

1 **A dire need for better standards of data quality, transparency, and reproducibility in**
2 **IUCN RedList assessments**

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11 **Abstract**

12 The IUCN RedList is the most extensive source of information on the global extinction risk
13 including over 157000 species. The sheer scale of this initiative presents challenges in data
14 standards and reporting, especially given that legacy issues may reduce accuracy. Here, we
15 assess the bibliographic underpinnings of RedList assessments for five taxa with fairly
16 complete assessments (four terrestrial vertebrate and one invertebrate group, including 41647
17 species). We assess the number of publications referenced, their age, their specificity, and use
18 of primary data. Body-size and popularity are then explored as potential drivers of
19 bibliographic trends. Disturbingly, many references are old and general (especially in smaller
20 and less popular taxa), with many lacking specific references (e.g., only 1.3% of Odonata
21 species have species-specific references). Public data are virtually never mentioned (GBIF is
22 cited once in Odonata and Reptiles) and private databases are often cited. Furthermore, the use
23 of data for mapping of species remains completely opaque. Better methods and standards are
24 urgently needed for data inclusion, wider participation, mapping, and data citation if the
25 RedList is to fulfil its remit.

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27

28 **Introduction**

29 We face staggering ongoing losses of global biodiversity and our conservation actions can only
30 be as good as the data informing them (Isbell et al., 2023; Jaureguiberry et al., 2022). Since
31 1964, the International Union for the Conservation of Nature (IUCN) RedList has become the
32 major tool for assessment for extinction risk assessments, and is now the basis for prioritisation
33 worldwide (Palacio et al., 2023). In fact, the IUCN RedList provides the only species-level
34 indicator within the Kunming-Montreal Global Biodiversity framework (Hughes & Grumbine
35 2023). The IUCN has undoubtedly provided a useful tool for assessments (Betts et al. 2020),
36 and nurtured networks of specialists around certain taxa (eg. State of the World's Amphibians:
37 The Second Global Amphibian Assessment). However, it has also been recognised that the
38 RedList assessments often fall far short of what is needed, and can hamper conservation efforts
39 if used uncritically for conservation prioritizations (Palacio et al., 2023). The methods and
40 consistency of the RedList species maps have previously been assessed (Hughes et al., 2021a),
41 and shortfalls in inclusivity and representativeness (Hughes et al., 2021b), with consequences
42 for the accuracy of species assessments (Palacio et al. 2021). However, there have been no
43 assessments of the reproducibility of approaches, the standardisation of assessments, or the
44 traceability of information used. Not only is this problematic from a scientific standpoint, it
45 can also propagate errors across assessments if overly reliant on prior erroneous information,
46 especially when the origins or age of such information are untraceable.

47 Whilst it is understandable that information for many species assessments comes from experts
48 within specialist groups, a lack of documentation of such information impedes traceability,
49 precludes assessments of uncertainty and timeliness, and dramatically limits comparability
50 between assessments for different taxa or regions. FAIR data-standards now exist to ensure
51 that data are findable, accessible, interoperable and reusable (Wilkinson et al., 2016), and yet
52 interoperability is dependent on consistently applied standards. This is important, as whilst
53 unpublished expert insights may be invaluable, tracing their contributions is just as important
54 as it is for peer-reviewed publications, enabling greater transparency, facilitating material
55 updates, and providing clear metadata that ultimately enhances the standards and quality of
56 information included within the RedList and downstream research.

57 Here, we explore the bibliographic data underlying IUCN RedList assessments, exploring how
58 many publications are cited for each species, when these resources were published (to assess
59 how updated they may be), their specificity, and how the number of references varies within

60 and between orders based on taxonomy, body size, and popularity. We expected that larger and
61 more popular taxa would be better studied, while smaller and less popular groups would be
62 more poorly documented in assessments, but that these relationships may vary within different
63 orders where overall “popularity” is low. We also wanted to determine the empirical
64 underpinning of distribution data and other data-sources used within assessments, such as the
65 use of data from GBIF. Following from this assessment, we make recommendations for better
66 standardizing IUCN RedList assessments, to ensure their transparency, reproducibility, and
67 accuracy. Following these new standards would ensure not only the accuracy and reliability of
68 RedList assessments, but also the representativeness of the hundreds of publications leveraging
69 the results of these assessments for global scientific and policy purposes.

70 **Methods**

71 IUCN documentation was first downloaded as JSON format (Supplemental code 1). For counts
72 per time-period we removed references referring to former RedList assessments, and then
73 calculated the number of references before 1990, between 1990-2000, from 2001-2010, and
74 post-2010. Analysis was then conducted to explore, between and within each taxon, how the
75 number of references used varied per species. Overall patterns were determined as well as their
76 relationships to body-mass and popularity within and between orders and families (see below).

77 As larger species are often assumed to be more charismatic, and therefore have more research
78 (Tensen 2018), we assessed if there was a relationship between body-weight and mean
79 publications within birds and mammals. For body-mass data, various sources were combined
80 to determine the mean mass for each taxonomic grouping examined (Myhrvold et al., 2015;
81 MammalBase, 2023; Soria et al., 2021; Wilman et al 2014; Jones et al., 2009). Genus was the
82 highest level for which an average was calculated as weights were not available for all species,
83 (especially for diverse but small-bodied taxa such as bats, rodents, and insectivores as well as
84 various passerine birds).

85 To assess popularity, we used Google Trends and assessed the level of online attention each
86 order within each class had received globally throughout 2023 based on averaging weekly data
87 which uses global search history for the common-names (<https://trends.google.com/trends/>).
88 To do this, we used common-names (excluding pets (cats, dogs, rabbits), livestock, pests),
89 ensuring the search recognised them as an animal rather than a general search-term; all
90 keywords are available in Table S1. First, we determined which were the most popular groups

91 to provide a comparator, as scores are calculated relative to the most popular term within a
92 search. In mammals, elephants were the most popular, so this was retained in all mammal
93 searches, likewise penguins were used in all bird searches. We used the common-names of
94 most families within the groups (see Table S1), downloaded the scores as CSVs, then merged
95 all scores and calculated the mean and standard deviation within each score then assessed the
96 relationship with the mean number of references via regression.

97 We also assessed the mean number of publications per species, per realm for each order. We
98 downloaded all species assessments in XLSX format from the RedList website, connected them
99 by species name within R (R Core Team, 2024), then calculated the mean and total number of
100 publications per species within each realm (using WWF 2017 realms). We ran analysis both
101 for all species, and then for only species found within a single realm, as interpreting outcomes
102 may be challenging, so only species found within a single realm were included. The average
103 numbers were then tabulated to calculate how the averages may vary within orders between
104 different realms.

105 In addition, we tabulated the exact references for each species to assess the total number of
106 references included in each class (Supplemental Code 2). The total number of references was
107 calculated for each class once duplicates were cleaned and removed, which was a very
108 challenging process as the IUCN does not standardise reference formatting thus DOIs had to
109 be found to ensure references were not counted multiple times (Supplemental Code 3). We then
110 used the “=ISNUMBER(SEARCH(” with a substring of the referenced genus to determine if
111 the genus was noted within each reference for each genus, then calculated overall coverage
112 levels. For many “charismatic” mammals, common-names were often used rather than Latin
113 names, thus this process was repeated with common-names for large primates (Apes) and
114 carnivores, as a check for this specific phenomenon. From de-duplicated references we collates
115 the use of certain key terms including the number of GBIF references, listings of use of major
116 data repositories (birdlife, ebird, reptileDB), the use of data from various ministries, and the
117 number of references from books. It was also noted on visual inspection that many assessments
118 had very general listings, such as books of regional faunas, or the IUCN assessment guidelines,
119 thus as a further metric of specificity we calculated how many assessments each reference had
120 appeared in, and averaged this for each taxa. Very high values would mean that the average
121 number of times references had been reused was very high, whereas low values indicated little
122 reuse.

123 **Results**

124 **Mammals:** Within the mammals, the number of publications per species varied from the
125 highest with a mean of 90.3 per species in Proboscidea (elephants, three species) to the lowest
126 in the rodents with 4.2 publications, followed by Didelphimorphia (American opossums) at
127 4.4, then 4.5 in Dermoptera (flying lemurs, two species; see supplemental data). Only 7/27
128 orders had more than 20 publications on average per species (generally larger taxa), whereas
129 16 had ten or less. When total publications per taxa was plotted relative to number of species,
130 the only orders (with >5 species) with disproportionately high numbers of publications were
131 Carnivora, Primates, and Artiodactyla (Figure 2a). At a family level in mammals, smaller-
132 bodied taxa seemed particularly under-studied, with the rat-kangaroos (Hypsiprymmodontidae)
133 and honey-possums (Tarsipedidae) averaging one paper per species, followed by bumblebee
134 bats (Craseonycteridae), feathertail gliders (Acrobatidae) and beavers (Myocastoridae) with
135 two. The most studied groups also frequently had a higher recent proportion, and very few pre-
136 1990 publications (Figure S1). When different time periods were considered, 78% of
137 publications for elephants were post-2000, whereas conversely 50% of publications were pre-
138 2000 for the flying lemurs (Figure 1a, Figure S1). When plotting mean number of publications
139 against body weight for all taxa under 1kg mean weight (Figure S3), there was an average of
140 under 6.9 publications per species, those between 1-5kg had under 9.3 (except primates, which
141 had 21), whereas larger taxa had far more, with a significant relationship between bodysize and
142 mean number of references (family: R^2 0.08666, $P < 0.0001$; Order R^2 0.6630, $P < 0.0001$).
143 Within mammals, there were more publications than other areas: in carnivores high-income
144 regions (Nearctic, Palearctic, Australia, as well as Antarctica), Palearctic for Perissodactyla.
145 The Nearctic realm had more publications than elsewhere for Lagomorpha, Eulipotyphla, and
146 Rodentia, showing that higher-income economies typically exhibited better taxonomic
147 coverages (Figure S2). Within mammals, the average popularity correlated very strongly with
148 the mean number of publications per species within each order (R^2 0.4414, $P < 0.0002$, Table
149 S1). We also assessed the mean number of species assessments each reference had appeared in
150 to provide a metric for reference reuse (and generality). Within mammals at an order level, this
151 varied from a mean of 10.84 assessments in Sirenians and 11.1 in elephants. To further
152 contextualise this, elephants had 207 of their 247 references only used in their assessments,
153 and only 8 appeared in over 10 assessments (Table S2). Similarly, for Sirenians 370 of the 391
154 references only appeared in a single species assessment, and only 12 references were used in
155 more than 10. Conversely the mean number of assessments each reference appeared in was 447

156 in rodents and 365.5 in Eulipotyphla. Patterns are stronger at the family level, ranging from 2.4
157 for the narwals (Monodontidae) and 2.6 in River dolphins (Platanistidae), to 879.8 in beavers
158 (Myocastoridae).

