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1 **Imperfect detection alters the outcome of management strategies for protected areas**

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6 **Statement of Authorship.** The experiment was conceived by EH following multiple  
7 conversations with CFC. EH conducted the experiment and ran the analyses relating to species  
8 richness, probability of predators, and number of extinctions. CFC designed and conducted all  
9 analyses relating to sampling protocols. EH wrote the first draft of the MS, both authors  
10 contributed substantially to editing the MS.

11 **Running title:** Patch configuration versus sampling regime

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19 Supplementary Materials - Appendix S1

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21

22 **Statement on data accessibility**

23 Data have been submitted to the Dryad Data repository, DOI

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25

26

27 **Abstract**

28 Designing protected areas configurations to maximize biodiversity is a critical conservation goal.  
29 The configuration of protected areas can significantly impact the richness and identity of the  
30 species found there; one large patch supports larger populations but can facilitate competitive  
31 exclusion. Conversely, many small habitats spreads risk but may exclude predators that typically  
32 require large home ranges. Identifying how best to design protected areas is further complicated  
33 by monitoring programs failing to detect species. Here we test the consequences of different  
34 protected area configurations using multi-trophic level experimental microcosms. We  
35 demonstrate that for a given total size, many small patches generate higher species richness, are  
36 more likely to contain predators, and have fewer extinctions compared to single large patches.  
37 However, the relationship between the size and number of patches and species richness was  
38 greatly affected by insufficient monitoring, and could lead to incorrect conservation decisions,  
39 especially for higher trophic levels.

40

41 **Introduction**

42 The designation of protected areas remains at the heart of conservation efforts (Watson *et al.*  
43 2016). When designing protected areas, managers are tasked with deciding whether greater  
44 outcomes may be achieved by investing in a small number of large, or a large number of small  
45 protected areas (Diamond 1975). A small number of large protected areas may allow species to  
46 exist at higher population abundances, thereby reducing extinction risk (Mccarthy *et al.* 2011).  
47 This issue of home range may be especially true of apex predators, which may require larger  
48 home ranges than species in lower trophic levels (Mcnab 1963; Fauvelle *et al.* 2017). However,  
49 having a small number of protected areas may increase stochasticity, demographic and  
50 otherwise, potentially decreasing the number of species protected through extinctions (Whittaker  
51 & Fernández-Palacios 2007). In addition, a small number of large protected areas may increase  
52 the chance that the whole network becomes dominated by a few highly competitive species  
53 (Schippers *et al.* 2015). Given the potentially negative outcomes for a small number of large  
54 protected areas, managers may instead opt for a large number of smaller protected areas (Higgs  
55 & Usher 1980; Simberloff & Abele 1982; Wintle *et al.* 2019). However, a large number of  
56 smaller locations may be unable to support species with large resource requirements, and runs  
57 contrary to principles from species-area relationships and the theory of island biogeography  
58 (Diamond 1975; Tjørve 2010). The question of “single/few large” or “several/many small” (The  
59 SLOSS or FLOMS debate) has received a substantial amount of attention in the decades since its  
60 inception, but whether greater biodiversity outcomes are achieved through a small number of  
61 large protected areas, or a large number of small protected areas remains unresolved. It therefore  
62 becomes critical to test the consequences of different protected area configurations using a

63 replicated, manipulable system that contains a suite of species embedded in a complex,  
64 multitrophic foodweb.

65         Having sufficient information relating to the distribution of species is critical when  
66 making any decisions about the importance of different habitat patches (Maxwell *et al.* 2015).  
67 Insufficient sampling may fail to detect species when they are present, leading to biased  
68 estimates of site occupancy (Mackenzie *et al.* 2003; Loehle & Weatherford 2017). In addition,  
69 monitoring efforts should be designed so as to achieve sufficient temporal and spatial coverage  
70 to understand the state of the system (Legg & Nagy 2006; Rhodes & Jonzén 2011). For example,  
71 while targeted monitoring may provide information as to whether or not a particular species of  
72 interest is present, it may fail to detect species that exist in non-targeted locations, leading to an  
73 underestimate of total biodiversity (Nichols & Williams 2006; Nielsen *et al.* 2009). Given the  
74 difficulties associated with monitoring wild systems, understanding whether better conservation  
75 outcomes are achieved through the designation of few large or several small protected areas  
76 becomes difficult. It therefore becomes necessary to test how allocating protected areas using  
77 imperfect information affects conservation outcomes compared to those generated using perfect  
78 information.

79         Laboratory-based systems provide an ideal arena to test questions relating to the  
80 SLOSS/FLOMS debate, and the issue of monitoring, as populations of multiple interacting  
81 species can be assembled and closely monitored. One system used to test broad ecological  
82 concepts is that based on freshwater ciliate protozoa due to their small size, ease of manipulation,  
83 and high replicability (Drake & Kramer 2012; Altermatt *et al.* 2015). In addition, the global  
84 biomass of protists has been estimated to be double that of the animal kingdom (Bar-On *et al.*  
85 2018), highlighting their ecological relevance. The short generation times of the species used

86 means that multi-generational data can be rapidly collected, making the system ideally suited for  
87 studies on population biology (Lawler & Morin 1993; Hammill *et al.* 2015), community ecology  
88 (Clements *et al.* 2013a; Carrara *et al.* 2015), metacommunity dynamics (Holyoak & Lawler  
89 2005; Resetarits *et al.* 2018), biodiversity-ecosystem function experiments (DeLong & Gibert  
90 2019), and conservation issues (Fryxell *et al.* 2006; Benton *et al.* 2007). The protist system can  
91 also contain complex food webs, consisting of up to four trophic levels that incorporate  
92 omnivory and specialization (Forbes and Hammill 2013, Fig 1). Protist microcosms represent an  
93 excellent system to address the SLOSS/FLOMS question as customized microcosms of a range  
94 of different sizes can be easily and accurately produced. The individual microcosms can then be  
95 combined to produce portfolios of microcosms that are representative of suites of protected areas  
96 that have no connectivity, a situation present in ~50% of global protected areas (Santini *et al.*  
97 2016; Saura *et al.* 2018).

98         We performed an experiment to test how the configuration of simulated protected areas  
99 performs in terms of the amount of species represented, and how different monitoring protocols  
100 affect our ability to detect what species were present. The experiment utilized custom designed  
101 protist microcosms of varying volumes that were inoculated with nine species. Each microcosm  
102 (or patch) was disconnected from each other, and is intended to represent a single, isolated  
103 protected area. Individual patches were periodically sampled to assess the abundances of the  
104 species present. These patch-level data were then used to construct protected area portfolios  
105 (analogous to "experimental landscapes" used in Pasari *et al.* 2013; Hammill *et al.* 2018) that  
106 allowed us to investigate whether for a given total area, better biodiversity outcomes were  
107 achieved through few large or many small patches. Protected area portfolios were produced by  
108 combining (without replication) the abundance data for between 1 and 8 of the patches, and the

109 number of patches and total volume was recorded. To these portfolios with perfect knowledge of  
110 the community composition we then applied various imperfect sampling protocols. Using this set  
111 up we were then able to ascertain how increasing the number of patches vs. increasing the  
112 overall size of the portfolio 1) affects the number of species present in the system, 2) affects the  
113 presence or absence of apex predators, 3) alters the number of extinctions, and 4) how imperfect  
114 sampling changes our ability to discern between optimal and suboptimal management options.

