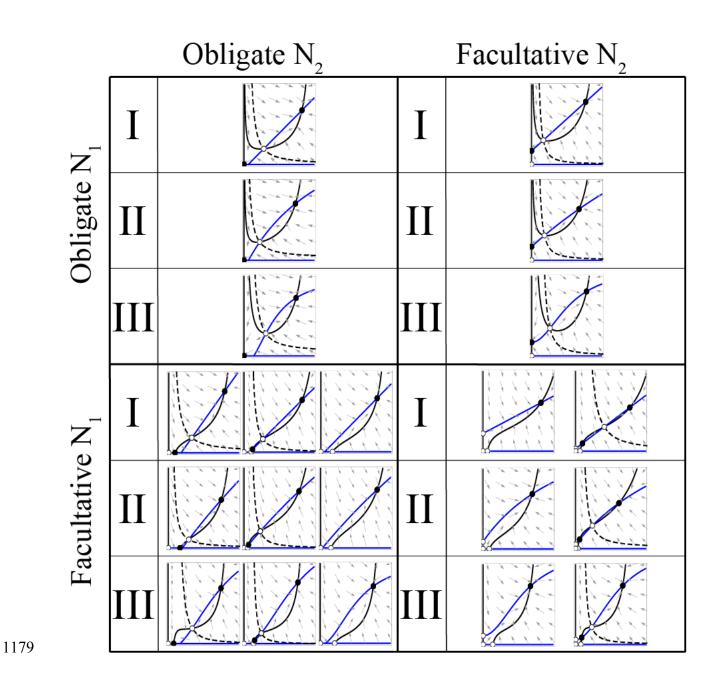
1175 Figure C1. Effect of functional form on nutrition and protection mutualisms. Panels show phase plane diagrams with unique dynamical outcomes

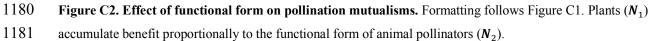
1176 when each partner population (N_1 , black; N_2 , blue) is an obligate or facultative mutualist following a Holling Type I, II, or III functional response (Table

1177 C1). Equilibria are stable (filled, black) or unstable or saddle points (hollow). Saddle points are bisected by a separatrix (dashed black line) that divides the

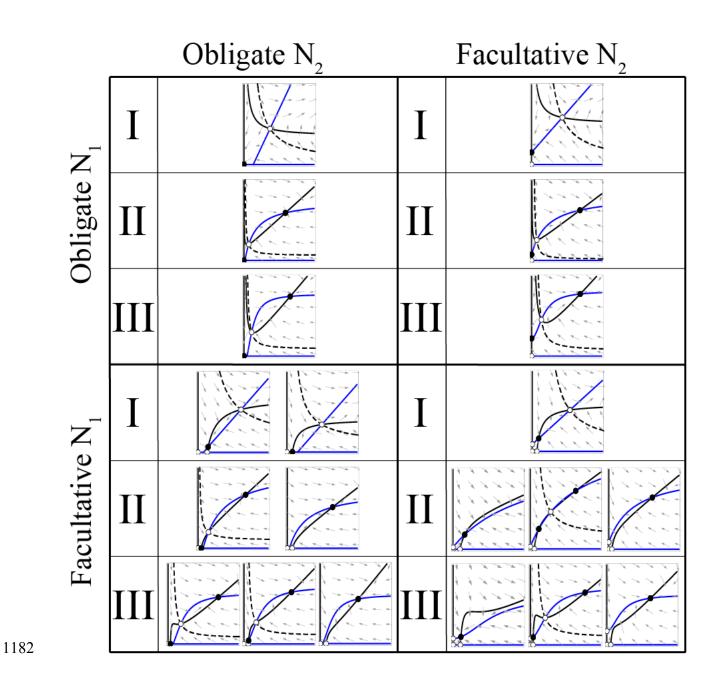
1178 plane into two regions.

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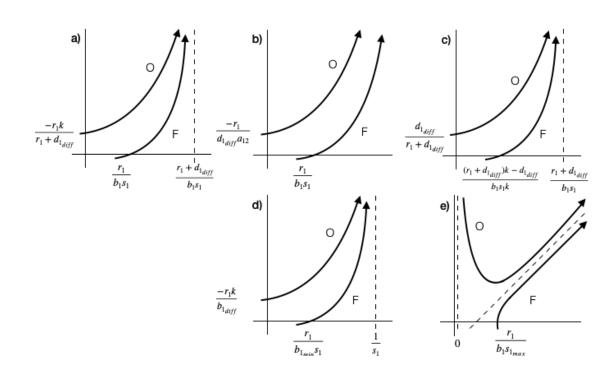


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1183Figure C3. Effect of functional form on seed dispersal mutualisms. Formatting follows Figure1184C1. Plants (N_1) accumulate benefit proportionally to the functional form of animal pollinators1185 (N_2) .

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1187 Figure C4. Nullcline geometry of alternative protection models. Only geometries when coexistence is feasible are

1188 shown. Nullclines (black lines) intersect the x-axis when recipients of protection services are facultative (F)

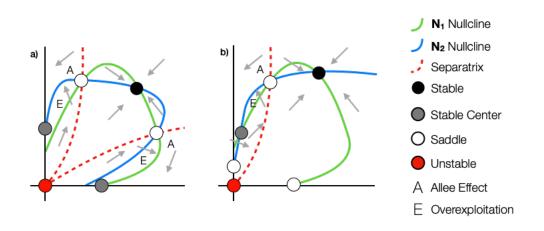
1189 mutualists or the y-axis when they are obligate (O). Asymptotes are shown with dashed lines. (a) Main text model

1190 (Eqn. 3). (b) Model C1. (c) Model C2. (d) Model C3. (e) Model C4. (b-d) Benefits are not directly dependent on

1191 recipient density, but saturate due to (c) inter- or (b, d) intraspecific density-dependence. (d) Benefits are

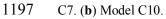
additionally limited by negative density-dependence. (e) Benefits are directly dependent on recipient density and

1193 saturate due to intraspecific density-dependence.



1195 Figure C5. Phase plane diagrams for our extensions. Only a sampling of cases is shown for comparison to our

1196 main text models (Figs. 1-3) and Holland and DeAngelis' (2010) models including cost terms (Table A1). (a) Model



1194