159 **Odonata:** Dragon- and damselflies were examined at a family-level as all fall within order
160 Odonata. Nine families had a mean of two publications per species, and only one
161 (Philogangidae) had more than 10 (11), with a further three having more than five of the 41
162 families considered (Figure S5). In total, 29.4% of references were from before 1990, whereas
163 22% were from post-2010, but this varied considerably by group, with 67% of data for some
164 families (e.g Rimanellidae) dating from before 1990, and four families having at least 40% of
165 references dated pre-1990 (Figure S4). In terms of regional differences, the Nearctic had far
166 more publications on average (9.6) than other regions (with the most in the Palearctic region at
167 5.1, and most other regions falling below 5 (Figure S6)). In terms of reference reuse, the
168 monotypic family Neopetaliidae had the least, with references used an average of 12 times,
169 followed by Rimanellidae at 19 times. At the other end of the spectrum are the damselflies of
170 Isostictidae, where references were reused in an average of 202 assessments (Table S2),
171 followed by Lestoideidae damselflies at 190, also notably both these groups are Australasian.
172 Overall, the average level of reuse was 126 assessments per reference.

173 **Birds:** The penguins (Sphenisciformes) were dramatically better documented than any other
174 group, averaging 41.3 references per species, with 14 in the next-best Phoenicopteriformes
175 (Flamingos) and Otidiformes (Bustards) (Figure 2b, Figure S7). At the other end of the
176 spectrum, some smaller orders averaged only one publication per species, including the
177 Seriemas (Cariamiformes), Mousebirds (Coliiformes), Cuckoo-rollers (Leptosomiformes), and
178 Hoatzins (Opisthocomiformes). At a family-level, 34 of the 247 families had a mean of only
179 one paper per species, most of which were small (and evolutionarily distinct) families, 11 of
180 which were monotypic. Penguins were also the group with the most recent references, at 51%
181 since 2010 (Figure 1b, Figure S8). Weight was a significant correlate of number of publications
182 at an order level (R^2 0.3631, $P < 0.0001$). However, this is largely due to low coverage of very
183 small species, and larger bodied groups did not necessarily have high coverage, for example
184 Struthioniformes (mean of 6.8 publications per species) despite large body size (possibly in
185 part because tinamous as the IUCN uses old taxonomy and includes four orders within
186 Struthioniformes (IOU 2024; Clements et al., 2023)) (Figure 2f). Clearly, other factors played
187 a much greater role in determining taxonomic coverage. There were also geographic patterns

188 in the average numbers of publications within various orders, with developed economies
189 having many more publications for three widespread orders than in the rest of their range.
190 Seven orders had more in the palearctic, with up to 66 publications in the Otidiformes
191 (Bustards) (Figure S9). Popularity was also a significant correlate of the mean number of
192 publications per species (R^2 0.2423, $P < 0.0023$, Figure 2c; Table S1).

193 Reference reuse in birds varied from a mean of 4130 in the Opisthocomiformes (Hoatzins), this
194 alarmingly high number is because the one species only has two references (Table S2), one of
195 which is the IUCN 2016 guidelines, and the other a generic text on Neotropical birds from
196 1996; both of which are used across thousands of assessments. Unsurprisingly, once again the
197 penguins were the best served with a mean of 71.5 (highly cited IUCN guidelines appeared in
198 virtually all assessments). For example, the Penguins had 582 references only cited in a single
199 assessment, 75 used in between 2-10 assessments, and only 13 with more than 10. Patterns at
200 a family level showed similar trends, with five families equally poorly documented as Hoatzins,
201 all with identical references. Conversely, birds like the Stitchbird (Notiomystidae) (*Notiomystis*
202 *cincta*) have the least reuse, averaging 19.2. These families, such as Australian shrubbirds
203 (Atrichornithidae) and the New Zealand Stitchbird were also some of best studied with 25.5
204 publications and 24 publications each per species, and most references not used in other
205 assessments (35/55 and 20/24 unique).

206 **Reptiles:** Crocodylia had exponentially more documented research than any other group,
207 averaging 62 publications per species, relative to only 15 in Testudines, nine in
208 Rhynchocephalia, and only four in Squamata (Figure 1c, Figure S11). At a family level within
209 reptiles, the elapoid snakes (Pseudoxyrhopiidae) were the least well studied, with only 1.8
210 publications per species, followed by Alopoglossidae lizards at 2.05. At the other end of the
211 spectrum were the Gharials (Gavialidae) with 151 publications, followed by Cheloniidae
212 tortoises at 133. In total five families (2 Testudine and 3 Crocodylia) averaged over 50
213 publications per species, whereas 78 had ten or less (of the 95 total families). For most groups,
214 around 20% of references were from before 1990, though there were differences in the most
215 recent publications varying from 34% of publications in Crocodylia data coming from post-
216 2010 to only 22% in Rhynchocephalia (Figure 1c, S13). In Squamata, Nearctic species and
217 Palearctic species (8 and 10 publications per species, respectively) had more than the rest of
218 their ranges (4-5 publications). In Testudines, Afrotropical was the best represented (15
219 publications), followed by the Nearctic (14), with Australasian (9.5) and Palearctic (8.2) the

220 least represented. Crocodylia were well-studied across their ranges, but the highest level was
221 in the Neotropics (75) followed by the IndoMalaysian realm (64) (Figure S12). The impact of
222 mass was not assessed due to the small number of orders and clear phylogenetic differences in
223 level of study. Squamata was the most popular but the least well-studied (but varied between
224 families), whereas Tuataras were the least popular and the second-worst studied, and
225 Testudines were the second-most popular and second-best studied (Table S1). Reference reuse
226 echoed other trends, with Squamata showing the most reuse at 145 assessments per reference
227 to 8.3 in the case of Crocodylia (Table S2). At a family level, the disparity unsurprisingly
228 grows, varying from 335 in the worm lizards (Cadeidae) down to only 4.5 in the leatherback
229 turtles (Dermochelyidae).

230 **Amphibians:** Amphibians comprise three orders, with Caudata having more publications on
231 average (10.5 per species; Figure S14), but approximately half of publications for all three
232 groups fell after 2000 (for Caudata, 29% of all references are post-2010, 26.7% for Anura, but
233 only 20.7% for Gymnophiona) (Figure 1d, Figure S14). At a family-level, there were also very
234 different patterns across groups; Odontobatrachidae was the least studied with only two
235 publications on average per species, ranging to a mean of 37 in Pelobatidae followed by 36.5
236 in Cryptobranchidae (Giant Salamanders). However, of the 77 orders, only seven averaged
237 over 20 publications per species. Whilst most groups have under 50% of publications from pre-
238 1990, Conrauidae had 54.4%, and Sooglossidae has 52. Within each order, high-income
239 economies had more publications on average within most groups (Figure S15). The impact of
240 mass was not assessed due to the small number of orders and clear phylogenetic differences in
241 level of study. No relationship between number of publications and popularity was found in
242 amphibians, though Caecilians (Gymnophiona) was lowest for both mean number of
243 publications and popularity (Table S1), Anura was the most popular group, but Caudata was
244 better studied (possibly due to high levels of research in the Nearctic). For Amphibians
245 reference reuse at an order level varied less than for other groups, ranging from a maximum of
246 190.6 in Gymnophiona to 112.6 in Caudata (Table S2). Like the worm lizards in the case of
247 reptiles, the least specific references in amphibians were in the Indian caecilians (Chikilidae)
248 at 390.6, to the Seychelles frogs (Sooglossidae) at only 9.2.

249 **Trends between groups**

250 Analysis of unique references highlighted the lack of standardisation between specialist groups,
251 with certain taxa relying more on overarching references (most references were used multiple

252 times, in Odonata unique references represent 15% of total use, followed by 26% in
253 Amphibians, 29% in both reptiles and birds) and the least reuse in mammals at 48% retention
254 (Table S3). The level of older references was similar, with 39% of Odonata references coming
255 from before 1990, whereas in birds only 7.3% were pre-1990 (mammals 18.9% Amphibians
256 20.2 and reptiles 23.4%). Amphibians, birds, and mammals showed a steady increase in the
257 total number of references for each successive period, whereas for Reptiles and Odonata the
258 numbers fluctuated and showed no overall trend. Looking at the overall number of references,
259 Odonata had the equivalent of under one unique reference per species (0.85), increasing to 1.71
260 in birds, 2 in reptiles, 2.38 in amphibians, and 5.73 in mammals.

261 Breaking this down further, the sources of references also varied (Table S3). Mammal
262 assessments cited the greatest number of former IUCN assessments (1043), whereas Odonata
263 had the least at 23. Data from various ministries were also used in some assessments, with over
264 332 referencing ministries in mammals, 169 in reptiles, 141 in birds and 142 in Amphibians,
265 yet only 25 in Odonata. Specialist websites were also used, like Amphibiaweb (167 for
266 Amphibians), ReptileDB and the Australian Reptile Database (203 for Reptiles), and eBird for
267 birds (221). BirdLife data were also used for all groups, but surprisingly GBIF data were almost
268 never referenced, with some references ironically only citing the GBIF citation guidance rather
269 than sourceable DOIs. In total, Odonata referenced GBIF once, reptiles once, reptiles 8 times,
270 amphibians 10 times, and birds 326 times. In addition, books and reports were frequently used,
271 with upto 1903 used for mammals. However, private and personal databases were frequently
272 used with 342 separate private sources in mammals, and whilst there were less different private
273 sources in Odonata (58), there were 592 citations of them overall; highlighting that these
274 private sources are the main source of information for these species.

275 Obviously, a specialised reference is likely to contain much more assessment information than
276 a short general description within a generalist review, or encyclopaedia of mammals or birds
277 of a region (Table S4); thus assessing both specificity and reuse helps understand how much
278 detailed information likely went into each review. The level of specificity also varied, based
279 on the number of reference titles directly listing the species being assessed (Supplemental Data
280 3). Odonata had the lowest level of specificity, with only 0.3% stating the genus, this was
281 followed by birds (15%), reptiles (20.5%), Amphibians (21.5%), and then mammals (24.5%).
282 In addition, the number of genera not explicitly referenced varied between classes. At the
283 highest, 94.3% of genera and 98.7% of species were never explicitly noted in the reference title

284 in in Odonata, and 54% of genera and 75% of species in birds. On the other end of the spectrum,
285 only 16% of genera and 30% of species were never referenced in titles in amphibians, similarly
286 20% genera and 29% of species for mammals, and in reptiles (31%, and 37%, respectively).
287 However, for mammals, the level of coverage was actually considerably better than the
288 scientific names alone show in terms of the number of references citing the specific species
289 under assessment (Table S4), as common names were used rather than Latin names for many
290 “charismatic” species. For example, for the Pandas and red panda only 24% of its references
291 used the Latin name, but a remarkable 80% referenced the common-name. Similar trends
292 existed across carnivores, and primates, where about 30% of references listed the species name,
293 and 60-85% the common name (Table S4). Mammal referencing was particularly good for
294 large-bodied taxa, but smaller-bodied taxa assessments were dominated by more general
295 references.