115

## 116 **Methods**

### 117 **Experimental microcosms**

118 The experiment was conducted using custom-designed, 3D-printed microcosms, produced at  
119 GoR3 Printing Services (Logan, UT, USA) on a Formlabs© Form 2 printer using Formlabs©  
120 standard resin in white. The 3D printer was used to create 9 (160mm \* 140mm \* 14mm) plates,  
121 each of which had 5 unconnected patches, one each of 4, 8, 16, 32 and 64ml, for a total of 45  
122 patches. Patches were designed in such a manner that as overall ecosystem size increased,  
123 surface area to volume ratio, and edge to volume ratio both remained constant (supplementary  
124 material).

125 Experimental media consisted of 0.4 g/L crushed protozoa pellets (no. 13-2360; Carolina  
126 Biological Supply, Burlington, NC, USA) dissolved in Purelife™ mineral water (Nestle, USA).  
127 Plates were covered by Perspex lids to reduce evaporation and were topped up to their original  
128 level every 3.5 days with deionized water. Following top up, 10% of the media was removed  
129 from each ecosystem and replaced in order to ensure some nutrients were available for bacterial  
130 growth (Forbes & Hammill 2013; Hammill *et al.* 2015). All patches were initially inoculated  
131 with the following (values in parentheses give the initial inoculation densities) *Paramecium*

132 *multimicronucleatum* (50 ind.ml<sup>-1</sup>), *Paramecium aurelia* (100 ind.ml<sup>-1</sup>), *Blepharisma sp* (50  
133 ind.ml<sup>-1</sup>), *Euplotes sp* (50 ind.ml<sup>-1</sup>), *Tetrahymena sp* (200 ind.ml<sup>-1</sup>) and *Didinium nasutum* (5  
134 ind.ml<sup>-1</sup>), the algae *Volvox* (20 ind.ml<sup>-1</sup>), the Turbellarian flatworm *Stenostomum virginianum* (2  
135 ind.ml<sup>-1</sup>), and the rotifer *Philodina* (10 ind.ml<sup>-1</sup>). The community was supported by a bacterial  
136 basal resource consisting of *Serratia* and *Bacillus subtilis*. The food web consisted of three  
137 trophic levels, with intraguild predation occurring (Fig 1). We defined *Stenostomum* and  
138 *Didinium* as apex predators as they are not consumed by any species, and do not consume the  
139 basal resource. All taxa were obtained from Carolina Biological Supply (Burlington NC) with  
140 the exception of *S. virginianum*, which were raised from a single individual isolated from a pool  
141 on the Logan river, UT.

142 The experiment was conducted at 19°C on a 16hr:8hr light:dark cycle and ran for 21  
143 days. On day 21, the entire media in each patch was analyzed using a Bogorov counting chamber  
144 and we recorded total number of taxa present (species richness), whether the ecosystem  
145 contained apex predators, the total abundance of each taxa in the ecosystem, and whether any  
146 extinctions had taken place. As all taxa were inoculated into each patch, an extinction was  
147 deemed to have occurred if a taxa was not detected in the total sample on day 21.

148

### 149 **Protected area portfolios**

150 We combined the abundance data from each patch to produce 21045 portfolios of patches  
151 by sampling without replacement a specified number of patches (from 1 to 8). It is critical to note  
152 that within these portfolios, there was no connectivity among the patches, meaning they  
153 represent an extreme condition as connectivity represents a critical landscape characteristic  
154 (Taylor *et al.* 1993). However, this lack of connectivity is considered representative of 50% of



155 protected area networks in the field, (Santini *et al.* 2016; Saura *et al.* 2018). Within our portfolios  
156 there was therefore no potential for some processes associated with reducing extinctions in  
157 natural populations, such as rescue effects (Ferraz *et al.* 2007). In total we had abundance data  
158 for 45 patches, meaning the total number of potential portfolios was greater than  $1.6e^{56}$ , forcing  
159 us to use a subsample. We used data from all single-patch portfolios (45 portfolios). The  
160 remaining 21000 portfolios were produced using a stratified sampling protocol to produce a  
161 balanced number of portfolios across different combinations of patch number (3000 for each  
162 patch number) and total volume. Some configurations were not possible given the physical  
163 characteristics of the patches (i.e. maximum volume of a single patch is 64ml, therefore a  
164 portfolio consisting of 2 patches cannot have a volume of 150ml). We used the following  
165 parameters as descriptive variables in all analyses - the number of patches within the portfolio  
166 and the total volume. To compare how these descriptive variables affected diversity, we  
167 calculated (i) portfolio level species richness (ii) whether the portfolio contained apex predators,  
168 and (iii) number of extinctions from whole portfolios. Each response variable was analyzed using  
169 a generalized linear model, and we used hierarchical partitioning (Chevan & Sutherland 1991) to  
170 estimate the proportion of the total variation in each response variable attributable to patch  
171 number and total portfolio volume. We opted to use hierarchical partitioning in place of  
172 reporting p-values for the portfolio-level analysis as hierarchical partitioning demonstrates the  
173 importance of each response variable, and the large sample sizes used in our experiment are  
174 always likely to generate significant p-values. To specifically look at effect sizes and address the  
175 SLOSS/FLOMS question, we also looked at the difference in each biodiversity metric between  
176 portfolios containing 1 patch of 64ml (single large), and 8 patches that total 64ml (several small).  
177 To tease apart how the number of patches in a portfolio and total portfolio volume influenced our

178 response variables, we split the data and ran individual models looking at total portfolio volume  
179 for each number of patches.

180

### 181 **Imperfect sampling protocols**

182 We applied imperfect sampling to understand how different search efforts and protocols provide  
183 information about diversity measures. Following the method of Clements et al. (2013, 2015) we  
184 implemented four search efforts (“SE”) – 0.1ml, 1ml, 10ml, and 100ml. In addition, we  
185 simulated four search regimes (“SR”) that determined how search effort was split across patches  
186 within the portfolio – (i) from the smallest to largest patch, (ii) from the largest to smallest patch,  
187 (iii) uniformly across all patches, and (iv) randomly allocating which patch was searched first.

188 For the smallest to largest, largest to smallest, and random search regimes the search effort was  
189 allocated to a single patch, then any remaining search effort was reallocated to the next patch and  
190 so on. For uniform sampling SE was divided amongst the patches in the portfolio, regardless of  
191 the patch size. To assess whether a species was observed in a patch under a given SE, the SE  
192 allocated to that patch was converted to a percentage of the patch sampled. The number of  
193 individuals of each species observed was then calculated by drawing a binomial random variate  
194 with size equal to the known abundance of the species in the patch and probability set to the  
195 percentage search effort. All analyses were conducted using the R statistical programming  
196 language (R Core Team 2018).

