# 1 Title

- 2 Sampling biases obscure the early diversification of the largest living vertebrate
- 3 group

# 4 Authors

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## 13 Abstract

14 Extant ray-finned fishes (Actinopterygii) dominate marine and freshwater environments, yet their spatiotemporal diversity dynamics following their origin in the 15 Palaeozoic are poorly understood. Previous studies investigate face-value patterns of 16 richness, with only qualitative assessment of potential biases acting on the Palaeozoic 17 actinopterygian fossil record. Here, we investigate palaeogeographic trends and apply 18 richness estimation techniques to a recently-assembled occurrence database for Palaeozoic 19 ray-finned fishes. We reconstruct patterns of local richness of Palaeozoic actinopterygians, 20 21 alongside sampling standardised estimates of 'global' diversity. We identify substantial fossil 22 record biases, such as geographic bias in the sampling of actinopterygian occurrences centred 23 around Europe and North America. Similarly, estimates of diversity are skewed by extreme unevenness in the abundance distributions of occurrences, reflecting past taxonomic practices and historical biases in sampling. Increasing sampling of poorly represented regions and expanding sampling beyond the literature to include museum collection data will be critical in obtaining accurate estimates of Palaeozoic actinopterygian diversity. In conjunction, applying diversity estimation techniques to well-sampled regional subsets of the 'global' dataset may identify accurate local diversity trends.

## 30 Keywords

diversity; sampling standardisation; Actinopterygii; fossil record bias; Palaeozoic.

## 32 Introduction

33 There are around 32,000 species of living ray-finned fishes (actinopterygians), amounting to over half of extant vertebrate diversity, and split roughly evenly between marine 34 35 and freshwater environments (1). Ray-finned fishes originated in the Palaeozoic, which saw 36 major evolutionary events and changes in the vertebrate fauna, such as the emergence of 37 jaws (2), the rise of actinopterygians (3), and the move onto land (4). Despite these pivotal 38 changes, and a long history of research on actinopterygians, there are relatively few 39 macroevolutionary studies investigating diversity trends in their early evolution, and all 40 examine face-value patterns of taxonomic richness (3,5–9).

41 Few studies investigate the suitability of the Palaeozoic ray-fin record for investigating 42 diversity patterns, or potential biases. Notably, biases may impact the marine and freshwater 43 record differently – late Palaeozoic Lagerstätten influence freshwater osteichthyan diversity 44 more than marine (5). Low taxonomic diversity in the Devonian followed by an explosive increase in the early Carboniferous is generally interpreted as representing a genuine 45 46 biological signal (3,10). Some authors gualitatively suggest that low Permian diversity is linked 47 to the rarity of suitable deposits (11), or attribute the decline in richness among freshwater taxa to the loss of extensive Euramerican freshwater habitats (5). Other authors propose that 48 49 the consistent ecomorphologies in typical Palaeozoic actinopterygians hint at constraints on diversification into new ecologies and habitats and thus low richness (10). To date, previous studies only present face-value counts of actinopterygians through time without employing recent advances in methodologies to estimate diversity trends. An exception to this (5) performed coverage-based rarefaction to compare the Permian and Triassic as a whole, rather than to estimate diversity trends through time.

55 Assessing the degree to which fossil record biases affect interpretations of richness is critical to obtaining an accurate estimate of diversity trends (12-14). These biases can be 56 geological (15,16), geographic (17–19), or anthropogenic (20,21) in nature, and recent 57 58 analyses show that 'global' fossil records are intimately linked to the spatial extent of that record (17,18). Various statistical methods attempt to tease apart bias from genuine changes 59 (e.g. classical rarefaction and residual modelling), though not without complications (e.g. 60 classical rarefaction can flatten diversity patterns (22-25). Recent years have seen the 61 62 application of Shareholder Quorum Subsampling (SQS), also termed coverage-based 63 rarefaction (25,26), to palaeobiological occurrence databases (17–19,27–31) as a means of 64 deducing trends in palaeodiversity through time. As SQS subsamples intervals to equal levels 65 of completeness it returns more accurate relative richness estimates between sampled intervals than size-based rarefaction (23), although is still susceptible to some biases (21,24). 66 67 Principally, SQS estimates can have a significant evenness signal (21,24,32), which may be 68 particularly important for datasets that are biased in ways that skew the evenness of frequency 69 distributions within sampled intervals. A new richness estimator, squares (33), estimates 70 higher richness when there are numerous rare taxa (i.e. singletons) and when common taxa 71 are especially abundant. Squares is more robust to uneven distributions than SQS, though falls short when the ratio of richness counts to total number of taxa within intervals is very high 72 (24). 73

Until recently, no comprehensive through-Palaeozoic occurrence database existed (9), with previously-published databases limited in scope or not updated (3,5). Here, we apply coverage-based sampling standardisation to a newly-assembled occurrence database of

- 77 Palaeozoic actinopterygians to examine patterns of diversity, the suitability of the dataset, and
- the likely extent and impact of sampling biases.

### 79 Methods

## 80 Data preparation

Global occurrences of Palaeozoic Actinopterygii (9) were screened for taxonomically 81 indeterminate occurrences and scale- and teeth-based occurrences. After removal, this 82 resulted in a dataset of 1,611 occurrences of 468 species (belonging to 225 genera), from 507 83 unique geographic localities. All occurrences were assigned to intervals of roughly equal 84 85 length (~9 Ma), determined by either combining shorter intervals (e.g. Kasimovian [3.3 Ma] and Gzhelian [4.8 Ma] = Kasimovian and Gzhelian [8.1 Ma]), or splitting longer intervals (e.g. 86 Visean [15.8 Ma] = early Visean [Chadian-Holkerian; 8.7 Ma] and late Visean [Asbian-87 Brigantian; 7.1 Ma]; boundary based on the age of the Dunsapie basalt, see (34)). The cleaned 88 89 dataset was used for local richness and diversity estimation. All analyses were conducted within R 4.1.0 (35). 90

