1	
2 3	Title: Diversity is the question, not the answer
4 5	Author: Ashley Shade
6 7 8 9	Affiliation: Department of Microbiology and Molecular Genetics, Program in Ecology, Evolution, and Behavior, and DOE Great Lakes Bioenergy Research Center, Michigan State University, East Lansing MI
10 11	Correspondence: shadeash@msu.edu
12 13	Keywords: microbiome, microbial ecology, ecological theory, community dynamics
14 15	Main Text
16 17	"The rock just sits and is." - Albert Markovski
18 19 20 21 22 23 24 25 26	Diversity (the number and/or evenness, and types of taxa within a local community) is arguably one of the most fundamental concepts in community ecology. Ecologists report diversity estimates for a number of reasons, including to ask how patterns in diversity translate to ecosystem function or stability, or to understand how and why diversity changes over space and time. This research is pursued in an effort to build an understanding of the ecological processes of the world and to identify common patterns, with the ultimate goal of improving knowledge of universal mechanisms and building theoretical framework. Once ecological mechanisms are understood, ecologists strive to better predict, conserve, or manage communities to desired outcomes.
27 28	Microbial ecologists have a particular interest in diversity, as microbial diversity is expansive, and many microbial communities have near-innumerable membership (Locey and Lennon, 2016).
29	Relative to our planet's better-described communities of macrofauna, microbial communities are

a trove of untapped and unknown diversity. High-throughput sequencing methods have offered
 new insight into the extent and limits of microbial diversity, and have spurred research interests,
 including understanding the rare microbial biosphere (Lynch and Neufeld, 2015) and microbial
 dark matter (Marcy *et al.*, 2007). High-throughput sequencing combined with cultivation independent methods continue to reveal a fuller tree of life, expanding our knowledge of evolution
 and of phylogenetic relationships in biology, which are dominated by microbial lineages (Hug *et al.*, 2016).

37

38 With all of the discovery and excitement in microbial ecology about diversity, there often has been 39 an assumption that high diversity is implicitly a good or desirable outcome for communities, and 40 that higher diversity is also somehow more meritorious ecologically. Alas, diversity is not good or 41 bad, it simply "is", much like Albert Markovski's rock. Diversity is a property that we observe about 42 microbial communities and measure using statistical indices, and these measurements allows us 43 to develop hypotheses to test the ecological mechanisms driving those communities' dynamics. 44 Diversity is the outcome of ecological processes, and not an ecological process in itself. Thus, a 45 diversity measurement has limited value alone because much context is needed for interpretation. 46 I argue that diversity provides a proxy for comparing communities, and an appropriate starting 47 point for determining underlying ecological causes and consequences in community ecology. 48 Similarly, I suggest that as a field we resist the over-simplification of implicating diversity as a 49 reason for community outcomes or implying that a high diversity microbial community is somehow 50 'better' than a low diversity community.

51

Here, I explore the complications and assumptions about microbial diversity and offer suggestions
to redirect some of our common misconceptions towards understanding the ecological
mechanisms driving patterns in diversity. I focus on within-sample (alpha) diversity of a locality
(Table 1; see Magurran, 2003 for an excellent primer).

56

57 Diversity has many definitions. Which are you using, and why does it matter?

58

59 There is a long history of challenge with both defining and measuring ecological diversity (e.g., 60 Ricotta, 2005). An inherent challenge is that there is no universally accepted, absolute value of 61 diversity for a given community. Contrast this to other quantitative measurements considered to 62 have absolutes that are comparable across different methods or scales of measuring. For 63 example, whether temperature is measured in Kelvin, Celsius, or Fahrenheit, there is a belief that 64 there is one "true" equivalent value upon which all will scales will agree. Diversity, however, is 65 relative and always constrained by method of measurement. There is not a belief that an absolute 66 diversity value can be determined and compared across methods: each method is a slightly 67 different reduction of multivariate information about a community. If determining an absolute value of diversity were achievable (and it likely is not), it would unite the field of community ecology by 68 69 ending debate about the merits of different diversity measurements, and instead redirecting focus 70 towards underlying mechanisms.

