What would it take to describe the global diversity of parasites?

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How many parasites are there on Earth? Here, we use helminth parasites to highlight how little is known about parasite diversity, and 2 how insufficient our current approach will be to describe the full scope of life on Earth. Using the largest database of host-parasite associations and one of the world's largest parasite collections, we esti-5 mate a global total of roughly 100,000 to 350,000 species of helminth 6 endoparasites of vertebrates, of which 85% to 95% are unknown to 7 science. The parasites of amphibians and reptiles remain the most 8 poorly described, but the majority of undescribed species are likely parasites of birds and bony fish. Missing species are disproportion-10 ately likely to be smaller parasites of smaller hosts in undersampled 11 countries-species that have mostly been understudied over the last 12 century. At current rates, it would take centuries to comprehensively 13 sample, collect, and name vertebrate helminths. While some have 14 suggested that macroecology can work around existing data limita-15 tions, we argue that patterns described from a small, biased sam-16 17 ple of diversity aren't necessarily reliable, especially as host-parasite networks are increasingly altered by global change. In the spirit of 18 moonshots like the Human Genome Project and the Global Virome 19 Project, we propose a global effort to transform parasitology and de-20 scribe as much of global parasite diversity as possible. 21

Helminths | host-parasite networks | biodiversity inventories | museum collections | macroecology

arasitology is currently trapped between apparently insurmountable data limitations and the urgent need to 2 understand how parasites will respond to global change. Para-3 sitism is arguably the most species-rich mode of animal life on 4 Earth (1-3), and parasites likely comprise a majority of the 5 undescribed or undiscovered species left to modern science. 6 (2, 4) In recent years, the global diversity and distribution 7 of parasite richness has become a topic of particular concern (1, 5, 6), both in light of the accelerating rate of disease emer-9 gence in wildlife, livestock, and humans (7), and growing 10 recognition of the ecological significance of many parasites. (8)11 Parasitic taxa are expected to face disproportionately high 12 extinction rates in the coming century, causing a cascade of 13 unknown but possibly massive ecological repercussions. (5, 9)14 Understanding the impacts of global change relies on baseline 15 knowledge about the richness and biogeography of parasite 16 diversity, but some groups are better studied than others. 17 Emerging and potentially-zoonotic viruses dominate this field 18 (10–14); macroparasites receive comparatively less attention. 19

Despite the significance of parasite biodiversity, the actual richness of most macroparasitic groups remains uncertain, due to a combination of underlying statistical challenges and universal data limitations for symbiont taxa. Particularly deserving of reassessment are helminth parasites (hereafter helminths), a polyphyletic group of parasitic worms including, 25 but not limited to, the spiny-headed worms (acanthocepha-26 lans), tapeworms (cestodes), roundworms (nematodes), and 27 flukes (trematodes). Helminth parasites exhibit immense di-28 versity, tremendous ecological and epidemiological significance, 29 and a wide host range across vertebrates, invertebrates, and 30 plants. Estimates of helminth diversity remain controversial 31 (1, 2, 15), especially given uncertainties arising from the small 32 fraction of total diversity described so far (4). Though the task 33 of describing parasite diversity has been called a "testimony to 34 human inquisitiveness" (1), it also has practical consequences 35 for the global task of cataloging life; one recent study proposed 36 there could be 80 million or more species of nematode parasites 37 of arthropods, easily reaffirming the Nematoda as a contender 38 for the most diverse phylum on Earth. (2)39

With the advent of metagenomics and bioinformatics, and 40 the increasing digitization of natural history collections, fun-41 ders are becoming interested in massive "moonshot" endeavors 42 to catalog global diversity. Last year, the Global Virome 43 Project was established with the stated purpose of cataloging 44 85% of viral diversity within vertebrates (particularly mam-45 mals and birds, which host almost all emerging zoonoses), 46 with an investment of \$1.2 billion over 10 years. Whereas the 47 Global Virome Project is ultimately an endeavor to prevent 48 the future emergence of the highest-risk potential zoonoses-49 the natural evolution of decades of pandemic-oriented work at 50 the edge of ecology, virology, and epidemiology-we suggest 51

Significance Statement

Roughly one in ten parasitic worms has been described by taxonomists, while the majority of species remain unknown to science. Data deficiencies are especially severe for some major groups (reptiles and amphibians) and regions (Africa and Southeast Asia). Decades of work have resulted in much larger datasets on host-parasite interactions, but their utility is limited by major data gaps. At current rates, those gaps could take hundreds of years to be filled. We propose that a globally-coordinated project could dramatically speed up this process, playing a critical role in tracking the disease impacts of global change. If successful, it could be a transformative opportunity for multilateral capacity building, and a path towards more equitable research benefit sharing.

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Fig. 1. Rates of helminth descriptions (top, from NHM data) and collections (bottom, from the USNPC). Blue trends indicate cumulative totals, and red lines give a breakpoint regression with a single breakpoint (1912 for the NHM data, 1903 for the USNPC data). Although the current trend appears to be leveling off, it is unlikely this indicates a saturating process (as comparably illustrated by the drop in sampling during the Second World War, 1940-1945).

parasitologists have the opportunity to set a more inclusive 52 goal. Between a quarter and half of named virus species can 53 infect humans, while human helminthiases are a small, almost 54 negligible fraction of total parasite diversity despite their mas-55 sive global health burden. The need to understand global 56 57 parasite diversity reflects a more basic set of questions about the world we live in, and the breadth of life within it. 58

Here we ask, what it would take to completely describe 59 global helminth diversity in vertebrates? The answer is just as 60 dependent on how many helminth species exist as it is on the 61 rate and efficiency of parasite taxonomic description efforts. 62 We set out to address three questions about this task: 63