## 91 Alpha diversity (local richness)

Species per locality were counted as a measure of alpha diversity (local richness (36)). 92 Modern coordinates for these localities were translated into palaeocoordinates using the R 93 94 'chronosphere' package (37). Local richness was then subset by marine and freshwater environment (brackish environments were included in marine counts) and plotted against 95 palaeolatitude. Additionally, palaeogeographic maps showing local richness were produced in 96 'chronosphere' (37) for each interval. It is uncertain whether some Permian localities (Pastos 97 98 Bons – Brazil; Deep Red Run, Dundee, McCann Quarry, Pond Creek, South Dakota State Cement Plant Quarry – USA; Sobernheim – Germany) are Artinskian or Kungurian in age, and 99 these localities are therefore plotted in both palaeogeographic maps. 100

#### 101 Sampling standardisation and diversity estimation

102 Coverage-based sampling standardisation (22,26,38,39) was used to estimate global diversity patterns via the R package iNEXT (version 2.0.19 (40)), following the procedure 103 outlined in Dunne et al. (28). The data were rarefied by geographic locality by analysing 104 incidence-frequency matrices of the occurrence data. Extrapolated estimates were limited to 105 106 no more than twice the observed sample size (40). Coverage-standardised richness was computed at genus level using roughly equal length bins, at guorum levels 0.3, 0.4, 0.5 for 107 108 genus-level analysis and up to 0.6 guorum for species-level analysis; higher guorums were 109 unattainable. Devonian bins were excluded due to the very small sample-sizes and low levels 110 of coverage. Rank abundance distributions and size- and coverage-based rarefaction curves were generated for each interval to investigate the reliability of coverage-based rarefaction 111 estimates. 112

113 Squares extrapolated estimates of genus and species richness were conducted in R 114 by applying Alroy's equation (33), following the same procedure as Allen *et al.* (30).

115 **Results** 

## 116 Alpha diversity (local richness)

Local richness is generally low in the Devonian (figure 1), with only one locality 117 containing more than three genera (Paddy's Valley, Gogo Formation, Frasnian, Australia). 118 Levels of local richness are highest in the Carboniferous, particularly around the 119 Serpukhovian-Moscovian boundary (figure 1), before declining steadily in the latest 120 Carboniferous (Kasimovian and Gzhelian) and early Permian (Cisuralian). Notable localities 121 122 contributing to the mid-Carboniferous peak include Glencartholm (Scotland, late Visean, marine), Ardenrigg (Scotland, Bashkirian, freshwater), Longton (England, Bashkirian, marine) 123 and the Bear Gulch localities (USA, Serpukhovian, marine) (figure 1a). Sampling of marine 124 and brackish palaeoenvironments in the latest Carboniferous (Kasimovian and Gzhelian) and 125 126 earliest Permian (Asselian and Sakmarian) is very poor. Freshwater localities are also poorly sampled in the Artinskian and Kungurian, yielding very low richness, while richness and 127

sampling also remains low in marine deposits. In the latest Permian (Wuchiapingian and
Changhsingian), marine localities generally have much higher genus counts than freshwater
localities.

### 131 **Palaeomaps and geographic spread**

## 132 Devonian

133 Despite their earliest occurrence being just north of the palaeoequator (Meemannia, 134 Lochkovian, South China), actinopterygians are known almost exclusively from southern palaeolatitudes in the Devonian (figure 1b; figure 2a). Only two other northern hemisphere 135 occurrences are reported (Cheirolepis, Givetian, Svalbard (41); Krasnoyarichthys, 136 Famennian, Russia (42)). The majority of taxa occur at low palaeolatitudes (0° to -30°), with a 137 small number just crossing into the mid-palaeolatitudinal band (-30° to -60°). A clear outlier, 138 near the southern palaeopole (-83.81°), is the recently-reported Austelliscus ferox from Brazil 139 (43). 140

Devonian actinopterygian occurrences mirror both continental configurations—the 141 majority of landmasses and shallow seas were palaeoequatorial and in the southern 142 hemisphere (44)—and the broader Devonian fossil record (18,45,46). Givetian and Eifelian 143 occurrences are dominated by European (especially Scottish) deposits, with limited 144 contributions from the USA, Australia, the Antarctic and Brazil (figure 2a). In contrast, Frasnian 145 occurrences (figure 2b) are dominated by the Australian Gogo Formation, with fewer 146 occurrences from Europe and North America, and a single occurrence from Iran. The USA 147 148 dominates Famennian occurrences (figure 2c), with additional occurrences from Russia, Greenland and Belgium. 149

## 150 Carboniferous

151 In general, Carboniferous localities have both higher local richness and a broader 152 palaeolatitudinal spread than in the Devonian, although are generally still restricted to low and 153 southern palaeolatitudes (figure 1b). Most Tournaisian localities are clustered at low palaeolatitudes around the southern edge of Euramerica in regions that correspond to presentday Canada, USA, UK, and European Russia. Localities with lower local richness are found
in Australia, Turkey, and Siberia. In contrast, early Visean (Chadian-Holkerian) low- to midpalaeolatitudes are depauperate (figure 2e), although the Waaipoort Formation in South Africa
(-78°) represents the richest high-palaeolatitude locality of the entire Palaeozoic.

For much of the rest of the Carboniferous, local richness greatly increases while 159 palaeolatitudinal spread decreases. Other than single occurrences from Australia and the 160 USA, all late Visean actinopterygians are clustered in the UK and Ireland, including the highly 161 162 diverse Glencartholm locality (figures 1b and 2f). Similarly, in the Serpukhovian (figure 2g), only a single occurrence is found outside a 20° palaeolatitudinal band centred around the 163 palaeoequator encompassing UK localities, a single Belgian locality, and the speciose Bear 164 Gulch localities. Geographic spread continues to decline in the Bashkirian (figure 2h) and 165 166 Moscovian (figure 2i), with all occurrences within 10° of latitude of the palaeoequator. Again, localities only are only known in Europe (Belgium, Czechia, France, Ireland, UK) and North 167 America (Canada, USA). The only latest Carboniferous (Kasimovian and Gzhelian; figure 2j) 168 locality outside of this band is the -60° Gzhelian Ganigobis Shale, which outcrops in South 169 170 Africa and Namibia, albeit with low local richness. Broadly, Carboniferous actinopterygian 171 palaeolatitudinal distribution matched other contemporaneous groups (18,46).