71

72 Thus, "diversity" can refer to be any number of metrics considering any one or number of aspects 73 of a community. Because no absolute value of diversity exists, each method has its own biases 74 and advantages, as discussed previously (e.g., Hill et al., 2003). A lack of specificity about which 75 method is used can lead, at best, to confusion or, at worst, oversimplification or misinterpretation 76 of community outcomes. Thus, the precise method(s) for calculating diversity should be carefully 77 considered and justified either ecologically or biologically according to the scientific question, and 78 then interpreted considering the chosen diversity metric's strengths and limitations. For example, 79 if there is a working hypothesis of differences in phylogenetic breadth between communities in a 80 control and treatment, a diversity metric that incorporates information about the relatedness of 81 taxa may be selected.

82

83 Diversity metrics are, by design, flexible, and thus can be calculated from any type of community 84 dataset. Because it is difficult to observe individual microbial cells and distinguish among microbial 85 taxa, microbial ecologists use many inexact methods for observing communities, including cell 86 morphology or probe binding with microscope counts, fingerprinting, colony phenotypes, and 87 sequencing. Each of these methods produces a differently biased perspective of the community. 88 Thus, due to methodological differences, diversity often is not comparable directly across studies 89 even if the same metric is calculated. This results in vagueness and does not promote a deeper 90 understanding of microbial community ecology. It also means that diversity cannot be "important" 91 in itself because much context is needed for interpretation.

- 92
- 93 The temptation of diversity: it is easy to calculate, but let's not forget limitations
- 94

95 For a high-throughput sequencing dataset, diversity is straightforward to determine, perhaps in 96 part because popular sequence analysis pipelines automatically output these calculations. The 97 ease of diversity calculation may tempt us to indiscriminately report them or to assume that they 98 are informative for our study. However, for sequencing methods, there are a range of analysis 99 choices regarding the operational taxonomic unit (OTU) definition (Rideout et al., 2014; Schloss, 100 2016; Preheim et al., 2013; Eren et al., 2013). The taxonomic unit is whatever is appropriate to 101 the scientific question (or, as it often happens, default in the sequence analysis pipeline), as 102 chosen by the researcher. This is an important consideration because OTU definitions will impact 103 our perspective of diversity, and some OTU-defining methods consistently over- or under-inflate 104 the number of taxa observed (e.g. Edgar, 2013), which directly impacts diversity calculations.

105

106 There are also inherent diversity biases resulting from cultivation-independent methods. Diversity 107 metrics may be inflated by the DNA of inactive or dormant organisms (Jones and Lennon, 2010). 108 DNA extraction protocols can bias against lyses of certain groups, skewing their representation 109 in the community (e.g., Gram positive bacteria). Co-extraction of relic or taphonomic DNA can 110 overestimate standing diversity (Carini et al., 2016). There is also primer bias in amplicon 111 sequencing, which can underestimate diversity by omitting or under-representing certain 112 microbial lineages (Klindworth et al., 2013). For some marker genes, like the 16S rRNA gene, 113 bacterial and archaeal taxa may have very different copy numbers (Stoddard et al., 2015), which 114 complicates our perception of their relative contributions to the community. For taxon-rich 115 microbial communities, like soils, and especially for highly uneven, rich communities that are 116 dominated by a few very abundant taxa (Adams et al., 2013), under-sampling of the community 117 is an additional consideration (e.g., Gihring et al., 2012). Increasing the amount of sequences 118 generated for under-sampled communities resulted in continued increase in diversity estimates, 119 with particular sensitivity in the performance of non-parametric estimators that extrapolate 120 absolute community diversity based on the number of singletons and doubletons (Gihring et al., 121 2012).

122

Of course, no method is without bias. However, due to our inexact methods for observing communities, microbial diversity calculations in particular have so many biases that they may be considered as rough approximations. Efforts should be made to standardize biases across samples prior to making diversity comparisons, and, even then, to interpret results with care.

127

128 High diversity isn't necessarily "better" or "healthy."

129

130 If higher diversity were universally better for communities, why devote resources to understanding
131 ecological mechanisms? If it were true that higher diversity is always an improvement, we could
132 manage microbial communities by simply making them more diverse.