- 1. What do we know about the global process of describing 64 65 and documenting parasite biodiversity, and how will it 66 change in the future?
- 2. How many helminth species should we expect globally, 67 and how much of that diversity is described? 68
- 3. How many years are we from describing all of global 69 parasite diversity, and what can (and can't) we do with 70 what we have? 71
- From there, we make recommendations about where the next 72 decade of parasite systematics and ecology might take us. 73

The data 74

To answer all three questions, we take advantage of two 75 collections-based datasets that have been made available in 76 the last decade (Figure 1). The biological collections housed at 77 museums, academic research institutions, and various private 78

locations around the world are one of the most significant "big data" sources for biodiversity research (16), especially for par-80 asites. (17, 18) The Natural History Museum in London, UK (NHM) curates the Host-Parasite Database, which includes regional lists of helminth-host associations, including full taxonomic citations for helminth species. (19, 20) By species counts alone, the NHM dataset is perhaps the largest species interaction dataset published so far in ecological literature. (6) In our updated scrape of the web interface, which will be 87 the most detailed version of the dataset ever made public, there are a raw total of 109,060 associations recorded between 25,740 helminth species (including monogeneans) and 19,097 hosts (vertebrate and invertebrate).

The U.S. National Parasite Collection (USNPC) is one of the largest parasite collections in the world, and is one of the most significant resources used by systematists to discover, describe, and document new species (17, 21). The published records constitute the largest open museum collection database for helminths, especially in terms of georeferenced data availability (5). Here, we use a recent copy of the USNPC database that includes 89,580 specimen records, including 13,426 species recorded in the groups Acanthocephala, Nematoda, and Platy-100 helminthes. (Of these we assume the vast majority are verte-101 brate parasites.) In combination, the two datasets represent 102 the growing availability of big data in parasitology, and allow 103 us to characterize parasite diversity much more precisely than 104 we could have a decade ago. 105

I. How does parasite biodiversity data accumulate?

Describing the global diversity of parasites involves two ma-107 jor processes: documenting and describing diversity through 108

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Fig. 2. We found evidence of weak but highly significant declines over time in parasite adult body length (left; smooth term p = 0.0003) and host body size across known host associations (right; smooth term p < 0.0001). This confirms a mild description bias for larger parasites in larger hosts.

species descriptions, geographic distributions, host associations, etc.; and consolidating and digitizing lists of valid taxonomic names and synonyms (e.g. ITIS, Catalogue of Life,
WoRMS). Both efforts are important, time-consuming, and
appear especially difficult for parasites.

Why has helminth diversity been so difficult to catalogue?. 114 The most obvious reason is the hyperdiversity of groups like 115 the Nematoda, but this only tells part of the story. Other hy-116 perdiverse groups, like the sunflower family (Asteraceae), have 117 far more certain richness estimates (and higher description 118 rates) despite being comparably speciose. Several hypotheses 119 are plausible: surveys could be poorly optimized for the geo-120 graphic and phylogenetic distribution of helminth richness, or 121 remaining species might be objectively harder to discover and 122 describe than known ones were. Perhaps the most popular 123 explanation is that taxonomists' and systematists' availability 124 might be the limiting factor (22, 23); the process of describing 125 helminth diversity relies on the dedicated work of systematic 126 biologists, and the availability and maintenance of long-term 127 natural history collections. However, Costello et al. (24) ob-128 served that the number of systematists describing parasites has 129 increased steadily since the 1960s, with apparently diminishing 130 returns. Costello posited this was evidence the effort to de-131 scribe parasites has reached the "inflection point," with more 132 than half of all parasites described; this assessment disagrees 133 noticeably with many others in the literature. (23)134

Have we actually passed the inflection point?. No, probably 135 not. We show this by building species accumulation curves over 136 time, from two different sources: the dates given in taxonomic 137 authority citations in the NHM data, and the date of first 138 accession in the USNPC data, for each species in the dataset 139 (Figure 1). Both are a representation of total taxonomic 140 effort, and vary substantially between years. Some historical 141 142 influences are obvious, such as a drop during World War II (1939-1945). Recently the number of parasites accessioned 143 has dropped slightly, but it seems unlikely (especially given 144 historical parallels) that this reflects a real inflection point in 145 parasite sampling, and is probably instead reflects a limitation 146 of the data structure; the NHM data in particular has not 147 been updated since 2013. Despite interannual variation, the 148 accumulation curves both demonstrate a clear cut pattern: 149 sometime around the turn of the 20th century, they turn 150



Fig. 3. The type species (the first described in a genus) has a statistically significantly higher average host specificity than those that follow. Parasites described earlier typically have a higher degree of generalism, especially prior to the 1840s; specimens collected after roughly the 1870s also apparently tend towards more host-specific species than those from older collections. (Curves are generalized additive models fit assuming a negative binominal distribution, with dashed lines for the 95% confidence bounds.)

upward and increase linearly. Since 1897, an average of 163 the helminth species have been described annually ($R^2 = 0.991$, the p < 0.001), while an average of 120 species are added to collections every year since 1899 ($R^2 = 0.998$, p < 0.001). The lack of slowing down in those linear trends is a strong indicator that we remain a long way from a complete catalog of helminth diversity. 157

Are we looking in the wrong places?. An alternate explana-158 tion for the slow rate of parasite discovery is that the majority 159 of parasite diversity is in countries where sampling effort is 160 lower, and vice versa most sampling effort and research in-161 stitutions are in places with more described parasite fauna 162 (25). Recent evidence suggests species discovery efforts so far 163 have been poorly optimized for the underlying—but mostly 164 hypothetical—richness patterns of different helminth groups. 165 (25, 26) Ecologists have started to ask questions that could 166 help optimize sampling: do parasites follow the conventional 167 latitudinal diversity gradient? Are there unique hotspots of 168 parasite diversity, or does parasite diversity peak in host bio-169 diversity hotspots? (1, 6, 25, 27-29) But our ability to answer 170 these types of questions is predicated on our confidence that 171 observed macroecological patterns in a small (and uncertain) 172 percentage of the world's helminths are representative of the 173 whole. 174