172 Permian

Compared to the Carboniferous and Devonian, Permian occurrences generally display a broader geographic spread (reflecting increases in the broader fossil record (18,46)) but lower local richness. The extent of palaeogeographic sampling in the Asselian and Sakmarian (figure 2k) is greater than the Kasimovian and Gzhelian, with more occurrences at higher palaeolatitudes, including the diverse Uruguayan fauna from Rio Negro (-53°). The Artinskian (figure 2l) is the most depauperate interval of the Palaeozoic outside of the Devonian, despite a comparatively high palaeogeographic spread: the locality with the highest local richness, Loeriesfontein, contains only four genera. Contrary to most other Palaeozoic intervals, thereare very few European Artinskian localities.

From the Kungurian (figure 2m) onwards, localities occur across the broadest 182 palaeolatitudinal spread of the entire Palaeozoic. This includes the first sampling of northern 183 mid-palaeolatitudes since the Tournaisian. Wordian and Roadian localities (figure 2n) with the 184 highest local richness are found in Russia, centred around 30° palaeolatitude, although less 185 diverse occurrences are seen at high southern palaeolatitudes in Brazil, India, and Zimbabwe. 186 In contrast to most other intervals, only two depauperate localities occur near the 187 188 palaeoequator. This trend continues into the Capitanian (figure 20), where localities yielding few genera are found across a wide range of palaeolatitudes, with very few at equatorial 189 latitudes, and most diversity stems from Russia. 190

191 The Wuchiapingian and Changhsingian interval (figure 2p) has the broadest 192 geographic spread in sampling of the Palaeozoic, possibly due to intensive research focus on 193 the Permo-Triassic mass extinction event (47,48). Numerous localities are spread from southern mid- to high-palaeolatitudes, including opposing sides of the palaeopole (present-194 day South Africa and Australia). Notably, this interval contains the first Palaeozoic 195 actinopterygians from the eastern Palaeotethys (present-day China) aside from a single 196 197 Lochkovian occurrence. Northern low- to mid-palaeolatitudes have the highest local richness, stemming from assemblages in the UK and Germany, Russia, and Greenland. 198

#### 199 Palaeodiversity estimates

### 200 Coverage-based rarefaction

Estimates of relative genus richness using coverage-based rarefaction (figure 3a) suggest a gradual overall decline in diversity through the Carboniferous, with a sharp rise then subsequent fall in the Permian. Richness levels decrease from the Tournaisian through to the late Visean (the most intensely sampled interval of the Carboniferous), before peaking in the Serpukhovian. The remainder of the Carboniferous is marked by a decline, with the lowest 206 observed values in the Kasimovian and Gzhelian, another intensely sampled interval. 207 Richness estimates rise slightly across the Carboniferous-Permian boundary, followed by a 208 precipitous rise in the Kungurian, where the highest levels in the Palaeozoic are reached. A 209 steady decline marks the remainder of the Permian.

Coverage-rarefied estimates of species richness differ notably from genus estimates 210 (figure 3b). Overall, estimates of species diversity generally increase, albeit irregularly, across 211 the Carboniferous until a crash in the Kasimovian and Gzhelian, followed by two distinct peaks 212 and declines in the Permian. Species richness initially decreases through the Tournaisian and 213 214 Visean and increases in the Serpukhovian, with a drop into the Bashkirian and subsequent 215 rise into the Moscovian, which represents the highest richness levels of the Carboniferous. This peak is immediately followed by a Kasimovian and Gzhelian trough. Levels rise steeply 216 217 in the Asselian and Sakmarian followed by another abrupt drop in the Artinskian. There is only 218 a modest rise into the Kungurian, with the major peak in species-level estimates seen in the 219 Roadian and Wordian. A relative decrease in the Capitanian is followed by a minor decline 220 through the Wuchiapingian and Changhsingian.

221 Squares

222 Squares diversity estimates contrast starkly with coverage-based rarefaction 223 estimates: where coverage-based rarefaction returns low estimates, squares estimates are 224 generally high. Squares-extrapolated genus richness estimates (figure 4a) gradually increase throughout the Devonian and into the Tournaisian. Early Visean estimates drop back to 225 Famennian levels, before gradually rising in the late Visean to Serpukhovian. A slight decrease 226 into the Bashkirian is followed by a steeper decline in the Moscovian. The highest estimates 227 228 thus far are seen in the latest Carboniferous with a further increase into the Asselian and Sakmarian, followed by a precipitous drop in the Artinskian. Richness estimates rise in the 229 Kungurian and marginally in the Roadian and Wordian before dropping in the Capitanian. The 230 latest Permian (Wuchiapingian and Changhsingian) is the most diverse interval of the 231 Palaeozoic. 232

233 Squares-extrapolated species richness trends (figure 4b) differ again from genus richness estimates. The pattern in the Devonian is in direct contrast, with estimates decreasing 234 from the mid- through to late-Devonian in the Givetian and Eifelian, although a rise is observed 235 across the Devonian-Carboniferous. As with genus estimates, the early Visean has lower 236 237 richness than the Tournaisian. Species richness estimates rise significantly in the late Visean, quadrupling relative to the early Visean. The Serpukhovian sees a moderate decrease in 238 239 richness, and this trend continues throughout the Bashkirian and Moscovian. Richness rises sharply in the Kasimovian and Gzhelian to the highest level of the entire Palaeozoic. A slight 240 241 decrease across the Carboniferous-Permian boundary is followed by a precipitous drop in the Artinskian. Richness increases slightly in the Kungurian, recovers further in the Roadian and 242 243 Wordian, declines again in the Capitanian, and finally increases in the latest Permian.