133

134 There are countless examples of ecosystems in which higher diversity is not more meritorious. 135 As a simple example, a rainforest harbors more plant species per hectare than a temperate forest, 136 but it is not interpreted that the temperate forest is a less important or less-thriving ecosystem. 137 These two ecosystem are different, and for many abiotic or biotic reasons that could be uncovered 138 and investigated further. Similarly, vaginal microbial communities exhibit a range of diversities 139 across healthy women, including some communities that are dominated by lactobacilli and others 140 (reported as 20-30% of asymptomatic individuals) that have less lactobacilli but more diverse 141 membership (Ma et al., 2012). As another example, high-fat and low-fat diets had comparable 142 levels of Shannon diversity, Chao diversity and richness (though, different taxonomic 143 compositions) in humanized mouse models (Turnbaugh et al., 2009). These studies and others 144 demonstrate that lower diversity is not necessarily indicative of a worse community or ecosystem 145 and lower diversity does not necessarily imply less stable or less 'healthy' communities.

146

There is a recent example in which we do overwhelm microbial communities with more and different diversity in an effort to manage them: fecal transplants after an opportunistic infection by *Clostridium difficile* (Kassam *et al.*, 2013). Not all fecal transplants are successful, despite the apparent deluge of additional diversity to the community. It would be a misinterpretation to suggest that the diversity in itself is the answer to the frequent success of fecal transplants in mitigating *C. difficile infection*.

153

Notably, microbial ecologists have borrowed value-laden terms from traditional ecology to describe diversity, which may be one historical reason for the persistence of assumptions that higher diversity is better. For example, ecologists use *richness* to refer to the number of species, and *depauperat*e to describe communities with low diversity. This terminology was used in the literature as early as the 1920's (e.g., Wheeler, 1926), but seems to have become more prominent by the 1940's (e.g., Hubbs and Lagler, 1949). Thus, microbial ecologists perhaps have intuited value from legacy jargon without reconsideration of its merit.

161

- 162 Diversity only has value in a comparative context
- 163

Except in the context of informing study design and approach (e.g., how many sequences are needed for exhaustive coverage of a community?), there is little ecological value in reporting that a community has ten-thousand taxa or ten. The insight emerges when comparing that community to another situation or community of interest, and then asking what is the difference observed and why. This could be in the context of an experimental design between control and treatment conditions, over a natural or controlled environmental gradient, over time, in response to a disturbance or stressor, or over geographic space.

171

172 Comparative microbial diversity, especially when multi-layered community and functional 173 measurements are applied, has provided key insights into underlying processes. For example, 174 two sets of replicated methanogenic bioreactors responded differently to a pulse glucose shock: 175 one set was stable, while the other decreased in performance (Hashsham et al., 2000; Fernandez 176 et al., 2000). It was discovered that the sets harbored very different microbial compositions, 177 measured using several complementary methods, including cell morphology, fingerprinting, and 178 rRNA probes, which allowed the researchers to delve more precisely into the comparative 179 mechanisms of functional stability. In particular, the bioreactors with less diverse membership had 180 an ability to perform parallel substrate processing during the glucose shock to maintain 181 performance. One important conclusion from this study was that communities with higher diversity 182 were not necessarily more functionally stable in the face of disturbance.

183

184 Because of all of the nuances in calculating diversity, comparing diversity within a single study or 185 across a series of related studies (often by the same researcher) provides situation-specific 186 insights and modest advances. For understanding larger scale patterns in diversity over space 187 or time or across many ecosystems, researchers often have to spend much time curating 188 disparate datasets for meta-analysis, and re-defining taxonomic units across studies to be 189 maximally comparable. Even then, due to methodological differences, each dataset sometimes 190 must remain as a distinct unit and quantitative cross-study comparisons are limited. Though 191 quantifying large-scale patterns in microbial ecology is challenging, one of the scientific reasons 192 for doing so is to test ecological theories established in traditional ecology for microbial 193 communities. Calculating diversity for microbial communities and analyzing their overarching 194 patterns using methods directly comparable to studies in traditional ecology pushes forward our 195 pursuit of a unified ecological theory. For example, studies have considered latitudinal gradients

196 of diversity (e.g., Chu et al., 2010), and species-area and species-time relationships (e.g., Bell et 197 al., 2005; Shade et al., 2013). In some cases, microbial diversity exhibits similar large-scale 198 patterns to communities of larger organisms ("macroorganisms", e.g., Locey and Lennon 2016), 199 and in some cases, they are distinct (e.g., Fierer et al., 2011). Understanding these points of 200 distinction for microbial diversity will allow us to delve deeper into the ecological mechanisms 201 driving their patterns, and better place them in the context of a grander view of biology. To provide 202 specific example of how comparisons of large-scale patterns in diversity can uncover common 203 underlying ecology, a recent meta-analysis used species richness, observed community size, and 204 maximum community size of both macrobial and microbial communities to discover a universal 205 scaling law relationship between the size of the community and its evenness (inclusive of 206 dominance and rarity), where larger communities exhibit lower evenness and a larger "rare 207 biosphere" (Locey and Lennon 2016).