Are species described later qualitatively different?. If 175 helminth descriptions have been significantly biased by 176 species' ecology, this should produce quantitative differences 177 between the species that have and haven't vet been described. 178 We examine two easily intuited sources of bias: body size 179 (larger hosts and parasites are better sampled) and host 180 specificity (generalist parasites should be detected and 181 described sooner). We found a small but highly significant 182 trend of decreasing body size for both hosts and parasites, 183 suggesting the existence of a sampling bias, but not necessarily 184 suggesting unsampled species should be massively different. 185 (Figure 2) For host specificity, we find an obvious pattern 186 relative to description rates, though less so for collections 187 data. (Figure 3) The inflection point around 1840 is likely 188 a byproduct of the history of taxonomy, as the Series of 189 Propositions for Rendering the Nomenclature of Zoology 190 Uniform and Permanent—now the International Code for
Zoological Nomenclature—was first proposed in 1842, leading
to a standardization of host nomenclature and consolidation
of the proliferation of multiple names for single species.

195 The temporal trend also likely reflects the history of taxonomic revisions, as the first species reported in a genus tends 196 to have a higher range of hosts, morphology, and geography, 197 while subsequent revisions parse these out into more appropri-198 ate, narrower descriptions. Using the NHM data, we can easily 199 show that the first species reported in every genus (usually 200 the type species but not always, given incomplete sampling) 201 generally has significantly higher reported numbers of hosts 202 (Wilcoxon rank sum test: W = 22,390,629, p < 0.001; Figure 203 3). This is because type species often become umbrella descrip-204 tors that are subsequently split into more species after further 205 investigation, each with only a subset of the initial total host 206 range. Based on our results, we can expect undescribed species 207 of helminths to be disproportionately host-specific. 208

209 II. How many helminths?

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How do we count parasites?. For many groups of parasites, 210 the number of species known to science is still growing expo-211 nentially, preventing estimation based on the asymptote of 212 sampling curves. (30) In some cases, there are workarounds: 213 for example, the diversity of parasitoid wasps (Hymenoptera: 214 Braconidae) has been estimated based on the distribution of 215 taxonomic revisions rather than descriptions. (31) But for 216 helminths, every major estimate of diversity is based on the 217 scaling between host and parasite richness, a near-universal 218 pattern across spatial scales and taxonomic groups. (6, 32, 33)219 The scaling of hosts and fully host-specific parasites can be as-220 sumed to be linear: for example, every arthropod is estimated 221 to have at least one host-specific nematode. (2) Poulin and 222 223 Morand (30) proposed an intuitive correction for generalists:

$$\hat{P} = \frac{\text{per-species parasite richness}}{\text{host breadth}} \hat{H}$$
[1]

Poulin and Morand (30) compiled independently-sourced 225 estimates of host specificity and per-species richness, and the 226 resulting estimate of \sim 75,000 to 300,000 helminth species was 227 canon for a decade. (1) However, Strona and Fattorini (15) 228 used the NHM data to show that subsampling a host-parasite 229 network approximately generates power law scaling, not linear 230 scaling, which reduced estimates by of helminth diversity (in 231 232 helminth and vertebrate taxon pairs) by an average of 58%. However, they made no overall corrected estimate of helminth 233 diversity in vertebrates. 234

What do we know now that we didn't before?. Examining bi-235 partite host-affiliate networks across several types of symbiosis, 236 including the vertebrate-helminth network (from the NHM 237 data), we previously found approximate power law behavior 238 239 in every scaling curve. (14) The underlying reasons for this pattern are difficult to ascertain, and may or may not be 240 connected to approximate power-law degree distributions in 241 the networks. Regardless, the method seems to work as a tool 242 for estimating richness; using the new R package codependent 243 (34), we used these tools to show that viral diversity in mam-244 mals is probably only about 2-3% of the estimates generated 245 with linear extrapolation by the Global Virome Project. (14) 246 Here, we build on this work by showing how association data 247

can be used to estimate the proportion of overlap among 248 groups, and thereby correct when adding together parasite 249 richness sub-totals. (See Materials and Methods.) 250

How many species are there?. Building on previous stud-251 ies (1, 15), we re-estimated global helminth diversity using 252 codependent, a taxonomically-updated version of the NHM 253 dataset, and a new formula for combining parasite richness 254 across groups. (Table 1) In total, we estimated 103,078 species 255 of helminth parasites of vertebrates, most strongly represented 256 by trematodes (44,262), followed by nematodes (28,844), ces-257 todes (23,749), and acanthocephalans (6,223). Using an up-258 dated estimate of bony fish richness significantly increased 259 these estimates from previous ones, with over 37,000 helminth 260 species in this clade alone. Birds and fish were estimated to 261 harbor the most helminth richness, but reptiles and amphib-262 ians had the highest proportion of undescribed diversity. The 263 best-described groups were nematode parasites of mammals 264 (possibly because so many are zoonotic and livestock diseases) 265 and cestode parasites of the cartilaginous fishes (perhaps due 266 to the expertise of a strong collaborative research commu-267 nity, including the participants in the Planetary Biodiversity 268 Inventory project on cestode systematics). (35) 269

Do we trust these estimates?. Although estimates from a 270 decade ago were surprisingly close given methodological differ-271 ences (1), we now have a much greater degree of confidence in 272 our overall estimate of vertebrate helminth richness. However, 273 some points of remaining bias are immediately obvious. The 274 largest is methodological: by fitting power law curves over 275 host richness, we assumed all hosts had at least one parasite 276 from any given helminth group. While this assumption worked 277 well for mammal viruses, it may be more suspect especially 278 for the less-speciose groups like Acanthocephala. On the other 279 hand, the power law method is prone to overestimation in 280 several ways enumerated in (14). Furthermore, Dallas *et al.* 281 (36) estimated that 20-40% of the host range of parasites is 282 underdocumented in the Global Mammal Parasite Database, 283 a sparser but comparable dataset. If these links were recorded 284 in our data, they would substantially expand the level of 285 host-sharing and cause a reduction of the scaling exponent of 286 power laws, causing lower estimates. On the other hand, if 287 we know that the majority of undescribed parasite diversity 288 is far more host specific than known species, our estimates 289 would severely underestimate in this regard. At present, it is 290 essentially impossible to estimate the sign of the these errors 291 once compounded together. 292