244

### 245 Discussion

## 246 Biogeographic trends and biases

Palaeozoic actinopterygian occurrences are overwhelmingly geographically biased 247 towards the northern hemisphere: fewer than 9% of known localities (52/586) are from the 248 southern hemisphere (9). Certain regions are notably underrepresented throughout the 249 Palaeozoic, such as the northern, eastern and southern Palaeotethys (present-day Middle 250 East, south and east Asia, north Africa) and the northern coastline of Laurussia (present-day 251 Siberia, Kazakhstan and interior of Asia). Sampling through much of the Devonian and 252 253 Carboniferous is limited to a narrow band around the palaeoequator, largely corresponding to present-day Europe and North America (figure 2), which also contain localities with the highest 254 local richness (9). The most diverse localities trend from low- to mid-palaeolatitudes through 255 the Palaeozoic, essentially tracking the migration of North America and Europe (figure 1b). 256 257 Reporting new taxa from underrepresented regions (41,43) will have major implications for palaeogeographical spread, patterns of diversity, and interpretations of ray-finned fish 258

evolution, especially in the face of taxonomic revisions invalidating many existing genericreferrals (49,50).

261 Ideally, rarefaction curves for sampled intervals should be close to asymptote before performing diversity estimation techniques to ensure that future sampling will not drastically 262 alter face-value counts of richness. Inspection of the Palaeozoic ray-finned fish record 263 suggests this condition has not yet been reached (figure S1). In the short term, increased 264 sampling of the most under sampled intervals will improve comparability. However, research 265 focus on taxa from well-sampled regions that are languishing undescribed in museum 266 267 collections (51,52) is also vital for attaining accurate estimates of actinopterygian diversity in the Palaeozoic, particularly at local scales. 268

Both marine and freshwater deposits are recorded throughout the Palaeozoic, with the 269 number of sampled marine and freshwater deposits roughly tracking each other through much 270 of the Carboniferous. However, marine palaeoenvironments are scarce in the later 271 272 Palaeozoic. This long-recognised Permian imbalance (10,11,53) also extends back into the late Carboniferous (figure 1a). The near-complete lack of marine deposits suggests that low 273 marine diversity in this period is linked to a geological bias and relative absence of these rocks 274 rather than a true biological signal. There is certainly a change in the sampling of terrestrial 275 276 vertebrates from aquatic to dryland terrestrial environments across the Carboniferous-Permian (54), and a similar change may explain the drop in sampling of Permian 277 actinopterygians. Concurrent with this environmental shift is a noticeable palaeogeographical 278 expansion: rather than being restricted to palaeoequatorial regions, Permian occurrences are 279 280 reported from much higher and lower palaeolatitudes. It is unclear to what extent this represents a shift in sampling regime rather than an ecological expansion. 281

282

## 283 Palaeozoic actinopterygian diversity patterns

284 Changes in local richness largely track changes in 'global' (gamma) raw diversity (9), 285 with the exception of the latest Carboniferous and earliest Permian (figure 1). In the late 286 Carboniferous and early Permian, high levels of sampling (localities and equal-area grid cells 287 (9)) of isolated localities with low alpha diversity drives high 'global' diversity, with few 288 contributions from diverse assemblages. These richness patterns are drastically different to 289 those reported for Palaeozoic tetrapods (28), and the overall decrease from the Carboniferous 290 to Permian contrasts the biodiversification of invertebrates over the same period (55).

In contrast to coverage-rarefied diversity estimates, extrapolated estimates from 291 292 squares analysis return very similar trends to face-value counts of richness (3,5,9). These differences persist regardless of whether sampling is via equal length intervals or geological 293 stages and are likely due to taxonomic biases (see below). This recalls recent work on 294 Palaeozoic tetrapods, which found that diversity patterns among reptiles and synapsids 295 296 changed significantly depending on the quorum levels or use of squares (56). For example, coverage-rarefied actinopterygian diversity decreases from the Tournaisian to the late Visean 297 298 in contrast with previous hypotheses (3,6,9), yet both the face-value counts and squares estimates increase significantly from the early to late Visean. There is consensus however, in 299 300 the high diversity of the Serpukhovian (3,9), indicating genuine diversity, though the vast majority of this is driven by the highly-diverse Bear Gulch fauna. 301

Trends into the Pennsylvanian also differ, with the greatest difference in the 302 diametrically opposed estimates for the Kasimovian and Gzhelian, which is attributable to the 303 ways in which the methods estimate diversity. The same is also true for the Asselian and 304 305 Sakmarian and late Permian. Coverage-rarefied diversity estimates depend on the attainable level of coverage, and examination of abundance distributions (figure S2) and rarefaction 306 curves (figure S3) reveals that at higher coverage, the Kasimovian and Gzhelian would most 307 likely represent one of the most diverse intervals. Squares, however, estimates higher 308 309 richness when there are many singletons and when common taxa are especially common

(24), and these intervals fulfil both of these criteria. The combined presence of superabundant
 taxa and numerous singletons results in these conflicting estimations.

312 Taxonomy also plays a key role. The observed rise in early Permian species-level diversity estimates in both analyses and face value readings (9) reflects the presence of 313 numerous species of few genera (namely Amblypterus and Paramblypterus). The problem of 314 superabundant genera is not unique to actinopterygians; such genera are known to bias other 315 osteichthyan groups (57). In contrast, Kungurian estimates are based on very few occurrences 316 of monospecific genera, and sampling of a high number of genera at low guorums results in 317 318 high—yet unreliable—genus-level coverage-rarefied diversity estimates. The extremely high 319 Roadian and Wordian species-level estimates in both analyses, not reflected at genus-level, 320 can also be explained by high numbers of singletons and relative absence of common genera.

321

### 322 Unevenness in the actinopterygian fossil record

Coverage-based rarefaction techniques produce the most reliable richness estimates 323 when rank abundance does not differ considerably between samples, even when samples 324 have comparable face-value richness (22–26,32,38). Unevenness in abundance distributions 325 can therefore heavily influence the reliability of diversity estimates. Rank abundance 326 distribution plots for Palaeozoic actinopterygian genera and species indicate extreme 327 328 unevenness within intervals and variation in evenness between intervals (figure S2). Some intervals (e.g. Kasimovian and Gzhelian) contain one or two taxa with more than 60 329 330 occurrences, a handful with between 30 and ten occurrences, and a long tail of singletons or doubletons; others (e.g. Frasnian) have a more even distribution. Differences can even arise 331 332 between the genus- and species-level abundance distributions in the same interval: in the Asselian and Sakmarian most species-level diversity stems from multiple species of two 333 genera (Amblypterus and Paramblypterus), resulting in low genus estimates at lower 334

quorums, but higher species-level estimates due to the more even abundance distributions
(compare figures S2a and S2b; S3f and S3i).