208

209 A final consideration is whether a given diversity comparison is ecologically meaningful. For 210 example, can any insight be gleaned to consider that an acid mine drainage community is much 211 less diverse than a soil (or, to be a bit facetious, that a mammal gut has different diversity than 212 the surface of a kitchen counter)? In these examples, there are very distinct ecosystems with 213 fundamentally different drivers and constraints. We do not need to calculate diversity in each to 214 be led to hypotheses as to why they are different. An exception to this is in questions concerning 215 source tracking of specific community members (e.g., Knights et al., 2011) where disparate but 216 connected ecosystems or regional metacommunities may be implicated in seeding each other's 217 diversity.

218

219 If diversity is not the answer, what is?

220

221 There are many ecological mechanisms that underpin patterns in community diversity, and they 222 are inherently difficult to unravel. The most commonly studied mechanisms are deterministic 223 processes. For instance, abiotic drivers and constraints, like environmental filters and carrying 224 capacity of an ecosystem, limit the type and number organisms capable of exploiting the habitat. 225 Abiotic disturbances may disrupt resource availability and make new niche space available, 226 driving replacement or proportional changes in communities. Disturbances sometimes impact 227 specific members rather than the whole community, driving selection or release from competition 228 or predation. Biotic interactions are also important drivers of diversity, and the nature and strength

of interactions like antagonism and synergism can result in complex and non-intuitive multimember interactions (e.g., Tilman, 1994) Thus, our ultimate understanding of diversity requires more than measurements of diversity; we also need contextual data and sufficient numbers of community observations for thoughtful comparisons that test specific hypotheses about how diversity may, or may not, change across sample categories or gradients.

234

Suppose a hypothetical study used marker gene sequencing to uncover evidence that a certain pathogen is more successful in invading a host-associated microbial community that has relatively lower diversity as compared to a higher diversity community. The researchers may then report that high diversity prevents pathogen invasion, and then attribute this to an underlying higher functional diversity in that community.

240

241 The guestion to consider is: what about the ecology of the more diverse community is inhibitory 242 towards the pathogen, and what about the less diverse community is permissive? Perhaps it is 243 that there is a direct competitor of the pathogen in the more diverse community. Or, perhaps there 244 is a mutualist of the pathogen in the low-diversity community that promotes its growth. Perhaps 245 the higher diversity community has lower pH, and the pathogen is sensitive to this specific abiotic 246 driver. Perhaps it is because a subset of community members has stimulated the host immune 247 response in the higher diversity community. Perhaps it is because the higher diversity community 248 is at carrying capacity, and there are no available niches for the invading pathogen. Perhaps the 249 pathogen acquired a beneficial gene, via horizontal gene transfer, from a member of the lower 250 diversity community that improved its success. (Also, without directly measuring function or 251 functional potential, it is a conceptual leap to move from the observation of high compositional 252 diversity to the assumption of high functional diversity.)

253

254 The mechanisms maintaining or changing microbial diversity are many and complex. 255 Understanding how these mechanisms collectively contribute to community outcomes is of great 256 importance for the goals of predicting, conserving, and managing microbial communities, and 257 reporting diversity without underlying hypotheses, contextual data for interpretation, or useful 258 comparisons does not advance our understanding towards these goals. Furthermore, common 259 assumptions that "higher diversity is better" oversimplifies complex mechanisms and can 260 sidetrack progress. There is a lot of work to be done, and measuring diversity is the first step in a 261 rich line of scientific inquiry. Measurement of diversity should serve as a starting point for further 262 inquiry of ecological mechanisms rather than an "answer" to community outcomes.