What about cryptic diversity?. One major outstanding prob-293 lem is cryptic diversity, the fraction of undescribed species that 294 are genetically distinct but morphologically indistinguishable, 295 or at least so subtly different that their description poses a 296 challenge. Many of the undescribed species could fall in this 297 category, and splitting them out might decrease the apparent 298 host range of most species, further increasing estimates of 299 total diversity. Dobson *et al.* (1) addressed this problem by 300 assuming that the true diversity of helminths might be double 301 and double again their estimate; while this makes sense con-302 ceptually, it lacks any data-driven support. The diversity of 303 cryptic species is unlikely to be distributed equally among all 304 groups; for example, long-standing evidence suggests it may 305 bioRxiv preprint doi: https://doi.org/10.1101/815902. The copyright holder for this preprint (which was not peer-reviewed) is the author/funder. All rights reserved. No reuse allowed without permission.

	Chondrichthyes	Osteichthyes	Amphibia	Reptilia	Aves	Mammalia	Total
Acanthocephala	169	3,572	765	785	1,184	886	6,223
	(4%)	(13%)	(3%)	(4%)	(14%)	(12%)	(11%)
Cestoda	2,108	5,875	637	2,153	10,257	4,061	23,749
	(28%)	(12%)	(5%)	(5%)	(14%)	(26%)	(16%)
Nematoda	566	10,712	2,148	4,537	3,925	7,902	28,844
	(14%)	(11%)	(10%)	(12%)	(19%)	(30%)	(17%)
Trematoda	391	17,745	3,700	12,153	8,778	4,550	44,262
	(16%)	(19%)	(6%)	(4%)	(17%)	(23%)	(14%)
Total	3,234	37,904	7,250	19,628	24,144	17,399	103,078
	(23%)	(15%)	(7%)	(6%)	(16%)	(26%)	(15%)

Table 1. Helminth diversity, re-estimated: How many helminth species (top), and what percentage of species have been described (bottom)?

³⁰⁶ be disproportionately higher for trematodes than cestodes or³⁰⁷ nematodes. (37)

We can loosely correct our overall richness estimates for 308 cryptic diversity. A recently-compiled meta-analysis suggests 309 an average of 2.6 cryptic species per species of acanthocephalan, 310 2.4 per species of cestode, 1.2 per species of nematode, and 3.1 311 per species of digenean. (38) Using these numbers, we could 312 push our total estimates to at most 22,404 acanthocephalan 313 species, 80,747 cestodes, 63,457 nematodes, and a whopping 314 181,474 species of trematodes, with a total of 348,082 species 315 of helminths. However, there may be publication bias that 316 favors higher cryptic species rates (or at least, zeros may be 317 artificially rare), making these likely overestimates. Increased 318 sampling will push estimates higher for many species, and 319 eventually will allow a more statistically certain estimate of 320 the cryptic species "multiplication factor" needed to update 321 the estimates we present here. 322

III. How far are we from fully describing the diversity ofparasitic worms?

325 How long would it take to catalog global helminth diversity?. 326 We estimated 103,079 total helminth species on Earth, of which 13,426 (13.0%) are in the USNPC and 15,817 (15.3%) 327 are in the NHM Database. At the current rates we estimated. 328 it would take 536 years to describe global helminth diversity 329 and catalog at least some host associations (based on the NHM 330 data as a taxonomic reference), and 745 years to add every 331 species to the collection (based on the USNPC). Including 332 the full range of possible cryptic species would push the total 333 richness to 348,082 helminth species (95% undescribed), which 334 would require 2.040 years to describe and 2.779 years to collect. 335

Even with hypothetical overcorrections, these are daunting 336 337 numbers: for example, if the NHM only captures one tenth of known helminth diversity, and thereby underestimates the rate 338 of description by an order of magnitude, it would still take two 339 centuries to describe remaining diversity. These estimates are 340 also conservative in several ways: the majority of remaining 341 species will be more host-specific and therefore harder to 342 discover, and the process would almost certainly undergo an 343 asymptote or at least a mild saturating process. Moreover, 344 many of the 13,426 unique identifiers in the USNPC are either 345

currently or may be synonyms of valid names and may be corrected through taxonomic revision and redetermination; previous estimates suggest invalid names may outnumber valid ones, in some data. (24)

Where is the undescribed diversity?. Previous work has ar-350 gued that current patterns of helminth description are poorly 351 matched to underlying richness patterns, though those pat-352 terns are also unknown and assumed to broadly correspond 353 to host biodiversity (25). Here, we used the scaling between 354 host and parasite diversity to predict the "maximum possible" 355 number of parasites expected for a country's mammal fauna, 356 and compared that to known helminths described from mam-357 mals in the NHM dataset (Figure 4). While these estimates 358 are liberal in the sense that they include the global range 359 of parasite fauna associated with given hosts, they are also 360 conservative in that they are uncorrected for cryptic diversity, 361 or the possibility of higher host specificity in the tropics. 362