296 **Discussion**

297 The IUCN RedList has been developed to facilitate the assessment of extinction risk to enable
298 successful management intervention and policy. Clearly, the accuracy and timeliness of
299 assessments is crucial for their effective use and interpretation, and yet here we find a lack of
300 transparency in data use, and the “popularity” of most groups is the best indicator of the level
301 of detail in species assessments. The importance of reproducibility and traceability within
302 science has been recognised in recent years, and yet the RedList clearly lags, especially when
303 it comes to the approaches used for mapping species (which is a key part of assessments), and
304 ironically assessing threats. For example, whilst GBIF is mentioned in the useful external links
305 on the RedList website, virtually no species assessments cite the DOIs in their repositories (a
306 total of ten links for mammals, reptiles, Odonata, and amphibians combined, with more
307 frequent use in birds). Thus, if species distribution data are used in maps, those data are
308 untraceable, consistent with a study showing that nearly 50% (25–46%) of species points fall
309 outside their expert-designated ranges (Hughes et al., 2021a; Li et al., 2019) and that the overall
310 accuracy of these maps is consistently lower than in data-driven approaches (Palacio et al.
311 2021). Furthermore, whilst recent publications stated that IUCN maps were consistent with
312 data-driven approaches (Aronsson et al., 2024), this is not in fact the case as such publications
313 failed to reflect landcover (and habitat is a major driver of species distributions), used a coarse
314 resolution, and failed to account for bias in distribution data (Hughes et al., *In Press*).
315 Accounting for biases in point-based data or modelling of ranges is critical to obtain

316 informative and accurate range data, and in any instance, clear citations of data-sources is
317 crucial to assess data uncertainty and provide transparency needed to utilise data outputs, and
318 analysis consistently shows major inaccuracies in IUCN mapped ranges, likely as a
319 consequence of variable use of primary data.

320 Furthermore, private databases are cited in some cases (58 for Odonata, cited over 300 times),
321 inhibiting replicability or assessment of representativeness. This is problematic, as key data are
322 likely being ignored as there is no mechanism to add and cite such data, and conversely
323 inaccurate data within assessments is hard to flag by those outside the specialist group. Again,
324 although expert opinion can be invaluable, the role of empirical data relative to expert
325 knowledge must be clear. As IUCN RedList data are frequently used for mapping conservation
326 priorities, understanding their limits is critical, as current approaches have led to
327 inconsistencies between specialist groups and the frequent use of political barriers to delimit
328 species ranges (especially between regions which may not collaborate extensively, such as
329 China and Southeast Asia), hindering the added value of these maps for developing spatial
330 priorities and targets. Clearly the underlying data of IUCN RedList assessments should follow
331 the FAIR principles (Findable, Accessible, Interoperable, Reusable) whereas at present much
332 data for assessment, and virtually all data for mapping species ranges falls outside these criteria
333 (Dunning et al., 2017).

334 Families and orders perceived as more charismatic and popular (large mammals, penguins),
335 typically had more publications, more recent publications, and often higher levels of specificity
336 within publications. Species coverage was higher for larger and more charismatic groups, and
337 reference reuse was far lower. Alarming for some groups, the entire bibliography was
338 sometimes limited to small numbers of generic references, and no information on where any
339 species-specific information may have originated from. Levels of research vary several orders
340 of magnitude within groups, with species such as elephants, penguins, and gharials including
341 many more publications than any other families within their classes, and mammals having
342 many more publications per species than any other group. In attempts to justify the greater
343 attention on larger species ascertainment is sometimes made that “larger species are evolutionarily
344 distinctive”. Yet many other evolutionarily distinctive and monotypic groups (e.g.,
345 Dermoptera) at least as evolutionarily distinctive than the best-studied taxa, where there are
346 upto 23x more publications per species (e.g., elephants). Similar patterns are present in other
347 groups; many of the least studied bird, reptile and amphibian families are monotypic, thus,

348 more attention is clearly needed for overlooked taxa, and distinctiveness is obviously not a
349 good argument for the observed disparities in attention. This underscores the subjectivity of
350 prioritisation approaches, where despite the frequent assertions in defence of the amount of
351 attention some species receive, these are not supported by more comprehensive or objective
352 analysis. As popularity, rather than threat or evolutionary distinctiveness, is most associated
353 with the level of knowledge and effort in assessment, efforts are needed to counteract this.
354 Furthermore, many taxa are much better studied in higher-income parts of their ranges than in
355 developing economies. Evidently, more work is needed to upgrade assessments of neglected
356 taxa and regions. Our results demonstrate an urgent need to counterbalance biases, and
357 highlight that the major NGOs such as WWF that often fund IUCN specialist groups should
358 reallocate resources to ensure that all taxa get an adequate level of attention irrespective of their
359 wider popularity.

360 Here, we show that not only are major gaps in standardisation and transparency across
361 assessments, but that popularity and region where taxa reside are primary drivers of data
362 availability, and the degree of “specificity” of citations in many taxa. Furthermore, the IUCN
363 RedList purports to detail threats to species, but the resources used are of variable value. Many
364 references are old, general, or focus on species taxonomy rather than evaluating threat, and for
365 the majority of taxa there are not references that would enable population-level assessments.
366 Clearly, efforts are urgently needed to overcome these biases, and to develop more standardised
367 and temporally explicit data across taxa. Furthermore, the overreliance on statements from
368 experts, with no meta-data on what information is sourced from where or when, makes it
369 impossible to gauge the accuracy or uncertainty in assessments. These issues are compounded
370 by the reuse of prior IUCN assessments, as any inaccurate information likely remains in place,
371 and for most species it is impossible to trace and assess if assessments are still (or ever were)
372 accurate reflections of species threats or distribution.

373 Whilst the IUCN has come a tremendous way since it began to develop and share species
374 assessments, since the initiative started in 1964, data availability has increased exponentially,
375 and it is time for updated processes that reflect new techniques, leverage new data, and clearly
376 share it based on FAIR standards, all enabling more effective and appropriate use.

377 **Recommendations**

378 The IUCN serves a pivotal role in global conservation prioritisation, and recognising elements
379 that are not in line with current approaches is essential for the effective fulfilment of this role.
380 The use of empirical data is crucial to assessing the veracity and timeliness of inputs, and thus
381 ensuring data is traceable and reliable, as well as timely is essential if the IUCN RedList is to
382 genuinely enable it to provide the data needed to monitor biodiversity and develop priorities.

383 Accurate data are key to accurate mapping and assessment, yet we see virtually no evidence
384 that GBIF data are used for mapping species ranges, with virtually no datasets cited (with the
385 partial exception of birds). This is especially concerning, as in addition to the AOO and EOO
386 maps used within species extinction risk assessments, each assessment must generally include
387 a more detailed map of the species range. Maps created as part of assessments must be based
388 on the best available data and cite data DOIs to be reproducible (possibly via models which
389 could then be checked and annotated by experts to ensure they accurately capture species
390 ranges, without artifacts such as political borders Hughes et al 2021a).

391 How data are used and recorded should be standardized, including not just pipelines but also
392 even reference formatting. Automating a system of reference input, as most journals do today,
393 could both enable clearer referencing standards and reduce effort. Similarly, some groups used
394 private databases, and these should clearly be made transparent, and data made available to
395 enable clear and accurate mapping of species ranges, while also enabling validations. Increased
396 data availability for poorly-known groups, could enable the automation of assessments (and
397 validation; Orr et al 2022), and identification of gaps, enhancing the ability to assess neglected
398 groups and identifying areas where work is most urgently needed.

399 Whilst there will inevitably be resistance to updating IUCNs approaches to RedListing, all
400 methods must evolve to reflect new data and technologies. We suggest that with new
401 guidelines, trainings could be developed to streamline the process of standardisation, enhanced
402 approaches of mapping (such as the use of species distribution models), and details of meta-
403 data recording to provide the necessary transparency, and that these approaches could be
404 included as species assessments are updated. As versions of the IUCN guidelines are also dated,
405 noting which assessments reflect the new guidelines would also be simple as assessments are
406 progressively updated, enabling the evolution of IUCN approaches to provide the dynamism
407 needed to accurately assess threats and map species ranges across all scales. By making
408 assessments fully versionable, biases and gaps could be better accounted for.

409 We also recognise that there is a lack of transparency on how assessments are conducted, or
410 how to ensure expertise is adequately reflected within specialist groups. Thus, some groups
411 may be more academic, and others representing NGOs as well as having different balances of
412 national and international expertise. This is reflected in assessments, with some specialist
413 groups relying much more on assessments from ministries or governmental departments.
414 Groups like the penguin specialist group also have well maintained websites, and likely clear
415 mandates and guidelines that may underlie the good practices underlying their assessments.
416 More explicit best practice guidelines from successful specialist groups would enhance the
417 quality of data for less well-studied groups. Use of data from ministries varies from very high
418 levels in birds (especially USA) and amphibians (especially Japan) to lower levels for others.
419 This clearly relies on the work of small numbers of individuals within specialist groups, but by
420 standardising approaches and bettering information transfer between specialist groups, better
421 data could be accessed from more regions. Better tracking and interoperability could be
422 facilitated by a data submission portal, where experts could submit species-specific
423 information, with both observations and the source (either from literature or personal
424 observation). This would enable expert knowledge, for example species in trade, to be added
425 to RedList assessments, provide access to publications in local languages, and provide a means
426 of connecting people (particularly nationals of countries that lack UN languages) into specialist
427 groups. Furthermore, the potential accuracy and modes of validation could be verified,
428 providing another citable source of information directly feeding into assessments.

429 The RedList is expected to continue its role in providing a global index of species vulnerability
430 to extinction, so it should follow similar standards and expectations in data quality,
431 transparency and analysis to other forms of science. Outside experts should be readily able to
432 comment on assessments alongside data uploads, to input their updates and caveats, and such
433 information could also be noted through a centralised portal. Not only would this allow
434 identification and flagging of any misleading information, but it would also provide a
435 mechanism for detecting new threats, and likely a more accurate indicator of species threatened
436 by trade (or other specific threats), especially for specialist groups generally composed of
437 international academics (which may not observe such information). To make best use of the
438 RedList, to monitor trends in biodiversity, and appropriately allocate resources, it must reflect
439 the best knowledge in a traceable and open framework. Given that species assessments are
440 conducted periodically to assess changes in species statuses, we have the opportunity to then
441 update approaches to better reflect more diverse data, and to make the use of those data

442 transparently. Whilst it is almost guaranteed that there will be resistance to such initiatives by
443 some who feel it is too much work, the regular updates of assessments means a transition could
444 not only be simple, but is also urgently needed for the RedList to effectively fulfil its mandate.
445 By doing so, the RedList can provide a much more accurate and data-driven approach to
446 effectively monitor, target, and conserve species.