263	
264	
265	
266	Acknowledgements
267	
268	This work was supported in part by Michigan State University and in part by the DOE Great Lakes
269	Bioenergy Research Center (DOE BER Office of Science DE-FC02-07ER64494) and the DOE
270	OBP Office of Energy Efficiency and Renewable Energy (DE-AC05-76RL01830). I thank Noah
271	Fierer and Jackson Sorensen for insightful discussions, and reviewers for valuable comments on
272	the work.
273	
274	Conflict of interest
275	There author declares no conflict of interest.
276	

277 References

- Adams RI, Amend AS, Taylor JW, Bruns TD. (2013). A Unique Signal Distorts the Perception of
- 279 Species Richness and Composition in High-Throughput Sequencing Surveys of Microbial
- 280 Communities: A Case Study of Fungi in Indoor Dust. *Microb Ecol* **66**: 735–741.
- Bell T, Ager D, Song J-II, Newman JA, Thompson IP, Lilley AK, *et al.* (2005). Larger islands
 house more bacterial taxa. *Science (80-)* **308**: 1884.
- 283 Carini P, Marsden PJ, Leff JW, Morgan EE, Strickland MS, Fierer N. (2016). Relic DNA is
- abundance in soil and obscures estimates of soil microbial diversity. *PeerJ Prepr.* e-pub ahead
 of print, doi: doi: http://dx.doi.org/10.1101/043372.
- Chu H, Fierer N, Lauber CL, Caporaso JG, Knight R, Grogan P. (2010). Soil bacterial diversity
 in the Arctic is not fundamentally different from that found in other biomes. *Environ Microbiol* 12:
 2998–3006.
- Collman RG, Bushman FD, Knight R, Kelley ST, Knights D, Kuczynski J, *et al.* (2013). Bayesian
 community-wide culture-independent microbial source tracking. *Nat Methods* 8: 761–763.
- Edgar RC. (2013). UPARSE: highly accurate OTU sequences from microbial amplicon reads. *Nat Methods* **10**: 996–8.
- Eren a. M, Maignien L, Sul WJ, Murphy LG, Grim SL, Morrison HG, *et al.* (2013). Oligotyping:
 Differentiating between closely related microbial taxa using 16S rRNA gene data. *Methods Ecol Evol* 4: 1111–1119.
- 296 Fernandez AS, Hashsham SA, Dollhopf SL, Raskin L, Glagoleva O, Dazzo FB, et al. (2000).
- 297 Flexible community structure correlates with stable community function in methanogenic
- bioreactor communities perturbed by glucose. *Appl Environ Microbiol* **66**: 4058–4067.
- Fierer N, McCain CM, Meir P, Zimmermann M, Rapp JM, Silman MR, *et al.* (2011). Microbes do
 not follow the elevational diversity patterns of plants and animals. *Ecology* **92**: 797–804.
- 301 Gihring TM, Green SJ, Schadt CW. (2012). Massively parallel rRNA gene sequencing
- 302 exacerbates the potential for biased community diversity comparisons due to variable library
- 303 sizes. *Environ Microbiol* **14**: 285–290.