We found that helminths were best known in the handful 363 of countries that dominate parasite systematics work (the 364 United States, Australia, Brazil, Canada, China, and some 365 European countries). But even in these places, most species 366 are probably undescribed; many countries have no records 367 at all, including large countries like the Democratic Republic 368 of the Congo that are mammal diversity hotspots. Between 369 80% and 100% of possible parasite diversity could be locally 370 undescribed for most of the world-high estimates, but plau-371 sible given a global undescribed rate of 85–95%. This spatial 372 pattern likely reflects a combination of language and access 373 barriers (data in Chinese and Russian collections, for example, 374 are known to be substantial, but inaccessible to our present 375 work), and a broader inequity arising from the concentration 376 of institutions and researchers in wealthy countries, and the 377 corresponding disproportionate geographic focus of research. 378 (39) Previous research has noted that African parasitology has 379 been especially dominated by foreign researchers (40), and 380 African parasitologists remain particularly underrepresented 381 in Western research societies. (41)382

How much can we do with what we have?. Or, to put the question another way: With such a small fraction of parasite diversity described, how confident can we be in macroecologi-385



Fig. 4. The distribution of maximum possible helminth richness in mammals (top), the number of known helminth parasites of mammals as recorded by country in the NHM data (middle), and the maximum percentage of undocumented helminth fauna by country (bottom).

cal patterns? A parallel problem was encountered by Quicke 386 (42) as part of a longer-term effort to estimate global para-387 sitoid wasp diversity. (31, 43) Only a year after publishing a 388 paper (44) exploring similar macroecological patterns to those 389 390 we have previously explored (6, 45), Quicke concluded "we know too little" to make conclusions about macroecological 391 patterns like latitudinal trends. (42) For parasitoid wasps, 392 the problem is attributable to a similar set of systemic biases, 393 like underdescription of tropical fauna, or a bias in species 394 description rates towards larger species first. 395

Given that almost 90% of helminth diversity is undescribed 396 (and closer to 100% is undescribed in many places), parasite 397 ecologists need to approach work with "big data" with a 398 similar degree of caution. Working at the level of ecosystems 399 or narrowly-defined taxonomic groups may help sidestep some 400 of these issues.(28) But at the global level, patterns like a 401 latitudinal diversity gradient could be the consequence of real 402 403 underlying trends, or just as easily be the consequence of extreme spatial sampling bias in collections and taxonomic 404 descriptions and revisions. 405

It will take decades or even centuries before datasets improve substantially enough to change our degree of confidence
in existing macroecological hypotheses. Given this problem,
Poulin (23) recommended abandoning the task of estimating
parasite diversity, and assuming parasite richness is determined
"simply [by] local host species richness." However, at global

scales, this is not necessarily supported (46); Dallas *et al.* (6)412 showed that the per-host richness of parasite fauna varied 413 over an order of magnitude across different countries in the 414 NHM data, a spatial pattern with little correlation to mammal 415 biodiversity gradients. Even this result is nearly impossible to 416 disentangle from sampling incompleteness and sampling bias. 417 Moreover, even at mesoscales where "host diversity begets 418 parasite diversity" is usually a reliable pattern, anthropogenic 419 impacts are already starting to decouple these patterns (47). 420 At the present moment, helminth richness patterns are func-421 tionally unknowable at the global scale. The same is likely 422 true of many other groups of metazoan parasites that are far 423 more poorly described. 424

The case for a Global Parasite Project

Given the extensive diversity of helminths, some researchers 426 have argued in favor of abandoning the goal of ever fully 427 measuring or cataloging parasite diversity, focusing instead on 428 more "practical" problems. (23) At current rates of description, 429 this is a reasonable outlook; even with several sources of 430 unquantifiable error built into our estimates, it might seem 431 impossible to make a dent within a generation. However, 432 we dispute the idea that nothing can be done to accelerate 433 parasite discovery. Funding and support for most scientific 434 endeavors are at an unprecedented high in the 21^{st} Century. 435 Other scientific moonshots, from the Human Genome Project 436 to the Event Horizon Telescope image of the M87 black hole, 437 would have seemed impossible within living memory. 438

For parasitology, the nature and urgency of the problem call 439 for a similarly unprecedented effort. For some purposes, the 440 5–15% of diversity described may be adequate to form and test 441 ecoevolutionary hypotheses. But the reliability and accuracy 442 of these data will become more uncertain in the face of global 443 change, which will re-assemble host-parasite interactions on a 444 scale that is nearly impossible to predict today. As climate 445 change progresses, an increasing amount of our time and 446 energy will be spent attempting to differentiate ecological 447 signals from noise and anthropogenic signals. Though some 448 consider the task of cataloging parasite diversity a "testimony 449 to human inquisitiveness" (1), it is also a critical baseline for 450 understanding biological interactions in a world on the brink of 451 ecological collapse. Along the same lines of the Global Virome 452 Project, we suggest that parasitology is ready for a "Global 453 Parasite Project": an internationally-coordinated effort to 454 revolutionize the process of cataloging parasite diversity. 455

Although many parasitic clades would be worth including 456 in a Global Parasite Project, helminths provide an invaluable 457 model for several key points. First, modern methods make it 458 possible to set realistic and tangible targets, and budget ac-459 cordingly. Recently, the global parasite conservation plan (48) 460 proposed an ambitious goal of describing 50% of parasite diver-461 sity in the next decade. From the bipartite rarefaction method 462 (14, 15), we can back-estimate how many hosts we expect to 463 randomly sample before we reach that target. For example, 464 describing 50% of terrestrial nematode parasites would require 465 sampling 3,215 new reptile host species, 2,560 birds, 2,325 466 amphibians, and only 995 mammals. These estimates assume 467 diversity accumulates randomly, and hosts are sampled in an 468 uninformed way. In practice, with knowledge about existing 469 ecological and geographic biases, we can target sampling to 470 accelerate species discovery, just as previous programs like the 471

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⁴⁷² Planetary Biodiversity Inventory tapeworm project have, to ⁴⁷³ great success. (35)