447

Box 1. Recommendations of updating RedList guidelines and standards.

- Provide better metadata, evidence from experts must be cited and dated to ensure data used can be accurately dated temporally. Versioned assessments should continue to be archived, with the versions of guidelines applied noted to enhance retroactive replicability of prior analyses and facilitate use.
- Species maps should be based on data-driven approaches such as modelling, data should be cited using a GBIF DOI for transparency and reproducibility. The only exceptions should be for species threatened by trade and justified.
- Cautious preliminary assessments should be automated for groups via methods such as machine or deep learning, to provide a basis for experts to build on.
- References should use a standard system and format for easy use, access and updating.
- Updated guidelines to liaise more effectively with government departments should be created to enable representative data to be accessed from all regions.
- A data submissions portal should be created for the submission of relevant data (with evidence) for observations of distribution, trade, etc., alongside flagging mechanisms for erroneous or incomplete assessments in need of updates.
- Better indices of population-level data should be added for assessments of population trends.
- These changes should be finessed by a taskforce then implemented with the reassessments of each species (as most species are assessed at least decadal).

448

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Figures

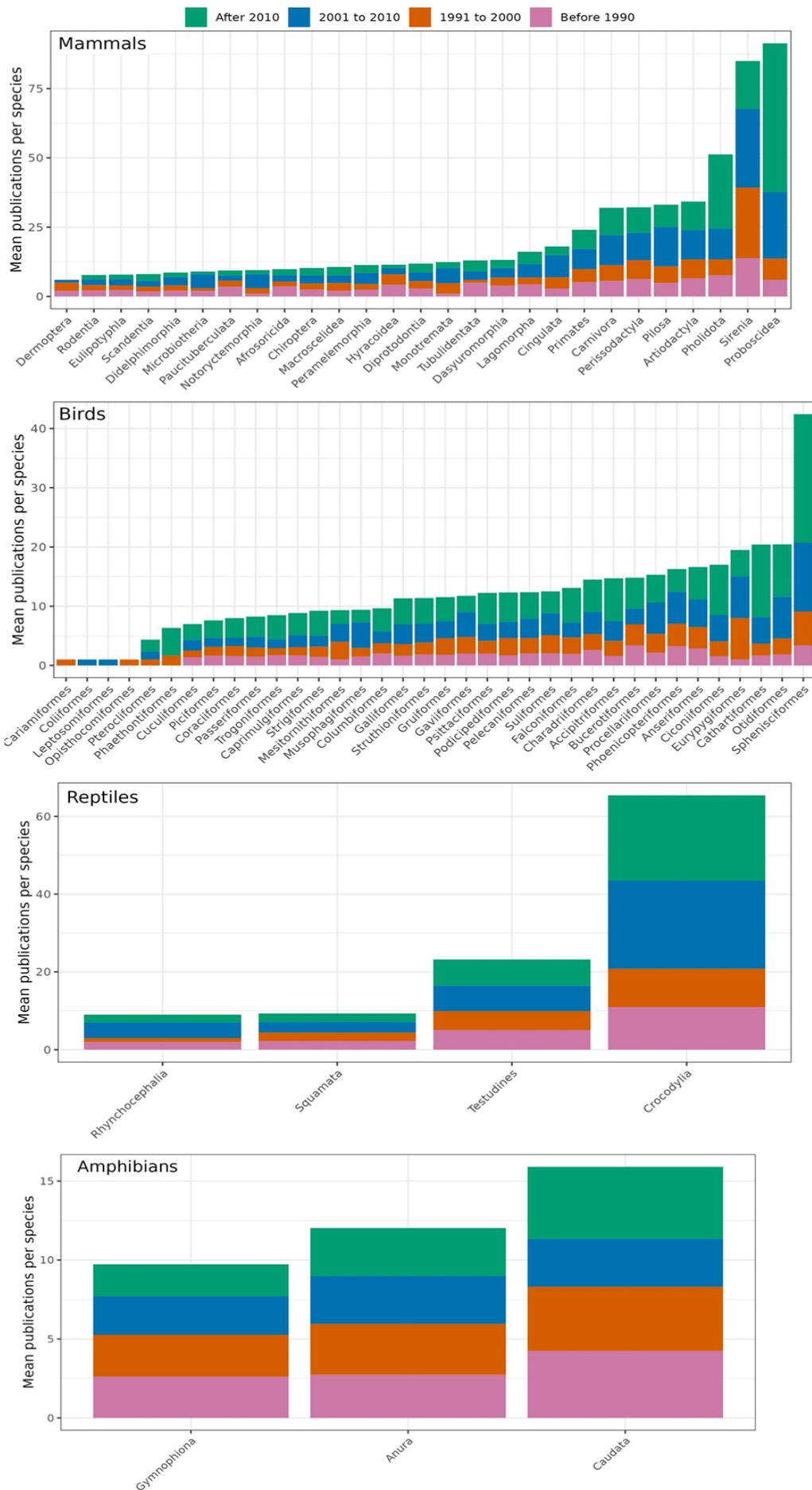


Figure 1. Mean number of publications per species per time period for all orders within each of the four vertebrate classes examined.

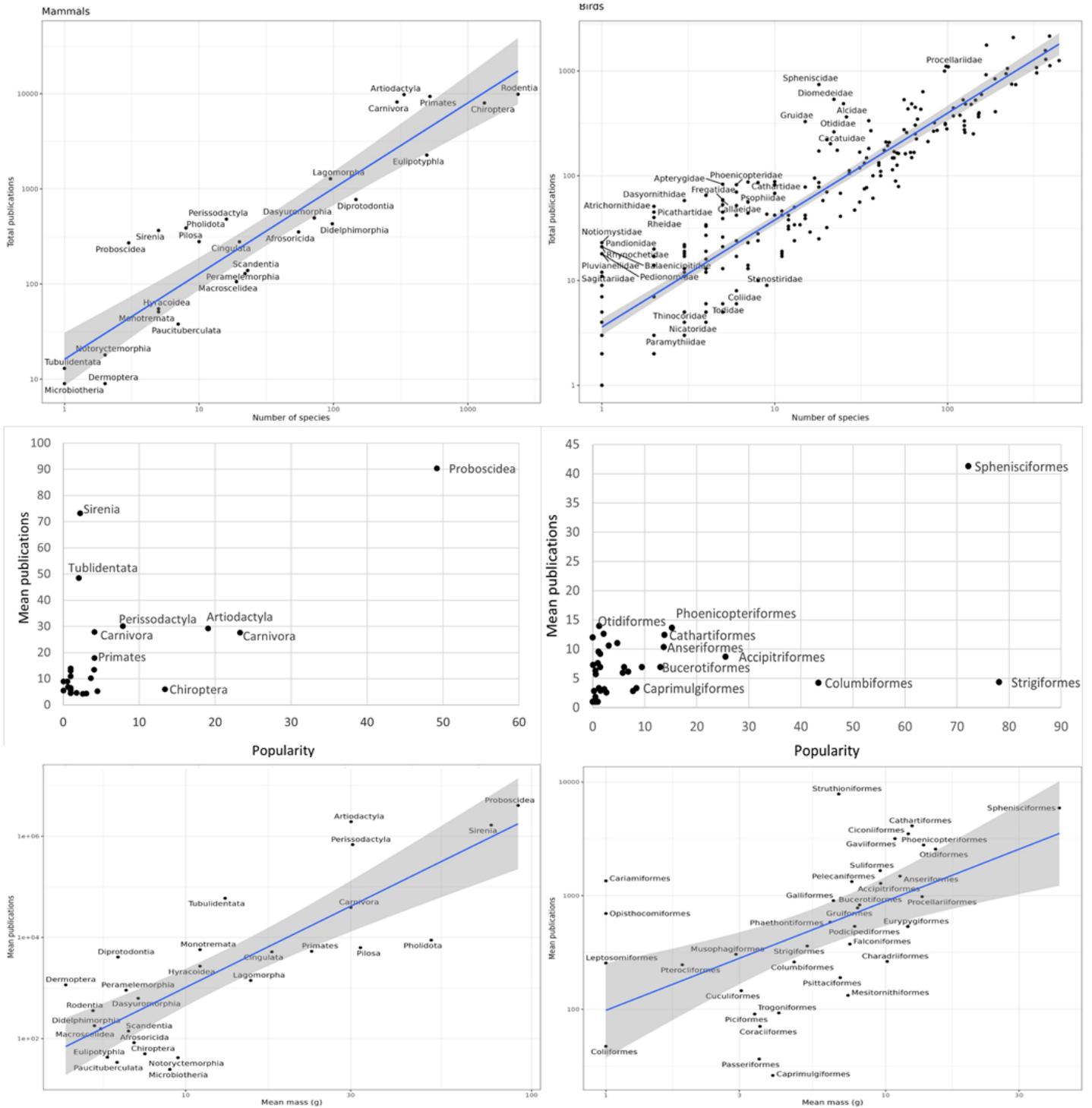


Figure 2. Trends between publications and various correlates for mammals and birds. A. Total publication number vs number of species for mammal orders. B. Total publication number vs number of species for bird families (family was given as trends were clearer in this case). C. Mean publication number vs popularity for mammal orders. D. Mean publication number vs popularity for bird orders. E. Mean publication number vs mean bodyweight for mammal orders. F. Mean publication number vs mean bodyweight for bird orders.

Supplements

Supplemental tables

Table S1. Mean popularity scores of each order based on googletrends analysis, and keywords for each taxa.

Table S2. Reuse of references within each of the five taxa, showing the mean number of assessments each reference appeared in for each order and family.

Table S3. Summary of general trends, and use of key datasets, such as private databases and GBIF data within each of the five groups.

Table S4. Specificity of each assessment, based on the number of species directly referenced within their associated references.

Supplemental Code

Supplemental Code 1:

https://github.com/qiaohj/Literatures_R/blob/master/IUCN_References/Prepare/IUCN_API.r.

Supplemental Code 2:

https://github.com/qiaohj/Literatures_R/blob/master/IUCN_References/Prepare/extract_references_from_json.r

Supplemental Code 3:

https://github.com/qiaohj/Literatures_R/blob/master/IUCN_References/Prepare/reference_similarity.r

Supplemental Data

All analysis associated with figures and supplemental figures.