337 Much of this imbalance is driven by 'waste-basket' genera erected by monographic descriptions (58-61), despite a wide range of varied morphologies and extensive temporal 338 and geographic ranges within genera (9,62,63). These 'waste-baskets' serve to concentrate 339 frequency counts of the most common genera, contributing to unevenness in the abundance 340 distribution and distortion of coverage-based rarefaction estimates (22,23). The intervals most 341 heavily biased towards superabundant taxa are the late Visean (Elonichthys: 54/266 342 343 occurrences; Rhadinichthys: 54/266 occurrences), Kasimovian and Gzhelian (Elonichthys: 65/230; Sphaerolepis: 60/230), Asselian and Sakmarian (Paramblypterus: 53/154 344 occurrences; Amblypterus: 30/154 occurrences), and Wuchiapingian and Changhsingian 345 (Palaeoniscum: 66/225 occurrences; Platysomus: 26/225 occurrences). As coverage-based 346 347 rarefaction produces lower estimates when evenness is low (23), highly uneven intervals have low richness estimates at lower quorum levels (figure 3; figure S3). In contrast, at high 348 quorums, where more taxa in the abundance distribution can be sampled, uneven intervals 349 receive much higher richness estimates (see exponential rise in the rarefaction curves of 350 351 uneven intervals at high coverage; figure S3).

352 'Waste-basket' taxa may also mask true diversity: the dominance of highly abundant taxa means that a high proportion of sampled taxa consists of these few taxa, likely 353 contributing to lower diversity estimates. Revisionary taxonomic work, such as recognising 354 new genera among previously congeneric actinopterygians (49), and restriction of *Elonichthys* 355 356 to just three species (50) rather than its previous 57, will alleviate this issue and mitigate the dominance of superabundant forms. These revisions, however, have the potential to increase 357 unevenness in the other direction, as new taxa may end up as singletons or doubletons. 358 359 Concurrently, the biostratigraphic significance of actinopterygians in deposits from the 360 Permian of Russia (64–66) may contribute to oversplitting of taxa, echoing problems prevalent 361 in the marine invertebrate fossil record (23).

362 Major variation in evenness between intervals is highlighted in the different trajectories of coverage-based rarefaction curves (figure S3). Taxonomic and geographic biases are 363 exacerbated by small sample sizes and low coverage, with rarefaction curves crossing 364 multiple times. Higher (more reliable) quorum levels are unobtainable for Palaeozoic 365 366 actinopterygians due to the high number of singleton taxa (figure S3) controlling Good's u (67). As a result, coverage is generally low (figure S2) and only low guorums—at which evenness 367 368 signals are more pronounced (24)-can be used. When evenness varies at low levels of 369 sampling, size-based rarefaction can in fact be less biased than coverage-based rarefaction, 370 especially at low levels of coverage (23). Trends between coverage- and size-based 371 rarefaction estimates generally agree (figure S4), although size-based rarefaction estimates higher diversity in some highly uneven intervals (e.g. late Visean; Wuchiapingian and 372 373 Changhsingian). Small sample sizes (<200 occurrences) also have an effect on the accuracy 374 of coverage estimates using Good's u (23): only four of the sampled Palaeozoic intervals have more than 200 occurrences (late Visean: 266; Serpukhovian: 204; Kasimovian and Gzhelian: 375 376 230; Wuchiapingian and Changhsingian: 232). Coverage-based rarefaction curves (figure S3) show these intervals to have among the highest coverage, along with the Bashkirian and 377 378 Moscovian, highlighting the greater sampling of the Carboniferous than the Permian. Consequently, variation in evenness between intervals is having an overriding effect on 379 sampling-standardised diversity estimates through time, with diversity estimates mostly 380 tracking evenness and reflecting biases in the underlying data (23,68). 381

382

### 383 **Conclusions and future directions**

We present here the first local richness and palaeogeographic trends in Palaeozoic ray-finned fishes. Sampling of the Palaeozoic actinopterygian fossil record is heavily biased towards western Europe (especially the UK) and North America, which translates to a very restricted palaeogeographic spread for most of the Palaeozoic. A suite of compounding problems plagues the actinopterygian fossil record and results in bias towards occurrences of 389 both superabundant and singleton taxa, variation and unevenness in and between sampled intervals, and distortion of relative richness estimates. A combination of flawed taxonomic 390 practices, differential researcher effort, and geographic sampling biases confounds attempts 391 to accurately estimate relative richness between intervals. Meanwhile, sampling is poor for 392 393 regions other than Europe and North America for all but a few Carboniferous and Permian 394 intervals. The result of this poor sampling is the inability to reach the high levels of coverage 395 that allow statistical methods of sampling standardisation to generate meaningful diversity 396 estimates.

397 Identifying the underlying issues with Palaeozoic actinopterygian data and the interweaving biases that are impacting the fossil record is crucial, and improving sample sizes 398 and coverage will help to mitigate the sensitivity to evenness (25). Documenting and including 399 400 existing 'dark data' (51,52) in museum collections, as well as focus on new material from under 401 sampled regions, represent key first steps. As a result, size-based rarefaction curves for Palaeozoic intervals will likely not reach asymptote soon (figure S1). More complete sampling 402 of well-known regions (69) may facilitate deduction of accurate local richness patterns (36). 403 This strategy also goes some way towards accounting for the significant spatial structuring of 404 405 'global' fossil records (17-19,27).

406 Other recently proposed methods, such as coverage-rarefaction of extrapolated richness estimates (instead of face-value counts) (23), represent prospective avenues of 407 research, both at local and global scales. However, existing global occurrence data for 408 Palaeozoic actinopterygians is as yet inadequate for extrapolation in this way: sample sizes 409 410 vary widely between intervals, which may result in inaccurate extrapolated richness trends (23,70,71); sample sizes in all intervals are too low for size-based rarefaction curves to 411 412 asymptote (figure S1), meaning sample size has an overwhelming effect on diversity estimates (23); and abundance distributions are also highly uneven, which biases extrapolators (though 413 414 to a lesser extent than coverage-based rarefaction; 17).