Second, any moonshot effort to describe parasite diversity 474 would have to start with museums and collections. System-475 atics is the backbone of biodiversity science (49, 50), and 476 especially in parasitology, collections are the backbone of sys-477 tematics. (22, 51) They are also some of the most vulnerable 478 research institutions in modern science: collections are chroni-479 cally underfunded and understaffed, sometimes to the point of 480 dissolving. Even well-funded collections are still mostly undig-481 itized, ungeoreferenced, and unsequenced (17), and massive 482 volumes of "grey data" are unaccounted for in collections that 483 are isolated from the global research community, or fall on op-484 posite sides of deep historical divides (e.g., between Soviet and 485 American science). In all likelihood, hundreds or thousands of 486 parasite species have already been identified and are waiting 487 to be described from museum backlogs, or their descriptions 488 have been recorded in sources inaccessible due to digital ac-489 cess, language barriers, and paywalls. Technological advances 490 in the coming decade—like faster bioinformatic pipelines for 491 digitization, DNA extraction from formalin-fixed samples, or 492 cryostorage of genomic-grade samples—will expand the pos-493 sibilities of collections-based work, but are insufficient to fix 494 many of the structural problems in the field. 495

Whereas the proposed Global Virome Project has focused 496 mostly on capacity building for field sampling and labwork, a 497 Global Parasite Project could probably achieve comparable 498 rates of parasite description (on a lower budget) by focusing 499 on collections science. If the existing research and funding 500 model continues into the next decade, most "available" para-501 site data will be collected by Western scientists running field 502 trips or long-term ecological monitoring programs that mostly 503 feed into collections at their home institutions. Building out 504 American and European parasite collections with globally-505 sourced specimens would only perpetuate existing data gaps 506 and research inefficiencies, and the structural inequities and in-507 justices they reflect. Increasingly, biomedical research is under 508 legitimate scrutiny for parachute research—Western-driven 509 research "partnerships" that leverage international project 510 design for exploitative and extractive sampling, with little 511 benefit to partners in the Global South (52-54). Though our 512 hypothetical Global Parasite Project would be focused pri-513 marily on ecology, rather than biomedical or global health 514 priorities, systematics and conservation are no exception to 515 these conversations. 516

A Global Parasite Project, and its governance principles, 517 would need to focus on supporting collections work and 518 strengthening infrastructure around the world, with explicit 519 priority on equity and local leadership. Recent developments 520 in international law are particularly relevant to this end. The 521 Nagoya Protocol on Access to Genetic Resources and the 522 523 Fair and Equitable Sharing of Benefits Arising from their Uti-524 lization to the Convention on Biological Diversity (Nagoya Protocol) establishes a regime to ensure that access to ge-525 netic resources—which some countries may define to include 526 parasites—is coupled with the equitable sharing of benefits 527 from their use. While implementation of the Nagova Pro-528 tocol varies between countries, it codifies important norms 529 addressing injustices in obtaining parasites for collections, and 530 inequities in the benefits arising directly or indirectly from 531 their use, which may include capacity building, technology 532

transfer, and recognition in scientific publications.

Done right, a Global Parasite Project would build resilient 534 local capacities for local priorities, through financial and tech-535 nical support that empowers local researchers in resource-536 constrained settings. The support provided could include a 537 combination of training, funding, conferences and meetings, 538 and technology transfer. These can be identified on a case-539 by-case basis to meet local priorities, which could include 540 formalizing parasite collections, in cases where the component 541 collections are distributed across departments; improving or 542 modernizing specimen preservation methods or physical infras-543 tructure; and digitizing and sequencing collections. (35, 55)544 Following these steps could fill major data gaps, and make col-545 lections around the world more resistant to damage, disasters, 546 and gaps in research support. In turn, there is a wealth of local 547 technical knowledge and expertise in countries where parasite 548 collections are underserved. This is an opportunity for locally-549 led, multilateral capacity-building, and, where appropriate, 550 dissemination of local knowledge to the broader scientific com-551 munity with clear principles for locally-led publications and 552 clear attribution. This work should expand avenues for para-553 sitologists in the Global South to be recognized and engaged 554 as active participants in the global research community. 555

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Third, a Global Parasite Project would need to focus not 556 just on completeness in parasite descriptions, but in host-557 parasite interaction data. The sparseness of existing network 558 datasets can make estimates of affiliate diversity an order of 559 magnitude more uncertain (14), and describing new parasites 560 as fast as possible might make this problem more pronounced. 561 An active effort needs to be made to fill in the 20-40% of 562 missing links in association matrices, potentially using model-563 predicted links to optimize sampling (36). Better characteriz-564 ing the full host-parasite network would have major benefits 565 for actionable science, ranging from the triage process for 566 parasite conservation assessments (48), to work exploring the 567 apparently-emerging sylvatic niche of Guinea worm and its 568 implications for disease eradication (56). 569

This is where ecologists fit best into a parasite moonshot. 570 Rather than establishing an entirely novel global infrastruc-571 ture for field research, we can fund a major expansion of 572 parasitology in existing biodiversity inventories. The vast 573 majority of animals already collected by field biologists have 574 easily-documented symbionts, which are nevertheless neglected 575 or discarded during sampling. In response, recent work has 576 suggested widespread adoption of integrative protocols for 577 how to collect and document the entire symbiont fauna of 578 animal specimens. (57, 58) Building these protocols into more 579 biodiversity inventories will help capture several groups of 580 arthropod, helminth, protozoan, and fungal parasites, with-581 out unique or redundant sampling programs for each. In 582 cases where destructive sampling is challenging (rare or elu-583 sive species) or prohibitive (endangered or protected species), 584 nanopore sequencing and metagenomics may increasingly be 585 used to fill sampling gaps. Collecting data these ways will 586 improve detection of parasites' full host range, and allow re-587 searchers to explore emerging questions about how parasite 588 metacommunities form and interact. (59) As novel biotic inter-589 actions form and are detected in real-time, this could become 590 a major building block of global change research. (48)591