Supplemental Figures

Figure S1. Mean number of publications per family per year in mammals.

Figure S2a. Mean number of publications per species for each order per region in mammals for species with distributions restricted to a single realm.

Figure S2b. Mean number of publications per species for each order per region in mammals for all species.

Figure S3. Mean number of publications vs mean mass (g) per group in mammals.

Figure S4. Mean number of publications per order per year in Odonata.

Figure S5. Number of species compared to number of publications per family in Odonata.

Figure S6a. Mean publication per species in Odonata per realm, for species with distributions restricted to a single realm.

Figure S6b. Mean publication per species in Odonata per realm, for all species.

Figure S7. Number of bird species relative to number of publications per order.

Figure S8. Mean publications per time period per family within birds.

Figure S9a. Mean publications per order per region for birds with distributions restricted to a single realm.

Figure S9b. Mean publications per order per region for all bird species.

Figure S10a. Total publications vs total number of species per order within reptiles.

Figure S10b. Total publications vs total number of species per family within reptiles.

Figure S11. Mean publications per period per family for reptiles.

Figure S12a. Mean publications per region per order for reptiles with distributions restricted to a single realm.

Figure S12b. Mean publications per region per order for all reptiles.

Figure S13a. Total publications vs total number of species per order for amphibians.

Figure S13b. Total publications vs total number of species per family for amphibians.

Figure S14. Mean publications per period per family for amphibians.

Figure S15a. Mean publications per region per order for amphibians for species with distributions restricted to a single realm.

Figure S15b. Mean publications per region per order for amphibians for all species.

Mammals

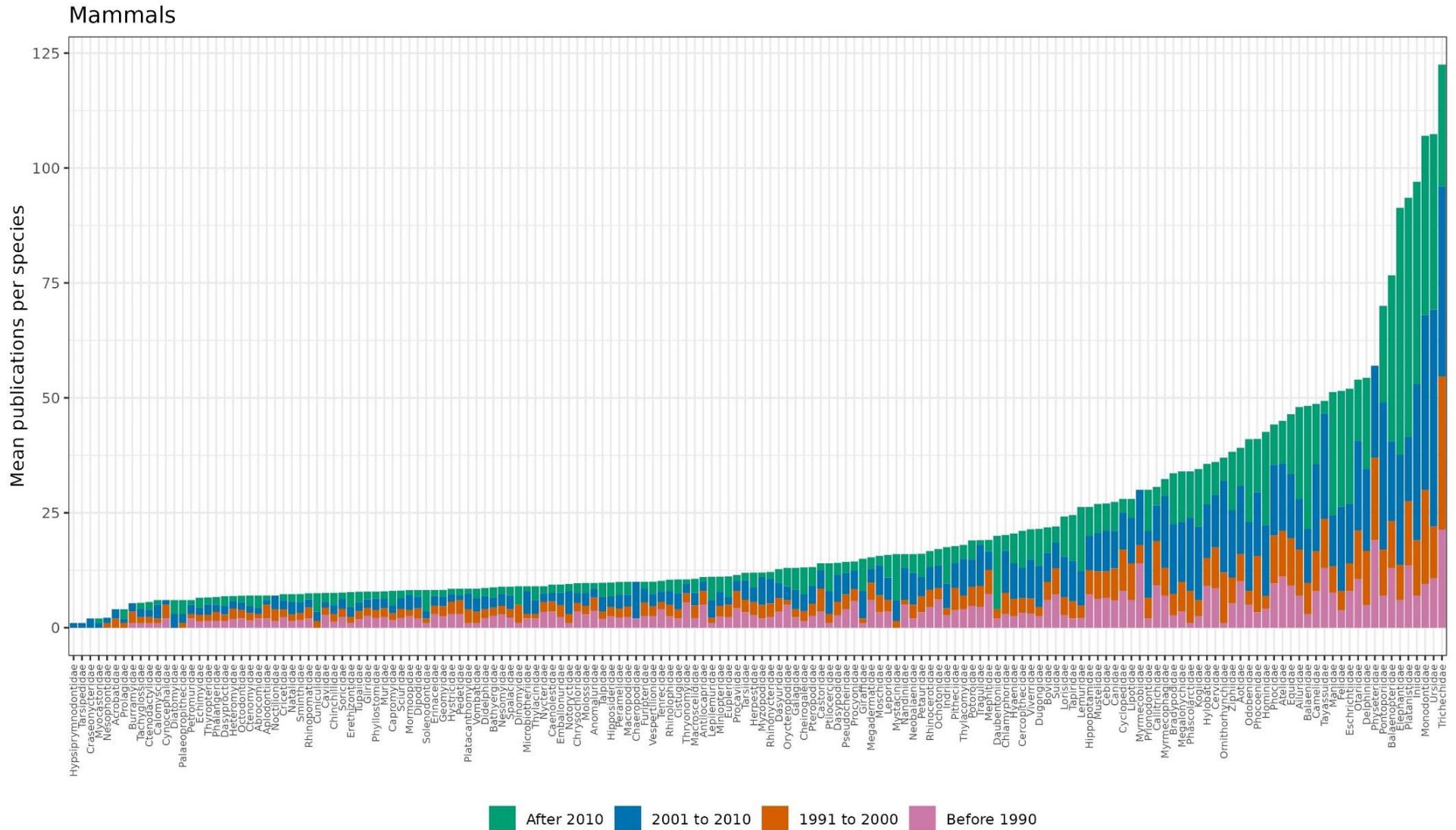


Figure S1. Mean number of publications per family per year in mammals.

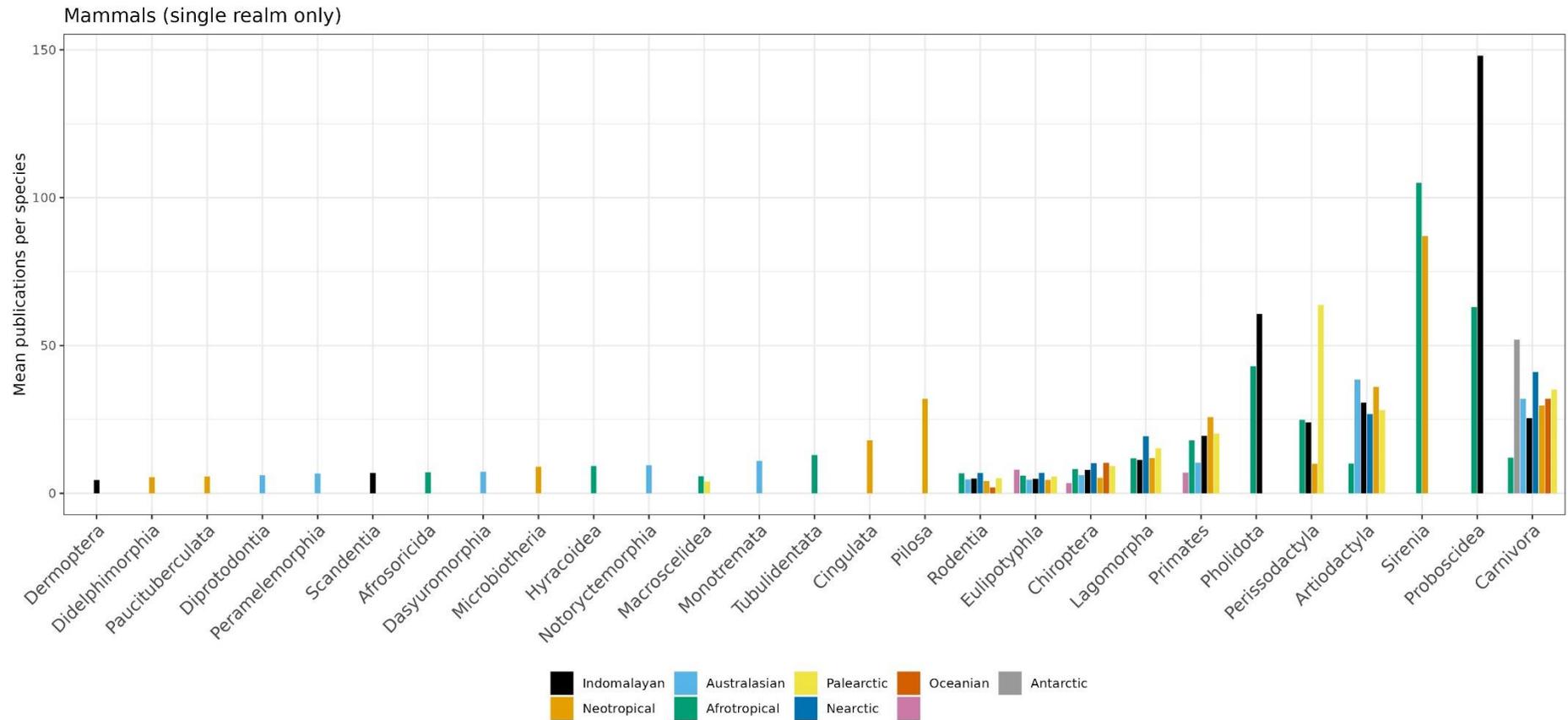


Figure S2a. Mean number of publications per species for each order per region in mammals for species with distributions restricted to a single realm.