Overall, the occurrence data recorded in the literature is heavily impacted by sampling and likely results in inaccurate estimated diversity trends at present. Localised diversity estimates for well-sampled regions presents a feasible avenue of research for reconstructing regional diversity. In addition, research efforts to fix problematic taxonomy of 'waste-basket' taxa, in hand with a general increase in sampling, open the possibility of estimating diversity in a spatially-standardised framework, so that we can truly begin to understand the origin, rise and establishment of the largest vertebrate clade.

422

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621

# 622 Figures

- 623 Figure 1 Local richness (number of species per fossil locality) of actinopterygians through
- the Palaeozoic. (a) Local richness plotted by environment, separated by freshwater (red) and
- 625 marine (blue; incorporates brackish occurrences). Colour saturation (transparency) indicates
- density of localities, and the most genus-rich localities are labelled. Note that purple
- 627 indicates contemporary localities with similar diversity of marine and freshwater
- actinopterygians. (b) Palaeolatitude of localities through time, with local richness indicated by
- 629 colour (yellow localities have low richness, progressing through green to the most diverse
- 630 localities in indigo).

631 Figure 2 – Palaeomaps showing palaeogeographic spread and local richness of individual

localities through time plotted in roughly even-length intervals. Colour scales correspond to

the richness of localities, ranging from low (light blue) to high (pink) richness.

Figure 3 – Coverage-based rarefaction estimates of Carboniferous and Permian

actinopterygian diversity at (a) genus- and (b) species-level, showing estimates for different

quorum levels in different colours from low quorums (0.3) in light blue to higher quorums

(0.6) in darker blue. The shaded areas for each quorum are confidence intervals of

638 estimates. Devonian intervals removed (see Methods). Estimates were either interpolated

639 (circles) or extrapolated (squares) up to twice the reference sample size (40).

640 Figure 4 – Squares diversity estimates of Devonian to Permian (a) genus (circles) and (b)

species (triangles) richness, plotted at the midpoints of equal-length intervals.

642 Figure S1 – Size-based rarefaction curves for (a) Carboniferous genus-level occurrences,

(b) Permian genus-level occurrences, (c) Carboniferous species-level occurrences, (d)

644 Permian genus-level occurrences.

Figure S2 – Rank order abundance distributions of the sampled equal-length intervals

646 (coloured correspond with the International Commission on Stratigraphy; ICS) at (a) genus-

647 level occurrences and (b) species-level occurrences.

Figure S3 – Sample completeness (a-c, k-l) and coverage-based rarefaction curves (d-i) for

649 Carboniferous (b, e, h, k) and Permian (c, f, i, l) intervals. Solid lines are interpolated

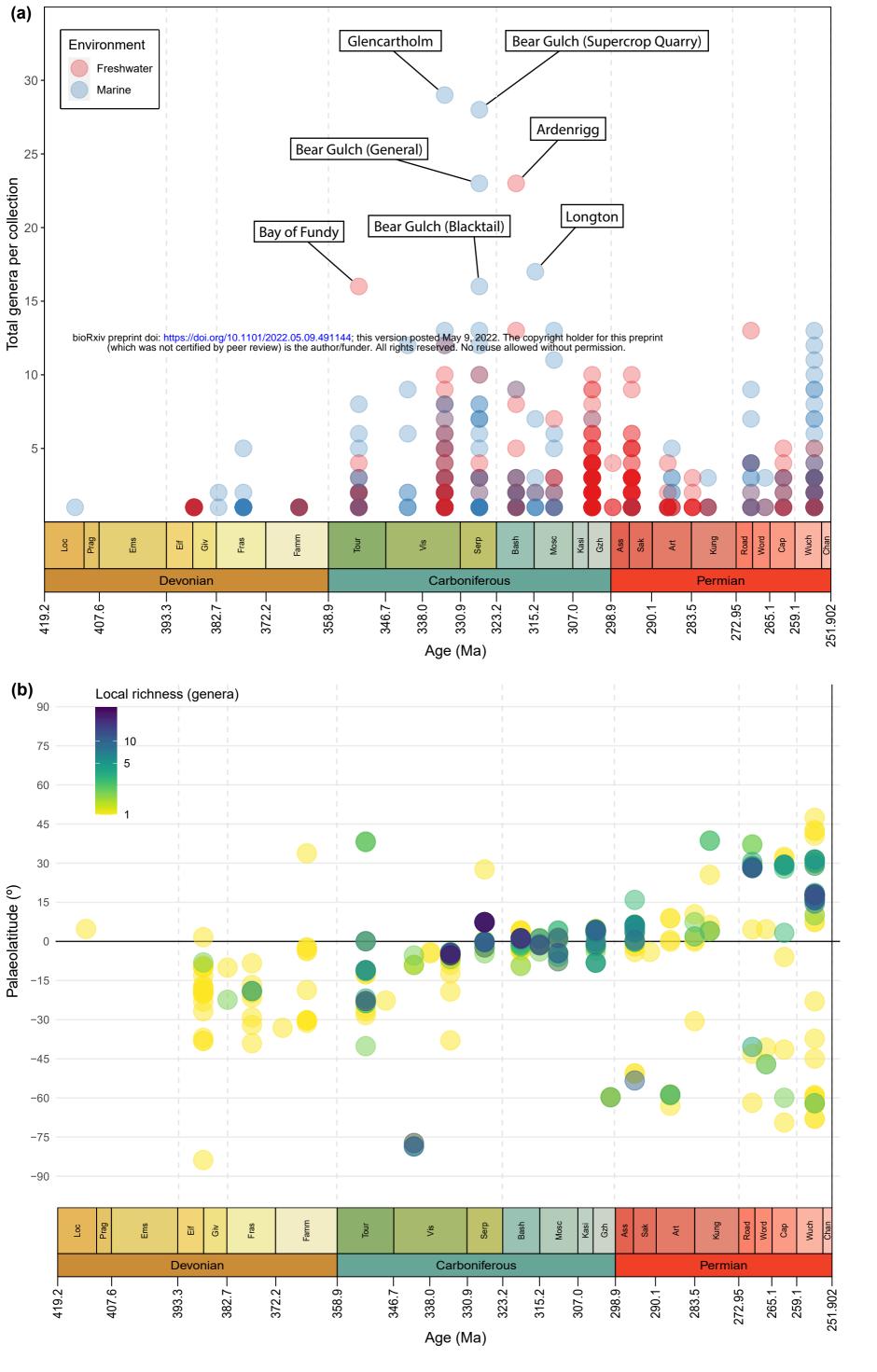
650 measures, points are observed data and dotted lines are extrapolated estimates.