197

### 198 **Results**

199 *Patch volume*

200 Patch volume accounted for 30.04% of the variation in species richness, with increased volume  
201 being associated with increased richness ( $z = 2.12$ ,  $P = 0.034$ , Fig 2a). Increased volume also  
202 increased the chance of apex predators being present ( $z = 2.163$ ,  $P = 0.031$ , Fig 2b), accounting  
203 for 26.63% of the total variation. Increased volume also all decreased the number of extinctions  
204 (Fig 2c), accounting for 30.20% of the variation in extinction number ( $z = -2.65$ ,  $P = 0.0081$ , Fig  
205 2c).

206

### 207 *Portfolio configuration*

208 Increasing the number of patches represented a significantly better option when aiming to  
209 increase species richness and reduce the number of extinctions than increasing portfolio number  
210 (GLM with Poisson distribution Fig 3). Overall species richness within a portfolio increased as  
211 patch number and total volume increased (Fig 3a), accounting for 25.47% and 15.11% of the  
212 variation in species richness respectively (hierarchical partitioning). With respect to  
213 SLOSS/FLOMS, GLM outputs predicted that for portfolios of 64ml, species richness increased  
214  $39.20\% \pm 1.71\%$  from  $6.64 \pm 0.43$  species in a one patch portfolio to  $9.01 \pm 0.32$  species in an  
215 eight patch portfolio. When the data were split on the basis of patch number and individual  
216 models run, model outputs revealed that at any given volume, to increase species richness to the  
217 same extent as adding a patch to the portfolio would require a volumetric increase of  $25.12\text{ml} \pm$   
218  $7.41\text{ml}$  (Fig 3a). The probability that all nine species were present on day 21 increased with  
219 patch number and portfolio volume (GLM with binomial distribution Fig 3b). Patch number  
220 accounted for 14.59% of the total variation in the probability a portfolio contained all nine  
221 species, while total portfolio volume accounted for 9.94%. GLM model outputs predicted that  
222 the probability a 64ml portfolio contained all nine species increased by  $15.36 \pm 0.25$  times from

223 0.049 ± 0.002 for a single large patch portfolio to 0.76 ± 0.010 for an eight patch portfolio. GLM  
224 outputs also revealed that total portfolio volume would need to increase by 61.77ml ± 1.66ml  
225 (Fig 3b) in order to achieve the same benefit as increasing the number of patches by one while  
226 keeping volume constant.

227         The probability that a portfolio contained apex predators increased as both the number of  
228 patches and total portfolio volume increased (Fig 3c). The number of patches within the portfolio  
229 and total portfolio volume accounted for 6.04% and 4.13% of the total variation in apex predator  
230 probability respectively. In terms of the SLOSS/FLOMS question, GLM model outputs predicted  
231 that the probability a 64ml portfolio contained predators increased by 2.02% ± 1.30 % from 0.97  
232 ± 0.007 when the portfolio contained a single large patch to 0.99 ± 0.06 when the portfolio  
233 contained 8 patches. To further tease apart how patch number and portfolio volume affect  
234 predator probability we again split the data and ran separate models. We constrained our analysis  
235 to portfolios containing < 5 patches due to the very high probability of predators occurring in all  
236 portfolios with 5 or more patches. We found the total volume of the portfolio would need to  
237 increase by 2.53ml ± 0.36ml to increase the probability of apex predators being present to the  
238 same extent as keeping volume constant but increasing the number of patches by 1 (Fig 3c).

239         The number of extinctions observed at the portfolio level decreased as both patch  
240 number and total portfolio volume increased (Fig 3d). Patch number and total portfolio volume  
241 accounted for 25.24% and 23.33% of the variation in patch number respectively. GLM outputs  
242 indicated the number of extinctions being reduced by 32.18% ± 2.38% from 1.61 ± 0.024 to 0.52  
243 ± 0.015 as the number of patches increased from one to eight in a 64ml portfolio. When the  
244 portfolios were split on the basis of patch number, to reduce the number of extinctions to the

245 same extent as increasing the number of patches in a portfolio would require increasing overall  
246 portfolio volume by  $15.56\text{ml} \pm 0.25\text{ml}$  (Fig 3d).

247

### 248 **Imperfect sampling and optimal portfolio configurations**

249 Imperfect sampling significantly altered the probability of observing all nine taxa (Fig. 4), with  
250 low search efforts (0.1ml) typically detecting around 1/3 of the species observed with high  
251 search efforts (100ml). We however found a significant interaction between search effort and the  
252 search regime (how search effort was allocated across patches). At high search efforts (100ml)  
253 the search regime had little effect on the number of species detected (Fig. 4), whilst at low search  
254 efforts choosing the right search regime had a significant impact on the ability to determine the  
255 species richness of the portfolios (Fig. 4). Of the four search regimes, uniform sampling detected  
256 the highest number of species when search efforts were low to moderate (0.1ml to 10ml). Where  
257 search effort was directional (allocated either from large to small patches, or from small to large)  
258 and low (0.1ml and 1ml) there was an interaction between the volume of the portfolio and patch  
259 number, making it possible to significantly underestimate the species richness of large portfolios  
260 with many patches (which in reality contained the most species) (Fig. 4).

261 The probability of detecting apex predators was determined by the search regime  
262 implemented, the search effort, and the number of patches within a portfolio (Fig. 5). Again,  
263 uniform sampling produced the least biased estimates of apex predator presence regardless of  
264 search effort, whilst other search regimes typically overestimated the importance of small, low  
265 volume portfolios at low search efforts (0.1-10ml). However, uniform sampling showed a  
266 significant decline in the probability of observing apex predators with increasing portfolio  
267 volume at low search efforts, whereas in reality patch volume and the number of patches had a

268 significant positive effect on the number of predators present (Fig. 3c). At high search efforts  
269 both small to large and large to small search regimes underestimated the importance of high-  
270 volume portfolios with high numbers of patches (Fig. 5).

271

## 272 **Discussion**

273 The question of whether conservation managers should invest in a few large, or many small  
274 protected areas has resurfaced multiple times since its inception (Diamond 1975; Higgs & Usher  
275 1980; Simberloff & Abele 1982; Virolainen *et al.* 1998; Whittaker & Fernández-Palacios 2007;  
276 Lindenmayer *et al.* 2015; DeLong & Gibert 2019). Our results reveal that with perfect  
277 information about the system (i.e. the entire portfolio is sampled), increasing the number of  
278 patches within a portfolio increases species richness, increases the likelihood of apex predators  
279 being present, and decreases extinctions. However, our analyses also demonstrate that  
280 “incorrect” results (i.e. deducing that fewer patches increase the probability of maximizing  
281 species richness) may be observed if the amount of the portfolio sampled is insufficient, and/or  
282 an incorrect sampling protocol is used.