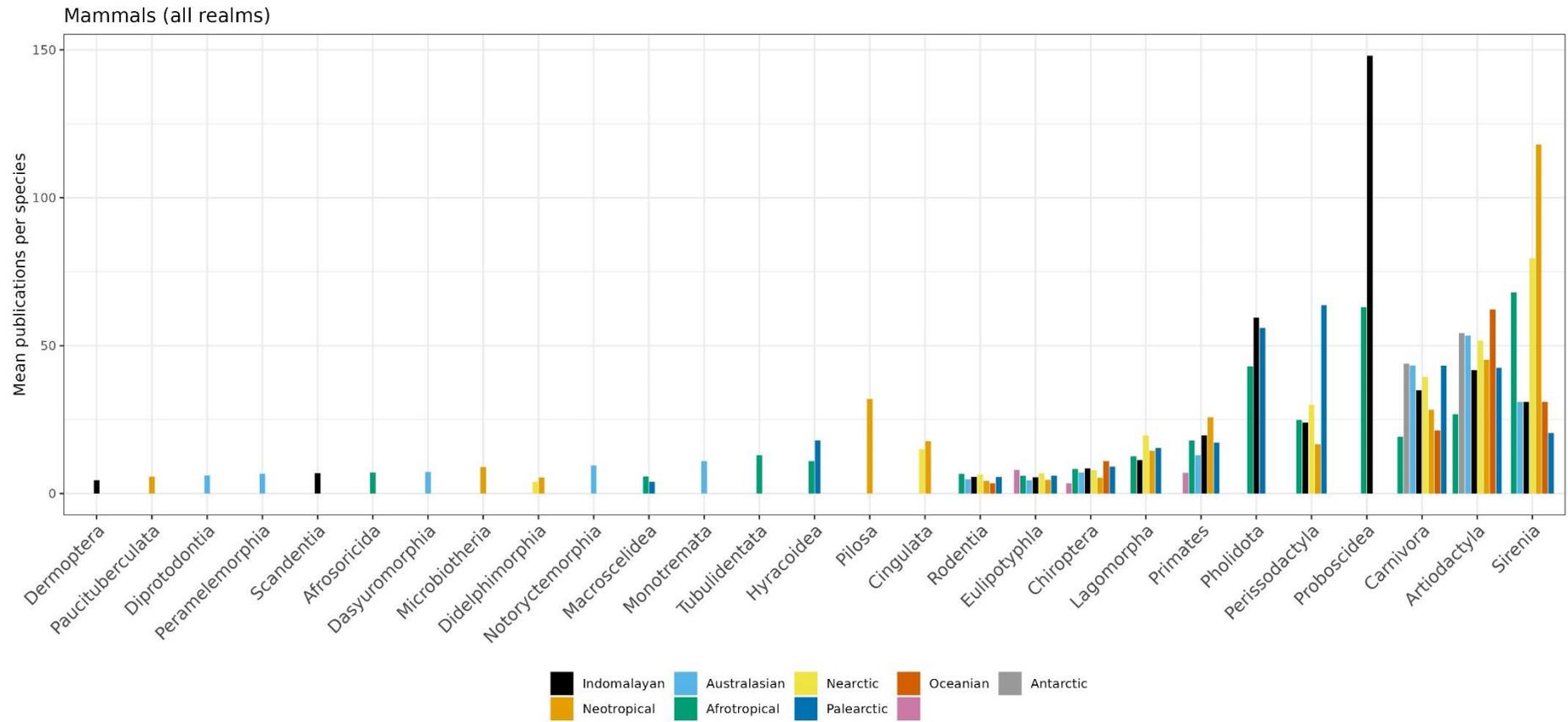


Figure S2b. Mean number of publications per species for each order per region in mammals for all species.

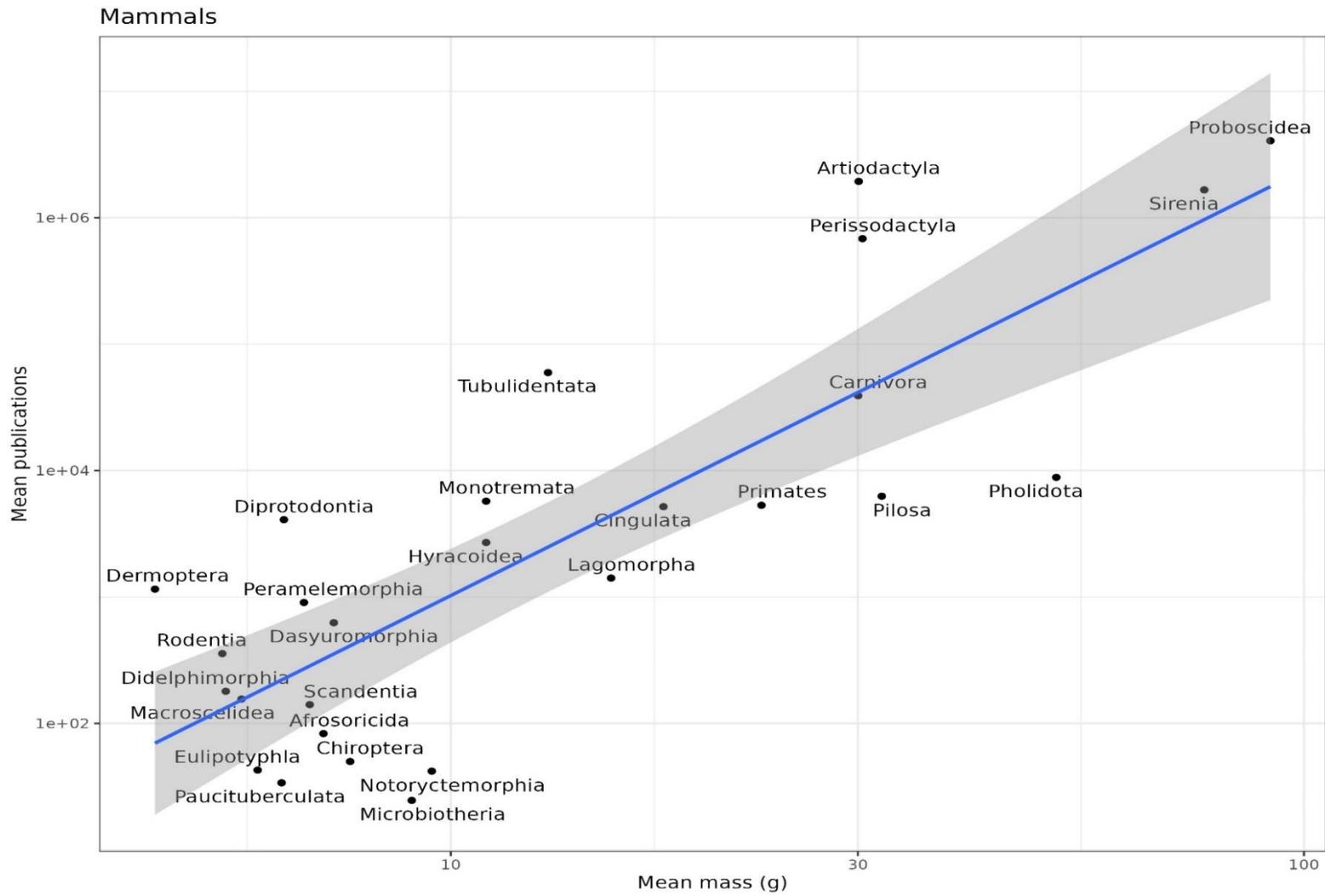


Figure S3. Mean number of publications vs mean mass (g) per group in mammals.

Odonata

Odonata

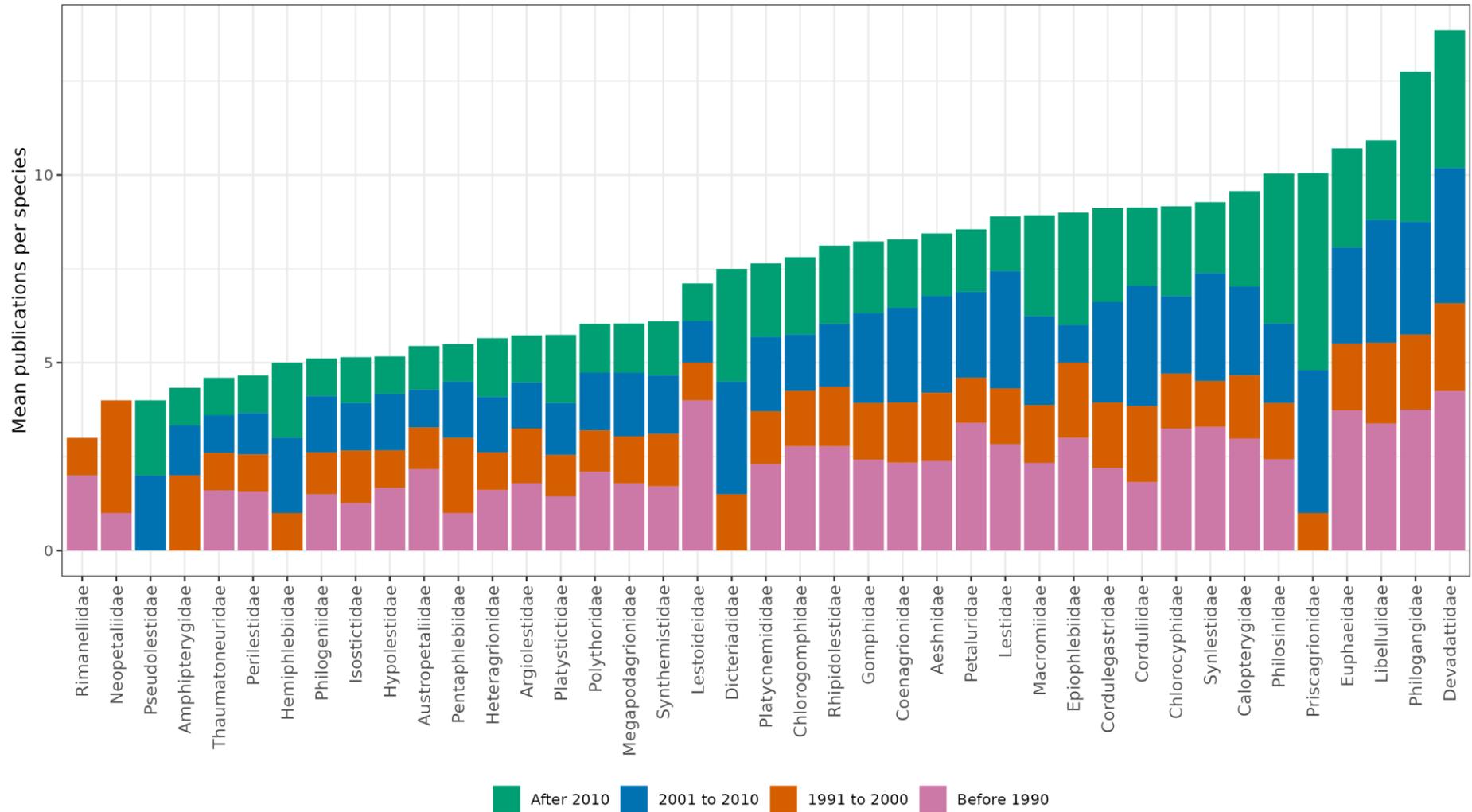


Figure S4. Mean number of publications per order per year in Odonata.