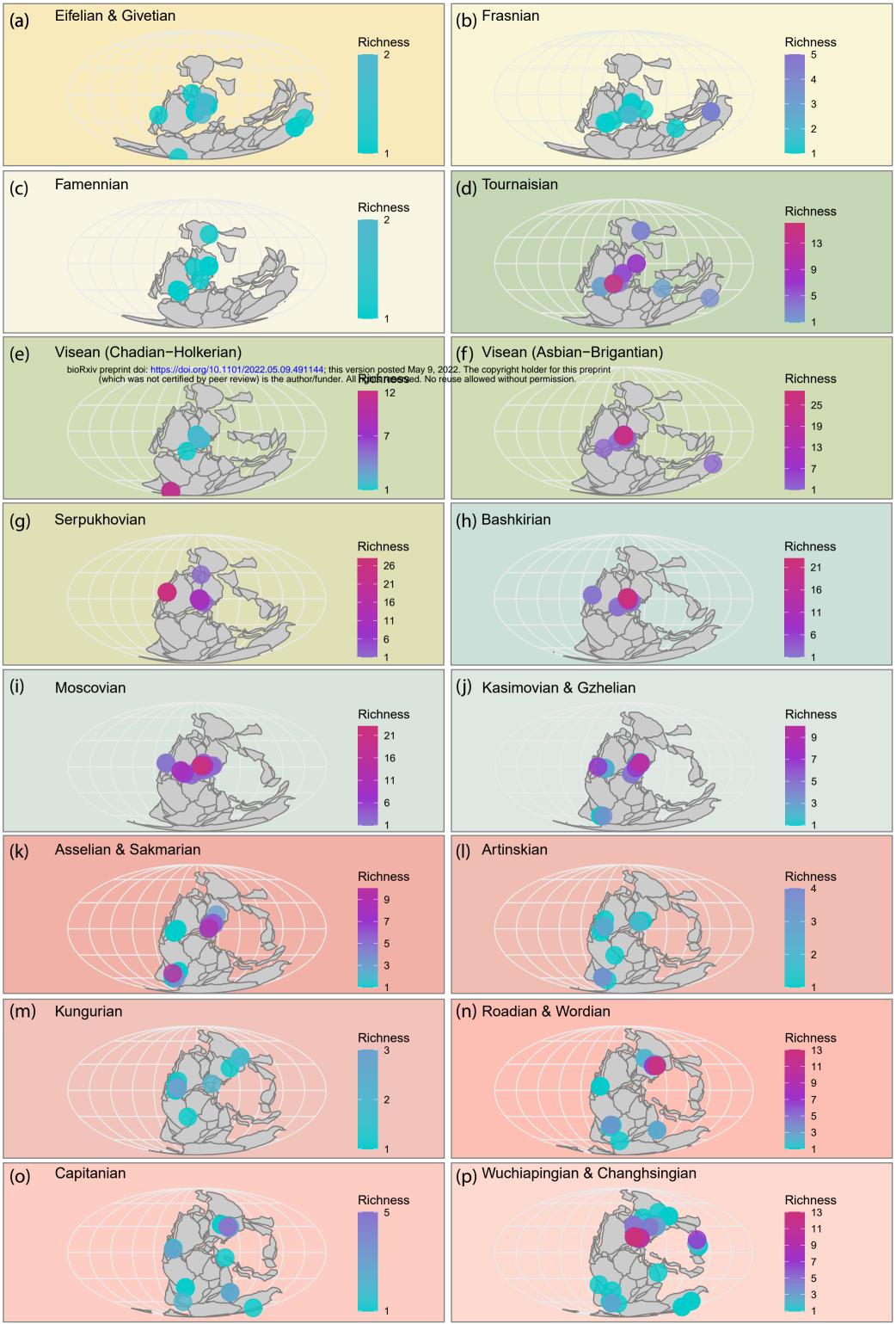
651 Carboniferous intervals are in green and Permian intervals are in red according to the ICS652 colours.