283         At the single patch level, we found that higher levels of species richness and lower levels  
284 of extinction were associated with greater patch volumes. These results agree with classic  
285 concepts such as the species area relationship (Preston 1962; Connor & McCoy 1979) and the  
286 theory of island biogeography (MacArthur & Wilson 1967), which state that as patch area  
287 increases, richness should increase through reduced extinction rates. As all species were initially  
288 inoculated into all patches, extinction represents the only way richness can decline, via either  
289 competitive exclusion (Hardin 1960; Johnson & Bronstein 2019), over-exploitation by predators  
290 (DeLong & Vasseur 2013) or stochasticity (Melbourne & Hastings 2008). With respect to higher

291 trophic levels, we found that greater patch volume increased the probability of apex predators,  
292 agreeing with previous studies describing how larger patches provide sufficient resources to  
293 support predator populations (Post *et al.* 2000). In our present study apex predators were found  
294 in all patches greater than 30ml in volume, however they were also present in five of the nine  
295 smallest patches (4ml). As all species were inoculated in all patches, the lack of apex predators in  
296 some smaller patches suggests stochastic extinctions potentially due to small population sizes in  
297 the small patches. Given recent work showing the importance of apex predators as indicators of  
298 healthy patches (Atwood & Hammill 2018) and drivers of resilience (Llope *et al.* 2011), one key  
299 management goal might be to increase the probability of apex predators persisting. Our results  
300 suggest that if this is to be achieved, portfolios should contain at least some large habitats.

301         With respect to portfolio-level species richness, we found that to increase the probability  
302 of all nine species being present to the same extent as adding a single patch would require a  
303 volumetric increase of over 60ml, a volume greater than 4 of the 5 patches used in the study.  
304 This requirement of a large increase in volume suggests that partitioning a portfolio into a greater  
305 number of patches, rather than just increasing size, may be a more efficient process to yield  
306 biodiversity gains (Oertli *et al.* 2002; Rösch *et al.* 2015). The importance of multiple patches for  
307 species richness is further highlighted by the amount of variation in species richness associated  
308 with changes in patch number, and the substantial increase in richness observed between a 1-  
309 patch an 8-patch portfolio of 64ml total volume. However, the factors determining whether a  
310 portfolio contained apex predators were less clear, with an increase of just 2.53ml being required  
311 to achieve the same benefit as increasing patch number. Given that the smallest patch used in the  
312 study was 4ml, a volume greater than 2.53ml, increasing patch number may not be the best  
313 option to increase apex predator probability. Total portfolio volume also accounted for a greater

314 proportion of the variation in the probability a portfolio contained apex predators, and the  
315 difference in the probability of predator presence between a 1-patch and an 8-patch 64ml  
316 portfolio was very small. These modest increases associated with increased patch number  
317 suggest it may be better to incrementally increase the size of patches rather than add another.  
318 This process of incrementally increasing the amount of habitat may also be cheaper than  
319 establishing new areas, due to previously demonstrated economies of scale (Balmford *et al.*  
320 2004; Bruner *et al.* 2004). Our results therefore suggest that the next step to be taken to increase  
321 biodiversity outcomes may depend on management goals. If the primary goal is to increase the  
322 chance that the portfolio contains the maximum number of species, then adding a new patch to  
323 the portfolio would generate the best potential outcomes. Conversely, if the main goal is to  
324 increase the chance that a portfolio contains apex predators (Macdonald *et al.* 2015), then  
325 incrementally increasing the size of existing protected areas within the portfolio may be a better  
326 option, highlighting the need to identify clear, quantifiable goals to guide management  
327 (Moilanen *et al.* 2009).

328 Imperfect sampling of the portfolios generated qualitatively different outcomes than  
329 when portfolios were perfectly sampled. Most critically, when search effort was low (i.e. 0.1ml  
330 or 1ml) and total patch volume was > 100ml, the probability of observing all nine species was  
331 higher when patch number was lower for all but the uniform sampling regime. This result is the  
332 opposite of that obtained when the entire portfolio was perfectly sampled, and highlights the  
333 need for monitoring programs to have sufficient power to understand the overall system (Legg &  
334 Nagy 2006; Rhodes & Jonzén 2011). For portfolios with many patches, the probability that at  
335 least one of the patches would be small (i.e. 4ml) is increased. The increased chance of there  
336 being one small patch would mean that under a “small to large” search protocol, it is likely that



337 all the search effort would be put into sampling a small patch, which were never observed to  
338 contain all nine species. Therefore, under a “small to large” search protocol with a large number  
339 of patches, it becomes difficult to observe all nine species, even though other patches in the  
340 portfolio may contain other species. When patch number is small, the chance of there being at  
341 least one small patch is reduced, increasing the probability that a larger patch is sampled under a  
342 “small to large” protocol. Under a “large to small” search protocol, the chance that very large  
343 (i.e. 64ml) patches were selected for search would increase as patch number increased. For these  
344 large patches, a small search effort appears insufficient to detect all nine species. The insufficient  
345 effort dedicated to a large patch may explain why in a “large to small” search protocol, the  
346 probability of detecting all nine species decreases as patch number increases. However, with  
347 sufficient search effort (i.e.  $\geq 10$ ml sampled) or under a “uniform” sampling regime,  
348 qualitatively similar results are obtained under imperfect sampling as for perfect, highlighting the  
349 effectiveness of proper monitoring protocols (Lindenmayer & Likens 2010). The negative  
350 consequences of insufficient sampling and/or an inappropriate protocol become more apparent  
351 with respect to predator detection. Due to their lower population densities and wide ranges,  
352 predators may require either more search effort, or the importance of correct monitoring  
353 protocols may be increased (Johnson *et al.* 2019). In the present study when search effort is  
354 0.1ml – 10ml, both a small to large protocol and a large to small protocol always produce  
355 incorrect results (i.e. predators are more likely in low volume portfolios that contain few  
356 patches). In addition, even a uniform sampling protocol may produce incorrect results if the  
357 search effort is 1ml and portfolio volume is less than  $\sim 25$ ml, highlighting the need for sufficient  
358 power and an appropriate sampling design (Lindenmayer & Likens 2010; Rhodes & Jonzén  
359 2011). These results have significant implications for the monitoring of protected areas, and

360 implies that when dividing limited search effort across multiple habitats, the same amount of  
361 absolute effort should be invested to each patch regardless of their size, as doing so reduces the  
362 chances of biodiversity estimates being different to what is taking place in the system.

363 In conclusion, our results show that for a given total size, increasing the number of  
364 patches appears to generate better biodiversity outcomes than increasing patch size if the goal is  
365 to maximize diversity. However, our results highlight the importance of appropriate monitoring  
366 schemes, as insufficient effort or incorrect protocols generate estimates of species richness that  
367 are the inverse of those generated with perfect information. This is particularly true when  
368 conserving higher trophic level species such as apex predators, which are both of critical  
369 importance for the functioning of ecosystems (Atwood *et al.* 2015), and difficult to conserve due  
370 to their range requirements.

371

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376

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- 525

526 **Figure Legends**

527 Fig. 1. Proposed food web of the communities used in the experiment. The food web consists of  
528 multiple trophic levels and includes a high degree of intraguild predation. UV lighting was  
529 provided to facilitate primary production. Consumptive links were obtained from (Lawler &  
530 Morin 1993; Spencer & Warren 1996; Worsfold *et al.* 2009; Forbes & Hammill 2013).