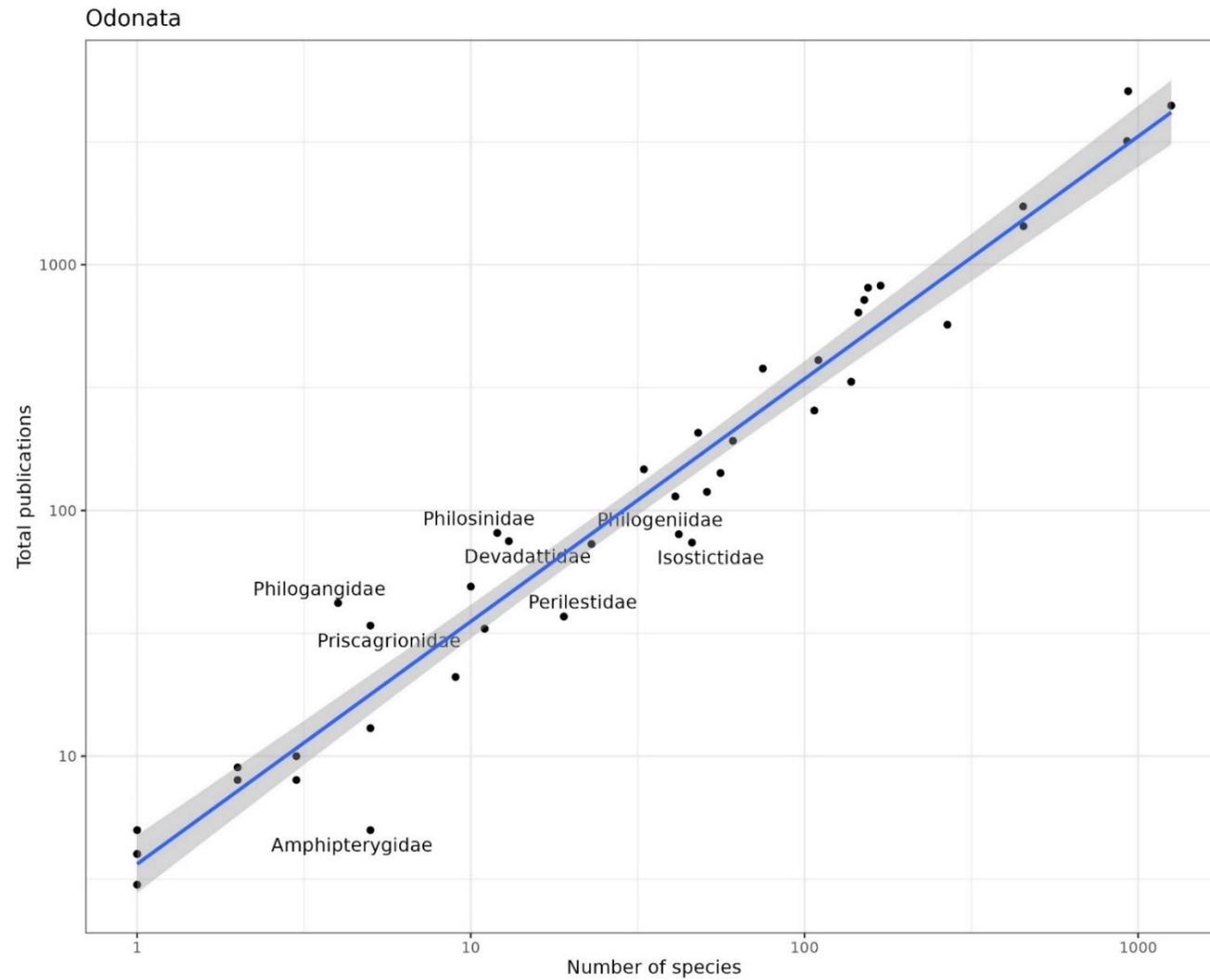


Figure S5. Number of species compared to number of publications per family in Odonata.

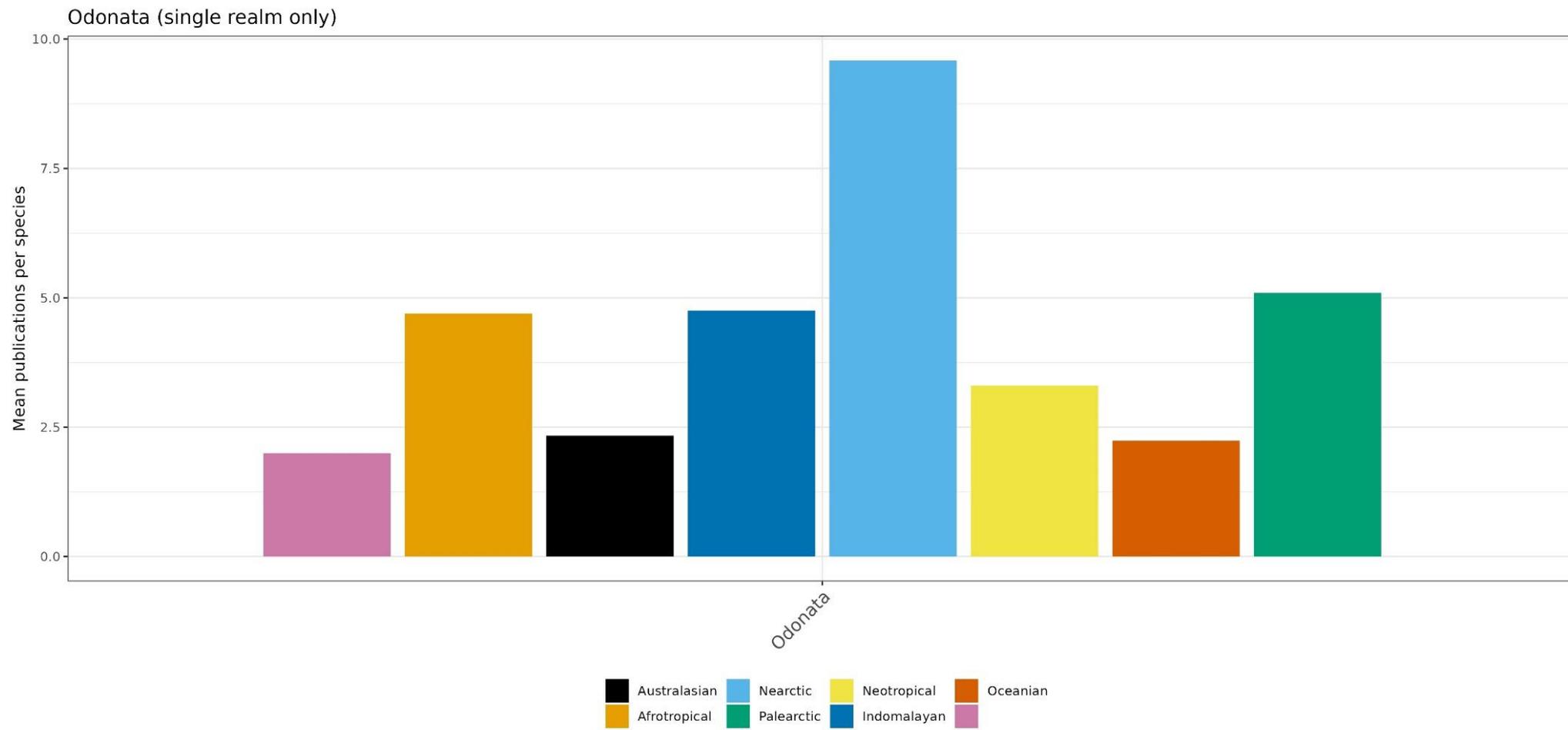


Figure S6a. Mean publication per species in Odonata per realm, for species with distributions restricted to a single realm.

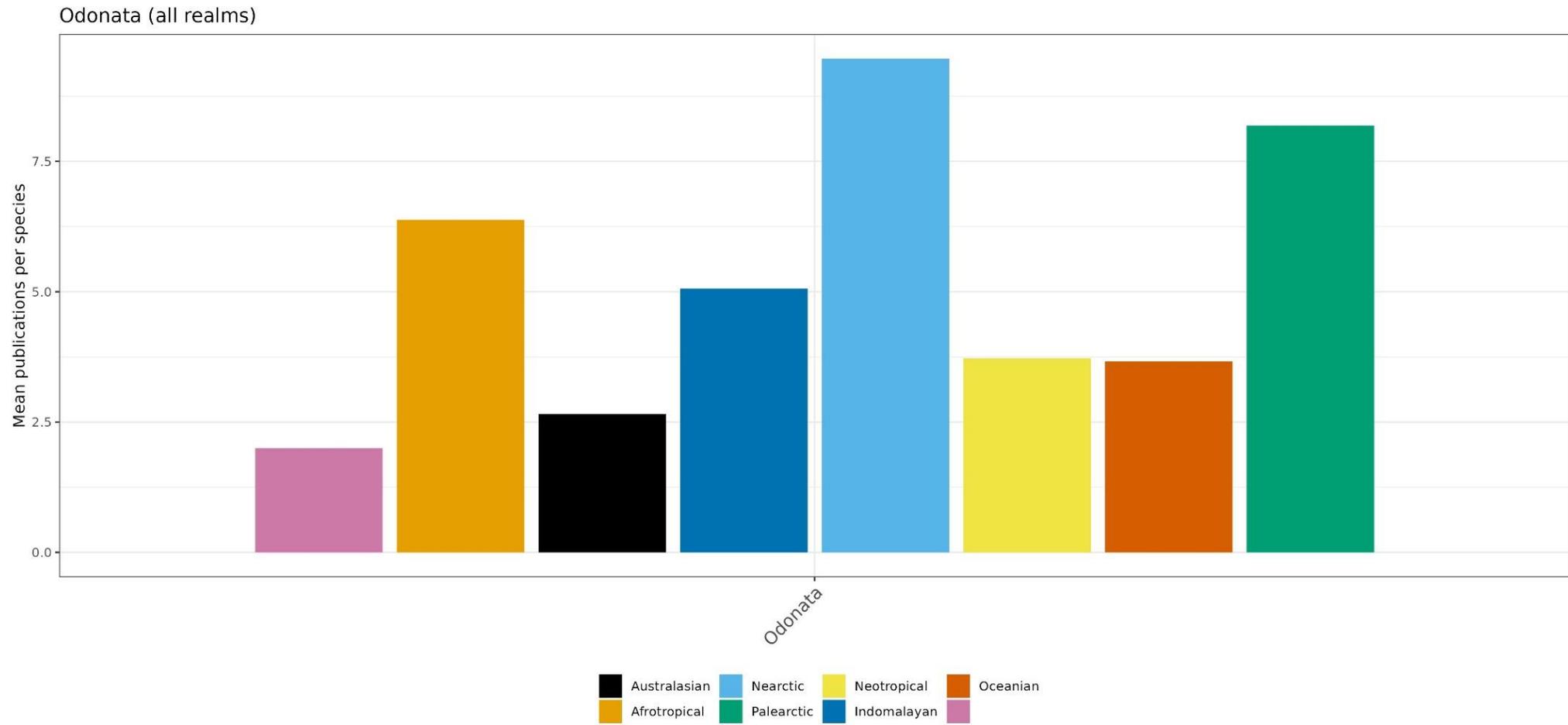


Figure S6b. Mean publication per species in Odonata per realm, for all species.