Despite decades of work calling out the shortage of parasitologists and the "death" of systematics (22, 60), the vast diversity

of undescribed parasites has never stopped the thousands of 594 taxonomists and systematists who compiled our datasets over 595 the last century—mostly without access to modern luxuries 596 like digital collections or nanopore sequencing. A testimony 597 598 to persistence and resourcefulness, these data provide the 599 roadmap for a new transformative effort to describe life on Earth. In an era of massive scientific endeavours, a coordi-600 nated effort to describe the world's parasite diversity seems 601 more possible than ever. There may never be a Global Parasite 602 Project *per se*, but the current moment may be the closest 603 we've ever been to the "right time" to try for one. If biologists 604 want to understand how the entire biosphere is responding to a 605 period of unprecedented change, there is simply no alternative. 606

607 Materials and Methods

608

Data Assembly and Cleaning. The data we use in this study comes 609 from two sources: the U.S. National Parasite Collection, and the Lon-610 don Natural History Museum's host-parasite database. We describe 611 the cleaning process for both of these sources in turn. All data, and 612 all code, are available on Github at github.com/cjcarlson/helminths. 613 The U.S. National Parasite Collection has been housed at the 614 Smithsonian National Museum of Natural History since 2013, and is 615 one of the largest parasite collections in the world. The collection is 616 largely digitized and has previously been used for global ecological 617 studies. (5) We downloaded the collections database from EMu in 618 619 September 2017. The collection includes several major parasitic groups, not just helminths, and so we filtered data down to Acan-620 thocephala, Nematoda, and Platyhelminthes. Metadata associated 621 with the collection has variable quality, and host information is 622 mostly unstandardized, so we minimize its use here. 623

624 The London Natural History Museum's host-parasite database is an association list for helminths and their host associations, 625 dating back to the Host-Parasite Catalogue compiled by H.A. Baylis 626 starting in 1922. The database itself is around 250,000 unique, 627 mostly location-specific association records digitzed from a reported 628 28,000 scientific studies. The NHM dataset has been used for 629 ecological analysis in previous publications (6, 61, 62), but here 630 we used an updated scrape of the online interface to the database. 631 Whereas previous work has scraped association data by locality, 632 we scraped by parasite species list from previous scrapes, allowing 633 records without locality data to be included, and therefore including 634 a more complete sample of hosts. The total raw dataset comprised 635 100,370 host-parasite associations (no duplication by locality or 636 other metadata), including 17,725 hosts and 21,115 parasites. 637

We cleaned the NHM data with a handful of validation steps. 638 First, we removed all host and parasite species with no epithet 639 (recorded as "sp."), and removed all pre-revision name parentheticals. 640 We then ran host taxonomy through ITIS with the help of the 641 taxize package in R, and updated names where possible. This also 642 allowed us to manually re-classify host names by taxonomic grouping. 643 Parasite names were not validated because most parasitic groups are 644 severely under-represented (or outdated) in taxonomic repositories 645 like WORMS and ITIS. At present, no universal, reliable dataset 646 exists for validating parasite taxonomy. After cleaning, there were a 647 total of 13,162 host species and 20,016 parasite species with a total 648 of 73,273 unique interactions; this is compared to, in older scrapes, 649 what would have been a processed total of 61,397 interactions among 650 651 18,583 parasites and 11,749 hosts. We finally validated all terrestrial localities by updating to ISO3 standard, including island territories 652 of countries like the United Kingdom; many localities stored in 653 the NHM data predate the fall of the USSR or are have similar 654 anachronisms. 655

656 Trends over Time.

Description rates. In the NHM data, we assigned dates of description
 by extracting year from the full taxonomic record of any given species
 (e.g., Ascaris lumbricoides Linnaeus, 1758) using regular expressions;
 in the USNPC data, we extracted year from the accession date

recorded for a given specimen. We added together the total number of species described (NHM) and collected (USNPC) and fit a breakpoint regression using the segmented package for R. (63) 663

Body size. We examined trends in body size of hosts and parasites 664 over time using the date of description given in the NHM dataset. 665 For parasite body size, we used a recently-published database of 666 trait information for acanthocephalans, cestodes, and nematodes 667 (64), and recorded the adult stage body length for all species present 668 in the NHM dataset. For host body size, we subsetted associations 669 to mammals with body mass information in PanTHERIA (65). We 670 examined trends in worm length and host mass over time using 671 generalized additive models (GAMs) with a smoothed fixed effect 672 for year, using the mgcv package in R. (66) 673

 ${\it Host \ specificity}.$ To test for a description bias in host specificity, we 674 identified the year of description from every species in the NHM 675 data, and coded for each species whether or not they were the first 676 species recorded in the genus. We compared host range for first 677 and non-first taxa and tested for a difference with a Wilcoxon test 678 (chosen given the non-normal distribution of host specificity). To 679 test for temporal trends in host specificity, we fit two GAM models 680 with host specificity regressed against a single smoothed fixed effect 681 for time. In the first, we used the year of species description in the 682 NHM data; in the second, we recorded the year of first accession in 683 the USNPC. 684

Estimating Species Richness. Strona and Fattorini (15) discovered 685 that subsampling the host-helminth network produces an approx-686 imately power-law scaling pattern, leading to massively reduced 687 richness estimates compared to Dobson et al. (1). This pattern 688 was recently found by Carlson et al. (14) to be general across large 689 bipartite networks, who developed the R package codependent (34) 690 as a tool for fitting these curves and extrapolating symbiont richness. 691 We used the cleaned host-helminth network and codependent to fit 692 curves for each of twenty groups, and extrapolate to independent 693 richness estimates for all host groups. We sourced the estimate of 694 every terrestrial group's diversity from the 2014 IUCN Red List 695 estimates. Fish were split into bony and cartilaginous fish in the 696 same style as Dobson *et al.* (1), but because they have much poorer 697 consolidated species lists, we used estimates of known richness from 698 a fish biology textbook. (67) 699

The software also allows generation of 95% confidence intervals generated procedurally from the fitting of the networks, and while we have used these in previous work (14), here we elected not to. In our assessment, the epistemic uncertainty around cryptic species, the percent of documented links, and even basic choices like the number of bony fish far outweigh the uncertainty of the model fit for the power law curves.