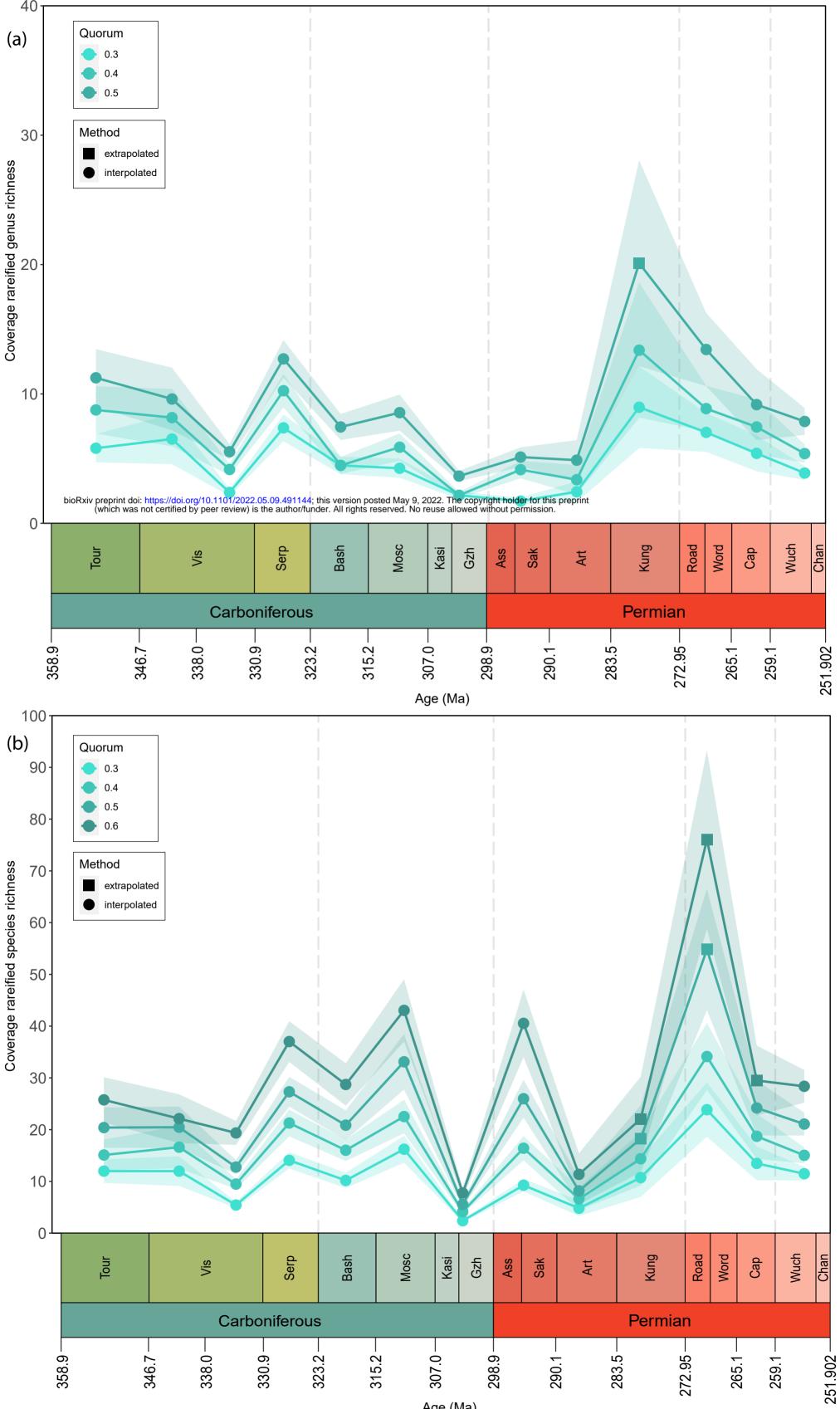
653 Figure S4 – Estimates of Carboniferous and Permian actinopterygian diversity using size-

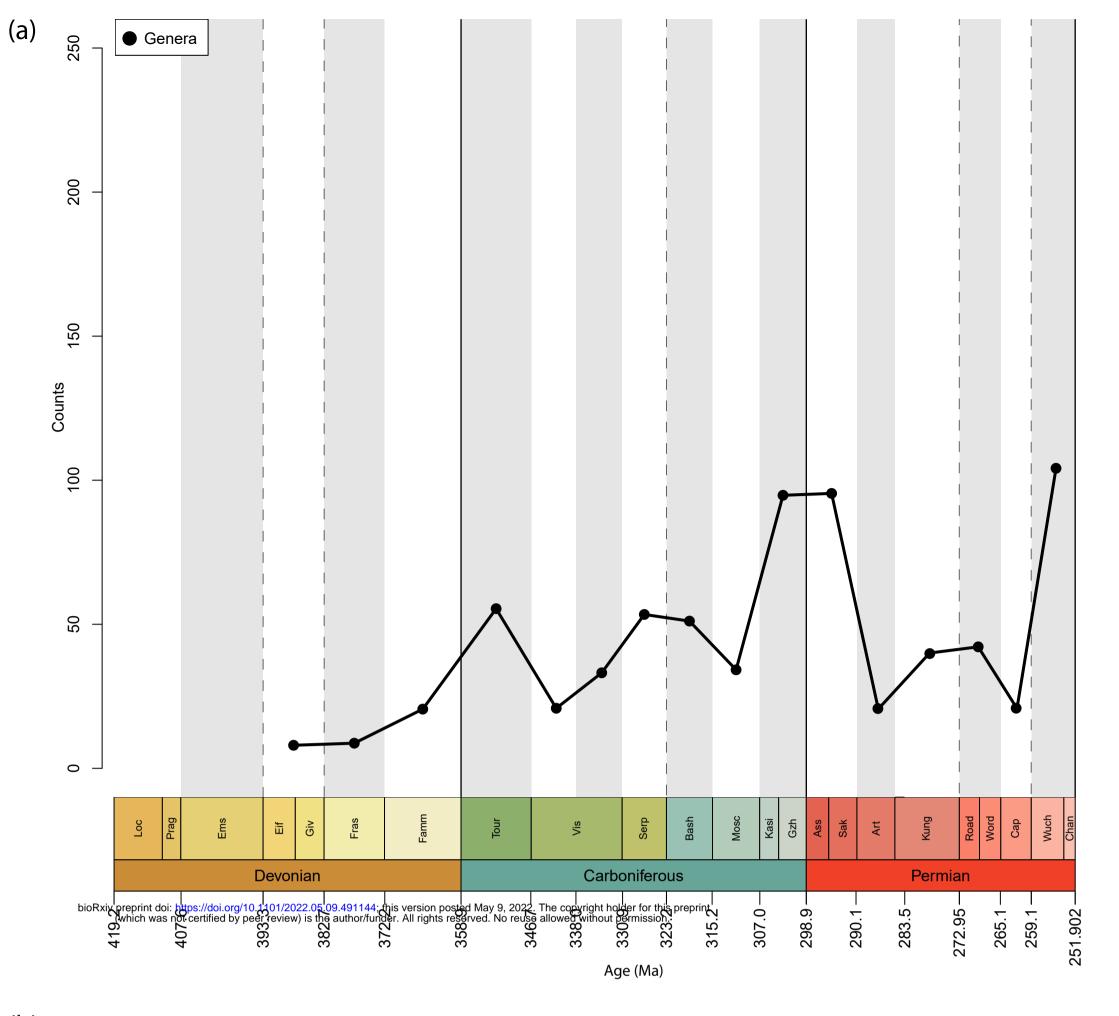
based (classical) rarefaction of (a) occurrences of genera and (b) occurrences of species,

showing estimates for different sample sizes.









(b)

Species 250