531

532 Fig. 2. Effects of increasing the volume of a single ecosystem on (a) species richness, (b) the  
533 probability of predators being present in an ecosystem, and (c) the number of observed  
534 extinctions. Solid lines represent individual model outputs for each ecosystem number, dashed  
535 lines represent standard errors.

536

537 Fig. 3. Relationship between the number of patches in a landscape and total landscape volume on  
538 (a) landscape level species richness and (b) the probability a landscape contained all nine  
539 species. Effects of increasing total landscape volume and the number of patches in a landscape  
540 on (c) the probability a landscape contains predators and (d) the number of extinctions in a  
541 landscape. in the case of predator probability (c), all landscapes with 5 or more patches or greater  
542 than 50ml in volume contained predators, so we limited the analysis to a subset of the data. Solid  
543 lines represent model output for individual models ran for each ecosystem number, dashed lines  
544 represent standard errors.

545

546 Fig 4. Effects of imperfect sampling and search regimes on the probability of observing all nine  
547 species. Uniform sampling consistently detected the greatest number of species regardless of  
548 search effort, whilst at low search efforts directional sampling (where the search effort was

549 allocated either from large to small patches, or from small to large patches) suggested that small  
550 landscapes with few patches contained more species than large landscapes with many patches,  
551 when in fact the opposite was true.

552

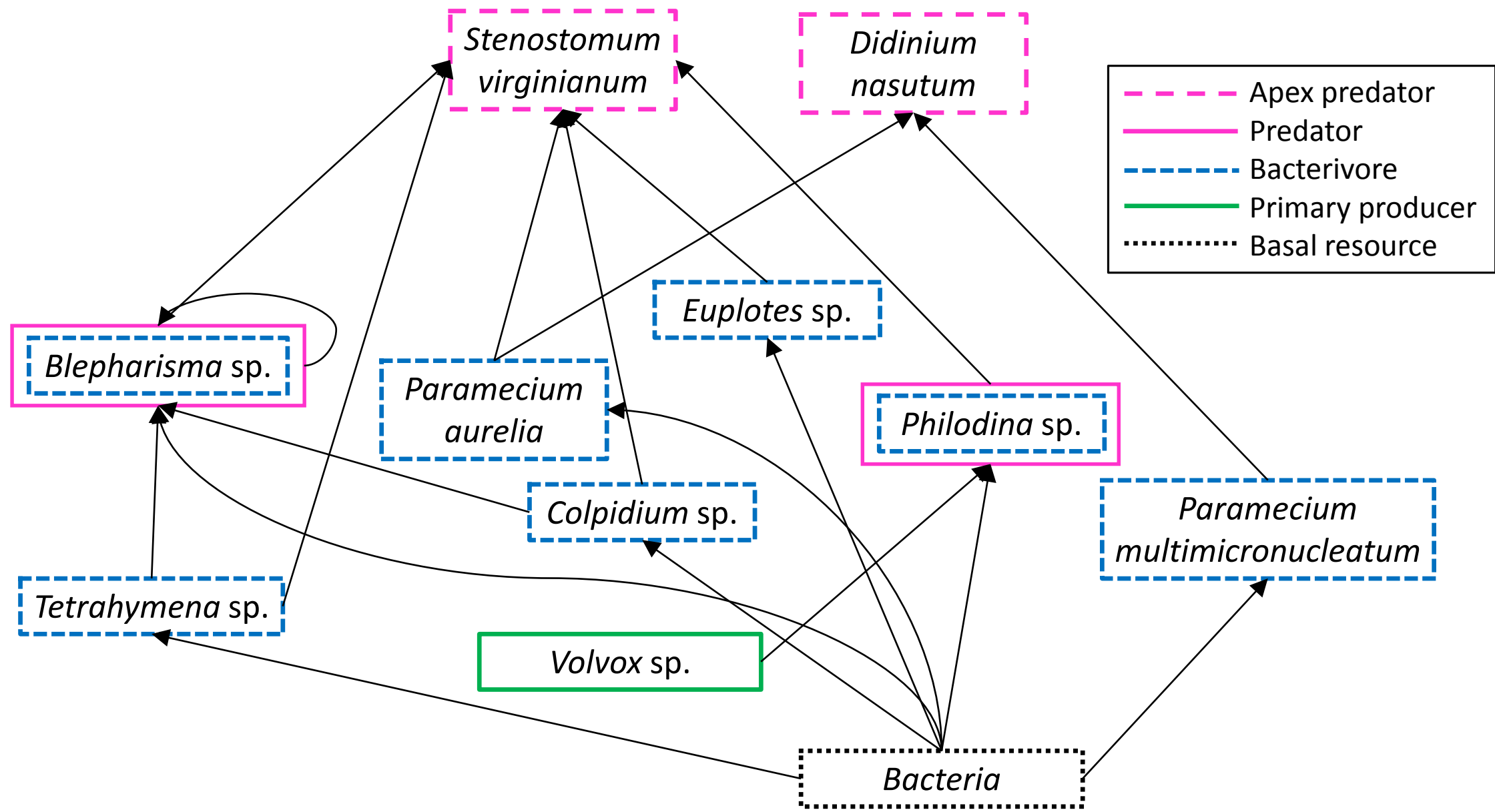
553 Fig 5. Effects of imperfect sampling and search regimes on the probability of apex predators  
554 being observed in a portfolio. Uniform sampling produced the most reliable estimates of apex  
555 predator presence regardless of search effort, however at low search efforts the results suggest  
556 that a few small patches are more likely to harbor an apex predator than a larger number of  
557 patches.

558

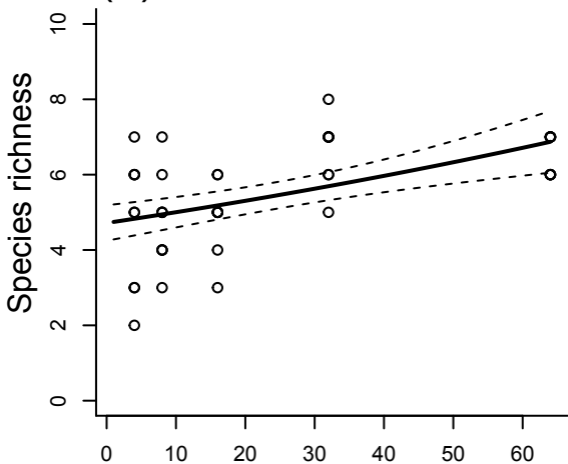
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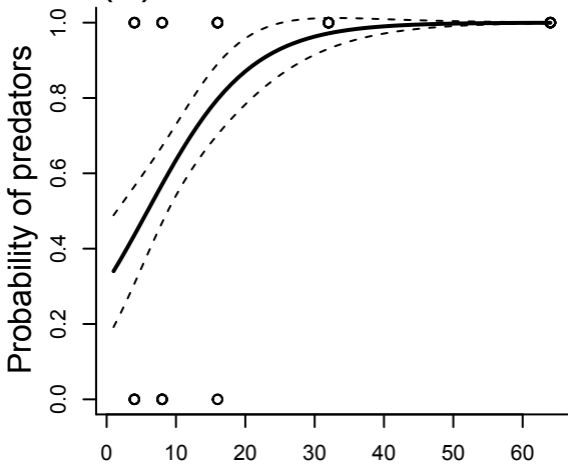