- Hashsham SA, Fernandez AS, Dollhopf SL, Dazzo FB, Hickey RF, Tiedje JM, et al. (2000).
- 305 Parallel processing of substrate correlates with greater functional stability in methanogenic
- bioreactor communities perturbed by glucose. *Appl Environ Microbiol* **66**: 4050–4057.
- Hill TCJ, Walsh KA, Harris JA, Moffett BF. (2003). Using ecological diversity measures with
 bacterial communities. *FEMS Microbiol Ecol* 43: 1–11.
- Hubbs CL, Lagler KF. (1949). Fishes of Isle Royale, Lake Superior, Michigan. *Pap MICHIGAN ACAD SCI ARTS LETT* 33(1947): 73–133.
- Hug LA, Baker BJ, Anantharaman K, Brown CT, Probst AJ, Castelle CJ, et al. (2016). A new
- view of the tree and life's diversity. *Nat Microbiol* **1**: Manuscript submitted for publication.
- Jones SE, Lennon JT. (2010). Dormancy contributes to the maintenance of microbial diversity.
- 314 *Proc Natl Acad Sci U S A* **107**: 5881.
- 315 Kassam Z, Lee CH, Yuan Y, Hunt RH. (2013). Fecal microbiota transplantation for Clostridium
- difficile infection: systematic review and meta-analysis. *Am J Gastroenterol* **108**: 500–8.
- 317 Klindworth A, Pruesse E, Schweer T, Peplies J, Quast C, Horn M, et al. (2013). Evaluation of
- 318 general 16S ribosomal RNA gene PCR primers for classical and next-generation sequencing-
- 319 based diversity studies. *Nucleic Acids Res* **41**: 1–11.
- 320 Locey KJ, Lennon JT. (2016). Scaling laws predict global microbial diversity. *PNAS*. e-pub
- ahead of print, doi: 10.7287/peerj.preprints.1451v1.
- Lynch MiDJ, Neufeld JD. (2015). Ecology and exploration of the rare biosphere. *Nat Rev Microbiol* **13**: 217–229.
- Ma B, Forney LJ, Ravel J. (2012). Vaginal microbiome: rethinking health and disease. *Annu Rev Microbiol* 66: 371–89.
- 326 Magurran AE. (2003). Measuring biological diversity. Wiley-Blackwell.
- 327 Marcy Y, Ouverney C, Bik EM, Lösekann T, Ivanova N, Martin HG, et al. (2007). Dissecting
- 328 biological 'dark matter' with single-cell genetic analysis of rare and uncultivated TM7 microbes
- from the human mouth. *Proc Natl Acad Sci U S A* **104**: 11889–94.

- 330 Preheim SP, Perrotta AR, Martin-Platero AM, Gupta A, Alm EJ, Perrott AR, *et al.* (2013).
- 331 Distribution-based clustering: using ecology to refine the operational taxonomic unit. *Appl*
- 332 Environ Microbiol **79**: 6593–6603.
- Ricotta C. (2005). Through the jungle of biological diversity. *Acta Biotheor* **53**: 29–38.
- Rideout JR, He Y, Navas-Molina JA, Walters WA, Ursell LK, Gibbons SM, et al. (2014).
- 335 Subsampled open-reference clustering creates consistent, comprehensive OTU definitions and
- 336 scales to billions of sequences. *PeerJ* **2**: e545.
- Schloss PD. (2016). Application of a Database-Independent Approach To Assess the Quality of
 Operational Taxonomic Unit Picking Methods. *mSystems* 1: e00027–16.
- 339 Shade A, Caporaso JG, Handelsman J, Knight R, Fierer N. (2013). A meta-analysis of changes
- in bacterial and archaeal communities with time. *ISME J* **7**: 1493–1506.
- 341 Stoddard SF, Smith BJ, Hein R, Roller BRK, Schmidt TM. (2015). rrnDB: Improved tools for
- 342 interpreting rRNA gene abundance in bacteria and archaea and a new foundation for future
- development. *Nucleic Acids Res* **43**: D593–D598.
- Tilman D. (1994). COMPETITION AND BIODIVERSITY IN SPATIALLY STRUCTURED
 HABITATS. *Ecology* **75**: 2–16.
- Turnbaugh PJ, Ridaura VK, Faith JJ, Rey FE, Knight R, Gordon JI. (2009). The effect of diet on
 the human gut microbiome: a metagenomic analysis in humanized gnotobiotic mice. *Sci Transl Med Med* 1: 6ra14.
- 349 Wheeler WM. (1926). Ants of the Balearic Islands. *Folia Myrmecol Termit* **1**: 1–6.
- 350
- 351

- 352 **Table 1**. Different aspects of within-sample (alpha) diversity. One or more of these aspects are
- incorporated into common diversity estimates, like Shannon Diversity, Faith's phylogenetic
- diversity, etc.
- 355

Aspect of diversity	Notes
Community size	The total number of individuals observed in a locality
Number of taxa (richness)	Summarizes the total number of taxa, where taxon is counted as an equivalent unit
Equitability of taxa (evenness)	Summarizes how evenly distributed are relative contributions across taxa
Composition of taxa	Accounts for the number of unique taxa and their identities, which can be taxonomic or operational
Relative contributions of taxa	Accounts for the proportional contributions of each taxon to the total count of all individuals observed
Phylogenetic relatedness of taxa	The evolutionary breadth represented by taxa given a phylogenetic tree

356 357

358