One major methodological difference between Carlson et al. (14) 707 and our study is that in their study, they back-corrected estimates 708 by the proportion of viruses described for the hosts in their net-709 work (via validation on independent metagenomic datasets). We 710 have no confident way to evaluate how comprehensive the NHM 711 dataset is, as it is certainly the largest dataset available describing 712 host-helminth interactions, and widely believed to be one of the 713 most thorough. (6) Consequently, our estimates account for the 714 proportion of undescribed diversity due only to unsampled hosts, 715 and underestimates by assuming all recorded hosts have no unde-716 scribed parasites. This error is likely overcorrected by the back of 717 the envelope correction we perform for cryptic richness. 718

Estimating Total Richness Across Host Groups. The overall number of parasites for all orders considered is smaller than the sum of estimates for each order, as some parasites would be expected to infect vertebrates from more than one order. Here we present a new mathematical approach to correcting richness estimates for affiliates across multiple groups, based on the inclusion-exclusion principle. 724

Inclusion-Exclusion Principle. The inclusion-exclusion principle from set theory allows us to count the number of elements in the union of two or more sets, ensuring that each element is counted only once. For two sets, it is expressed as follows:

$$|A \cup B| = |A| + |B| - |A \cap B|$$

Where $|A \cup B|$ is the number of elements in the union of the set, |A| and |B| are the number of elements in A and B, respectively, and $|A \cap B|$ is number of elements in both A and B. For three sets, it is expressed as follows:

$$|A\cup B\cup C|=|A|+|B|+|C|-|A\cap B|-|A\cap C|-|B\cap C|+|A\cap B\cap C|$$

For a greater number of sets, the pattern continues, with elements
overlapping an even number of sets subtracted, and elements overlapping an odd number of sets added.

⁷³² Inclusion-Exclusion and Parasite Estimates. The overall estimated ⁷³³ number of parasites of two groups, \hat{N} , is given as the expected size ⁷³⁴ of $|N_1^{est} \cup N_2^{est}|$. Adapting the inclusion-exclusion principle, we can ⁷³⁵ assume that the overlap between groups N_1 and N_2 in collections ⁷³⁶ is similar to the overlap of not yet discovered parasites:

$$\begin{split} \hat{N} &= E\bigg(|N_1^{est} \cup N_2^{est}|\bigg) \\ &= N_1^{est} + N_2^{est} - \bigg(\frac{\frac{|N_1 \cap N_2|}{|N_1|} * N_1^{est} + \frac{|N_1 \cap N_2|}{|N_2|} * N_2^{est}}{2}\bigg) \end{split}$$

We average the estimated number in both groups over N_1^{est} and 737 N_2^{est} , rather than just scaling by $|N_1 \cap N_2|/(N_1 + N_2)$, because we 738 cannot be sure that N_1^{est} and N_2^{est} scale with N_1 and N_2 roughly 739 proportionally. (For example, we estimated that the description 740 rate of mammal trematodes is almost an order of magnitude higher 741 than in reptiles.) Instead of estimating the average overlap for a 742 given total number, we estimate the number of multi-order parasites 743 for a given order's count, and average that across the groups. 744

For h orders, this can be generalized as follows:

$$\begin{split} \widehat{N} &= E\bigg(\bigg|\bigcup_{i=1}^{n} N_{i}^{est}\bigg|\bigg) \\ &= \sum_{i=1}^{h} N_{i}^{est} - \sum_{1 \leq i < j \leq h} |N_{i} \cap N_{j}| \bigg(\frac{\frac{N_{i}^{est}}{|N_{i}|} + \frac{N_{j}^{est}}{|N_{j}|}}{2}\bigg) \\ &+ \sum_{1 \leq i < j < k \leq h} |N_{i} \cap N_{j} \cap N_{k}| \bigg(\frac{\frac{N_{i}^{est}}{|N_{i}|} + \frac{N_{j}^{est}}{|N_{j}|} + \frac{N_{k}^{est}}{|N_{k}|}}{3}\bigg) \\ &- \dots + (-1)^{h-1} |N_{1} \cap \dots \cap N_{h}| \bigg(\frac{\frac{N_{1}^{est}}{|N_{1}|} + \dots + \frac{N_{h}^{est}}{|N_{h}|}}{h}\bigg) \end{split}$$

We provide a new implementation of this approach with the multigroup function in an update to the R package codependent.
This function uses a dataset of recorded associations and given extrapolated richness values, and estimates a corrected total parasite richness across host groups.

Mapping Potential Richness. To map species richness, we used the 751 IUCN range maps for mammals, and counted the number of mam-752 753 mals overlapping each country. Using mammal richness for each country, we predicted the expected number of parasitic associations 754 those species should have globally, running models separately by 755 parasite group (acanthocephalans, cestodes, nematodes, and trema-756 todes), and totalled these. We call these "possible" associations and 757 758 not expected richness, for two reasons: (1) Most macroparasites, especially helminths, are not found everywhere their hosts are found. 759 (2) Host specificity may vary globally (68), but as we stress in the 760 main text, it is difficult to disentangle our knowledge of macroeco-761 logical patterns from the massive undersampling of parasites in most 762 countries. We compared patterns of possible richness against known 763 helminth associations recorded in a given country, the grounds on 764 which parasite richness has previously been mapped. (6) Finally, 765 766 we mapped the percentage of total possible unrecorded interactions (an upper bound for high values, except when 100% is reported, 767 indicating that no parasites have been recorded in the NHM data 768 from a country). 769

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