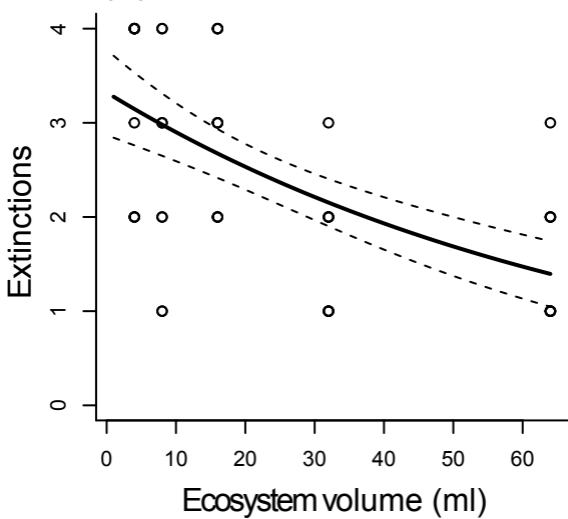
(a)

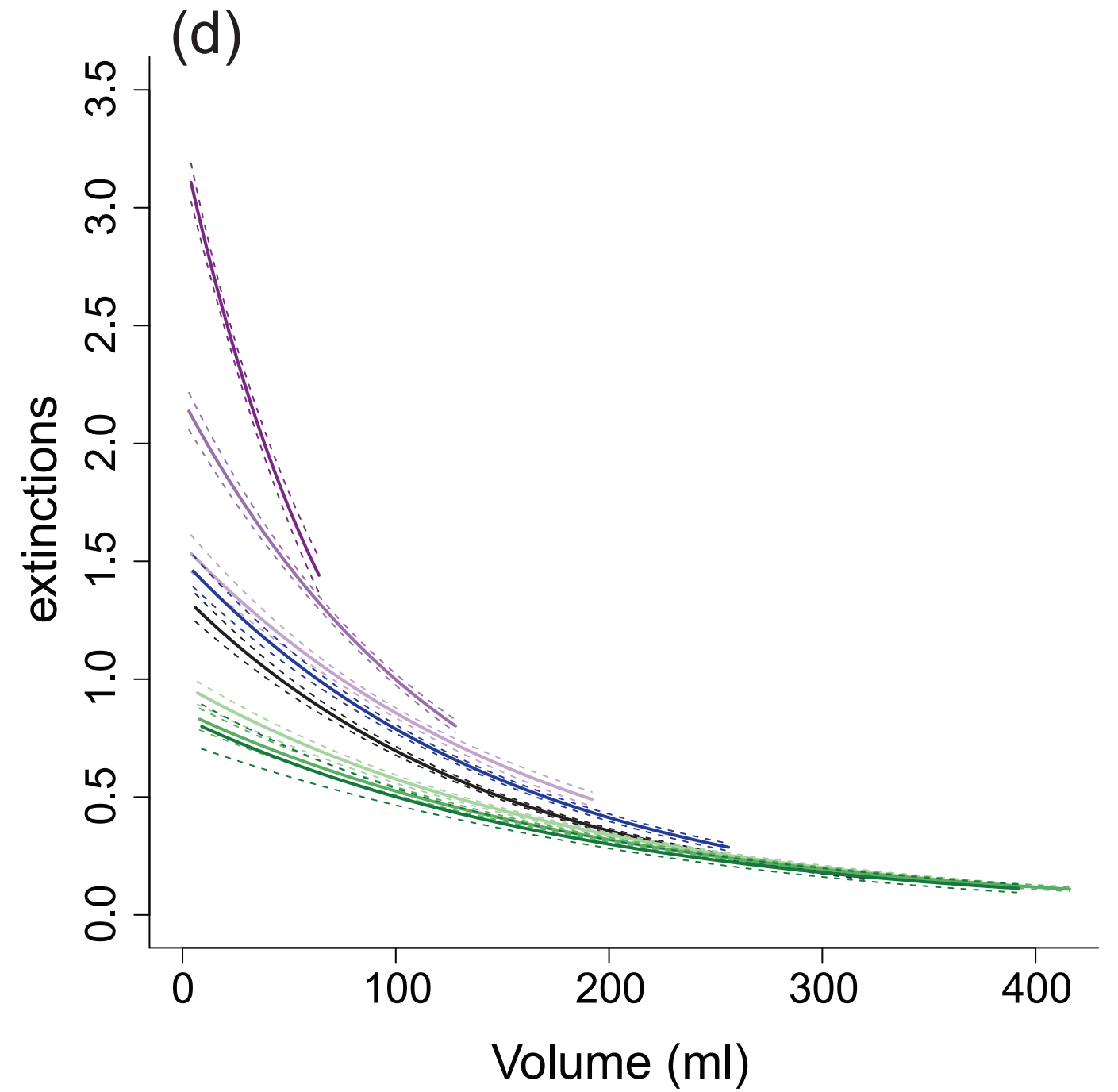
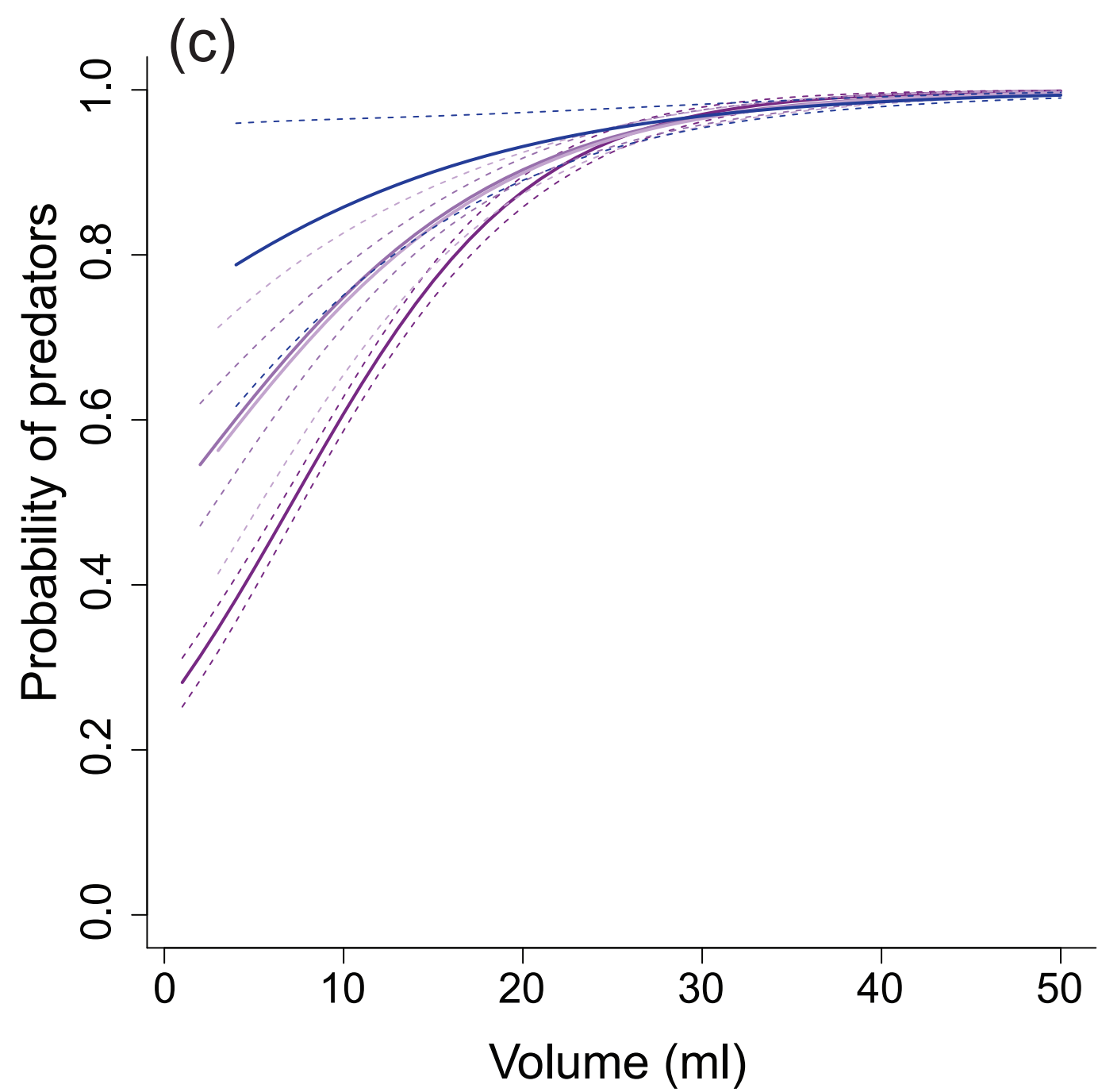
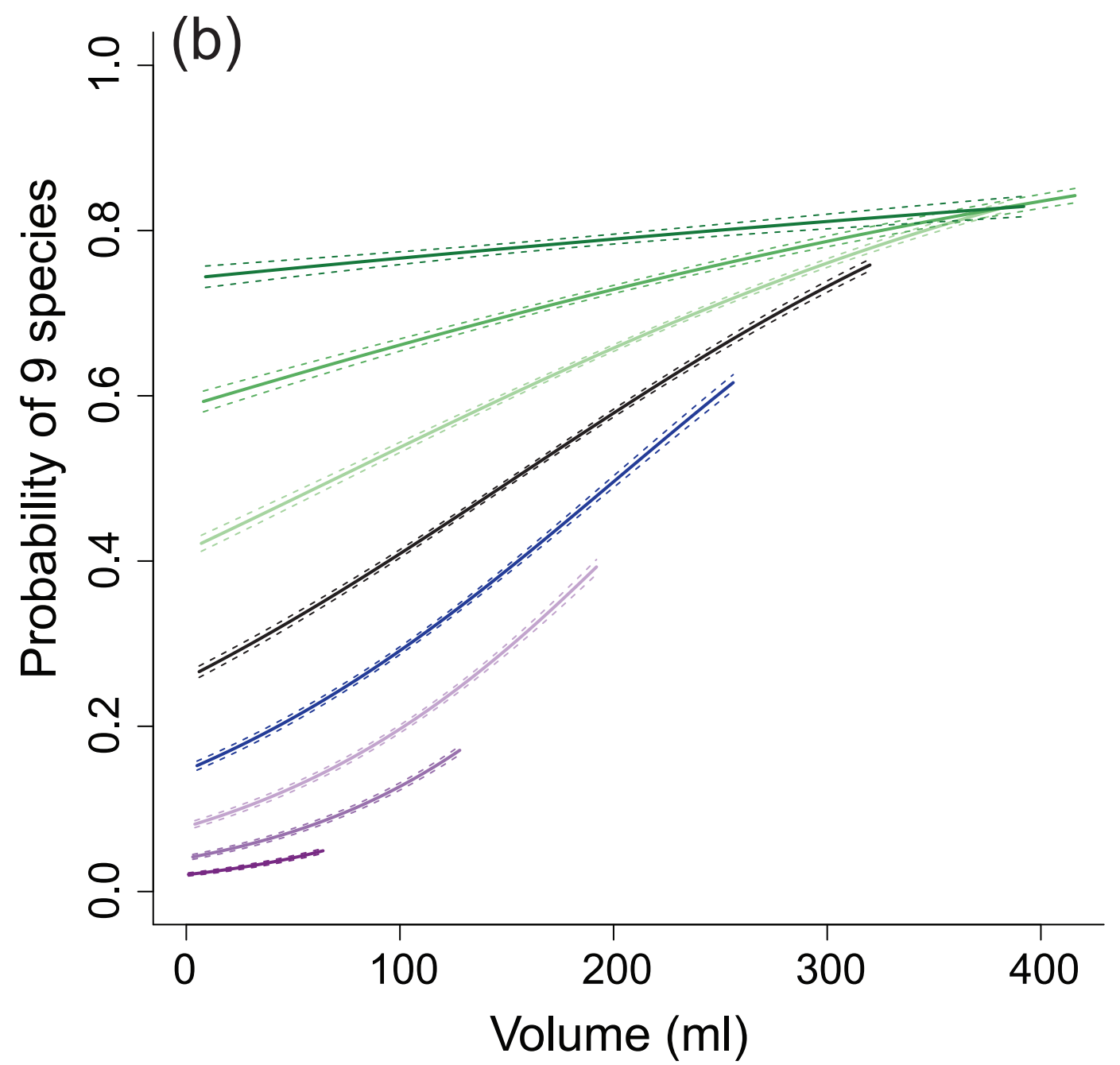
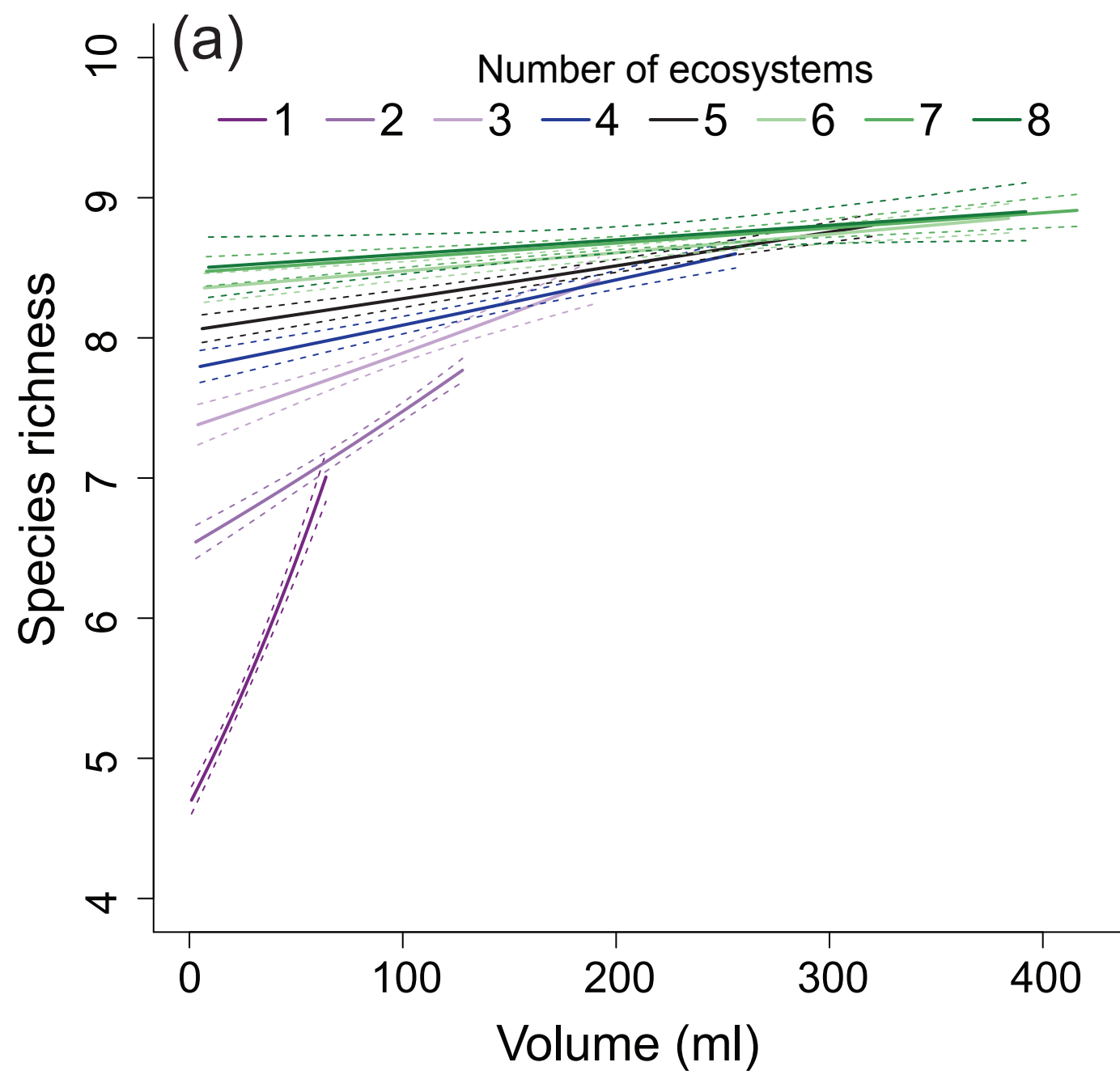


(b)



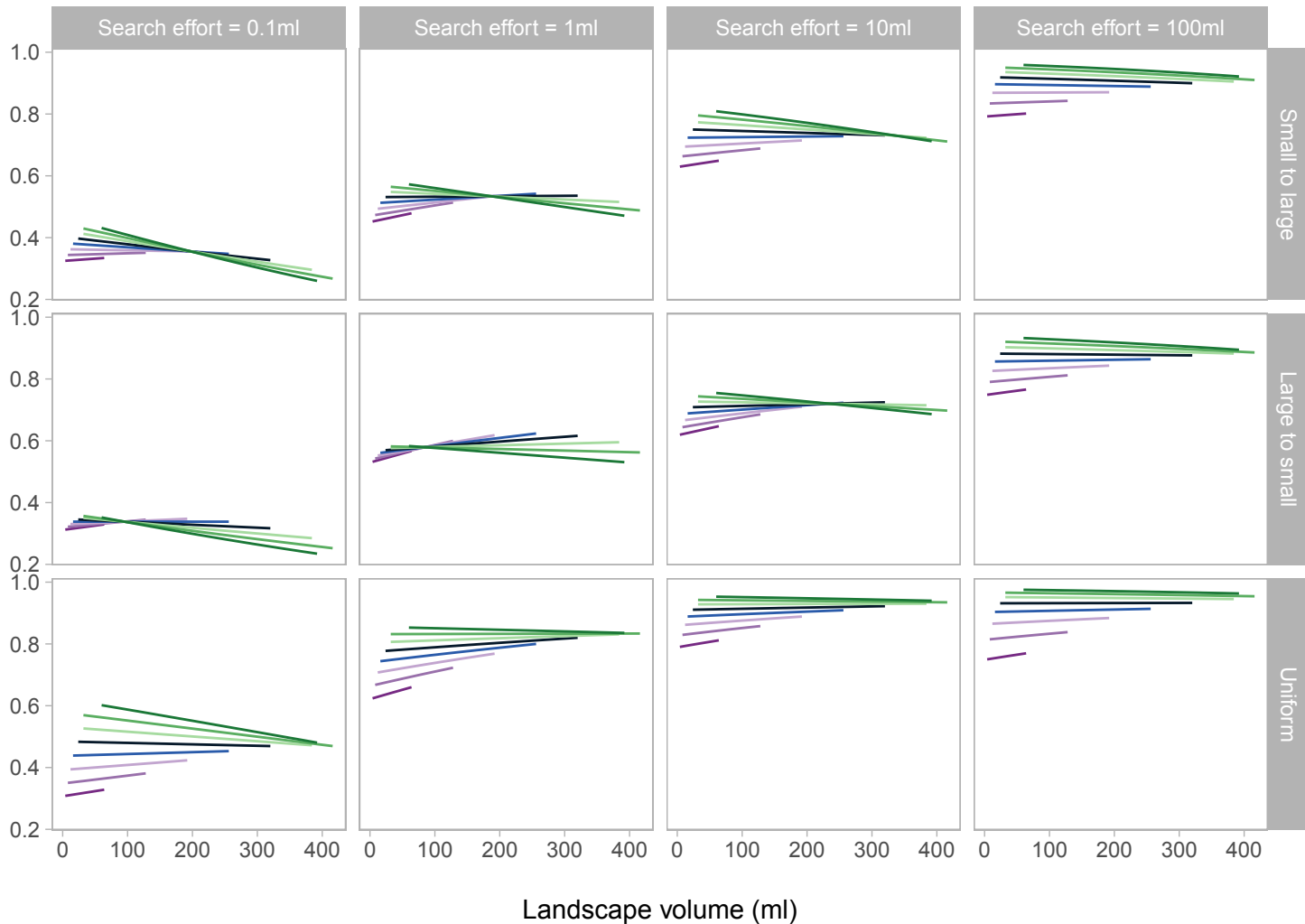
(c)





Number of ecosystems 1 2 3 4 5 6 7 8

Probability of observing all 9 species



Number of ecosystems 1 2 3 4 5 6 7 8