Birds

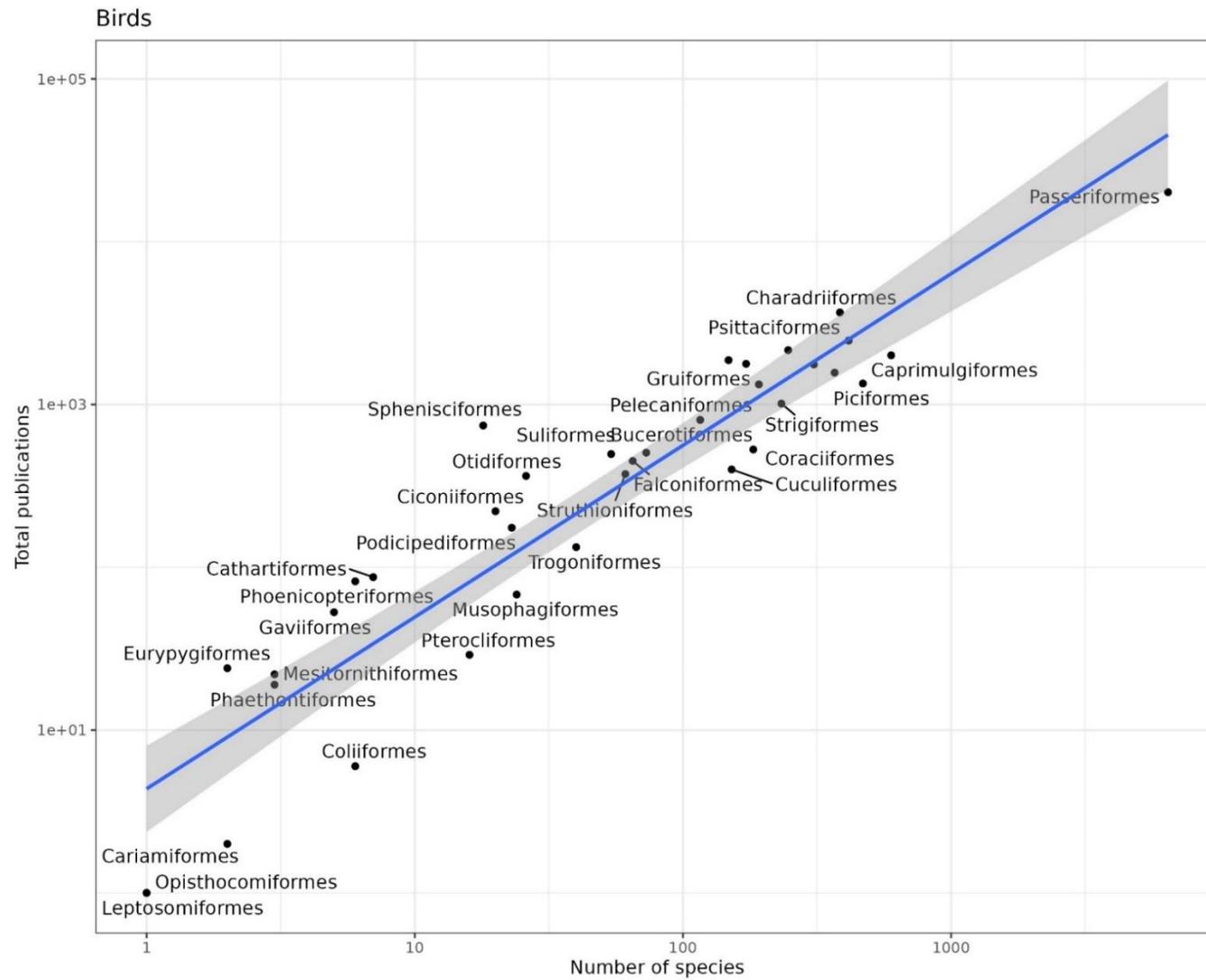


Figure S7. Number of bird species relative to number of publications per order.

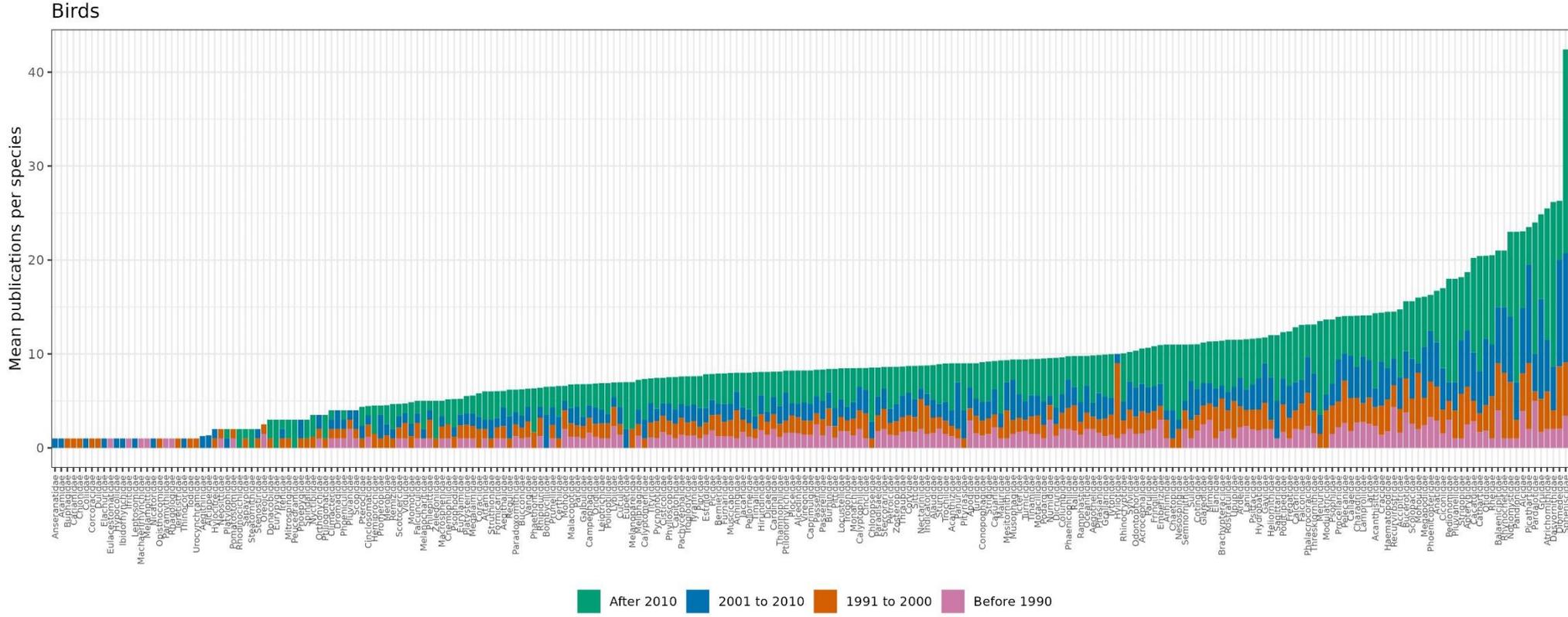


Figure S8. Mean publications per time period per family within birds.

Birds (single realm only)

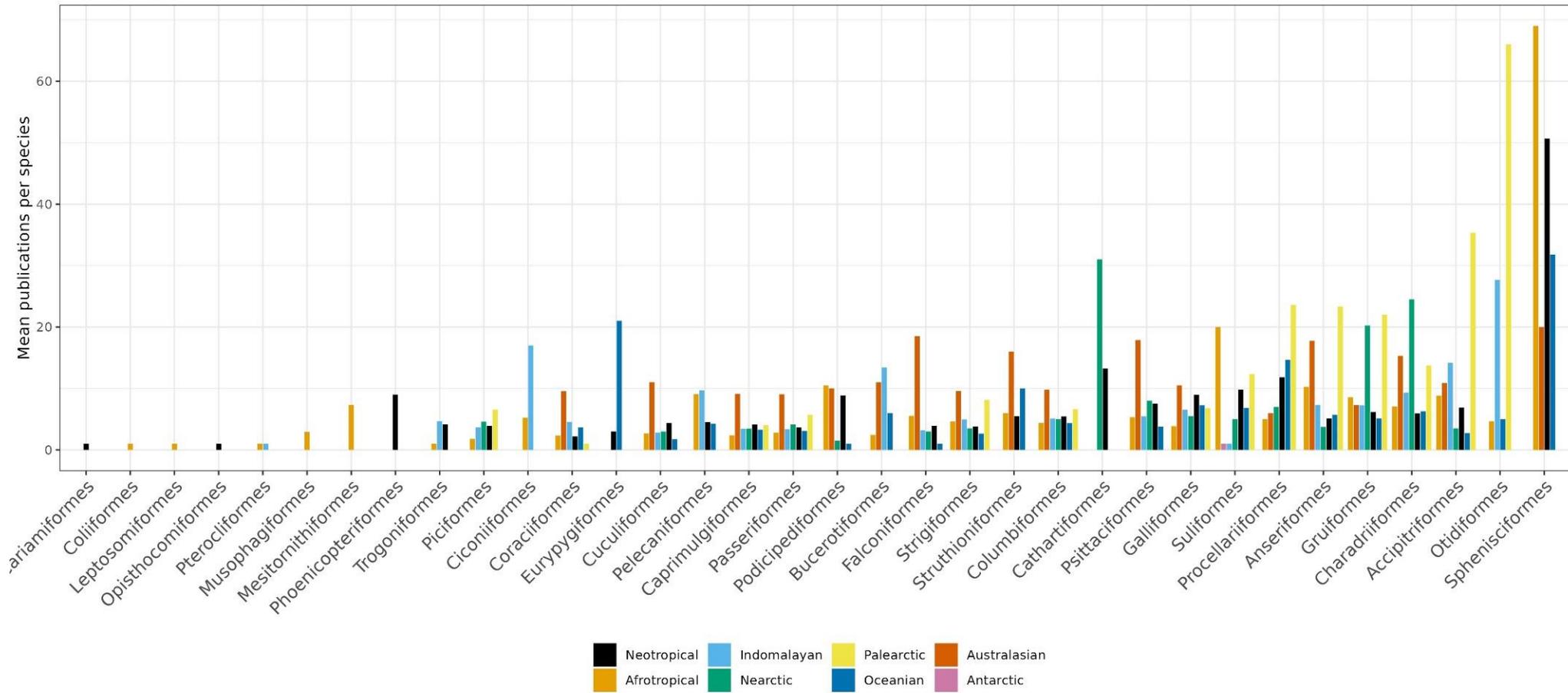


Figure S9a. Mean publications per order per region for birds with distributions restricted to a single realm.

Birds (all realms)

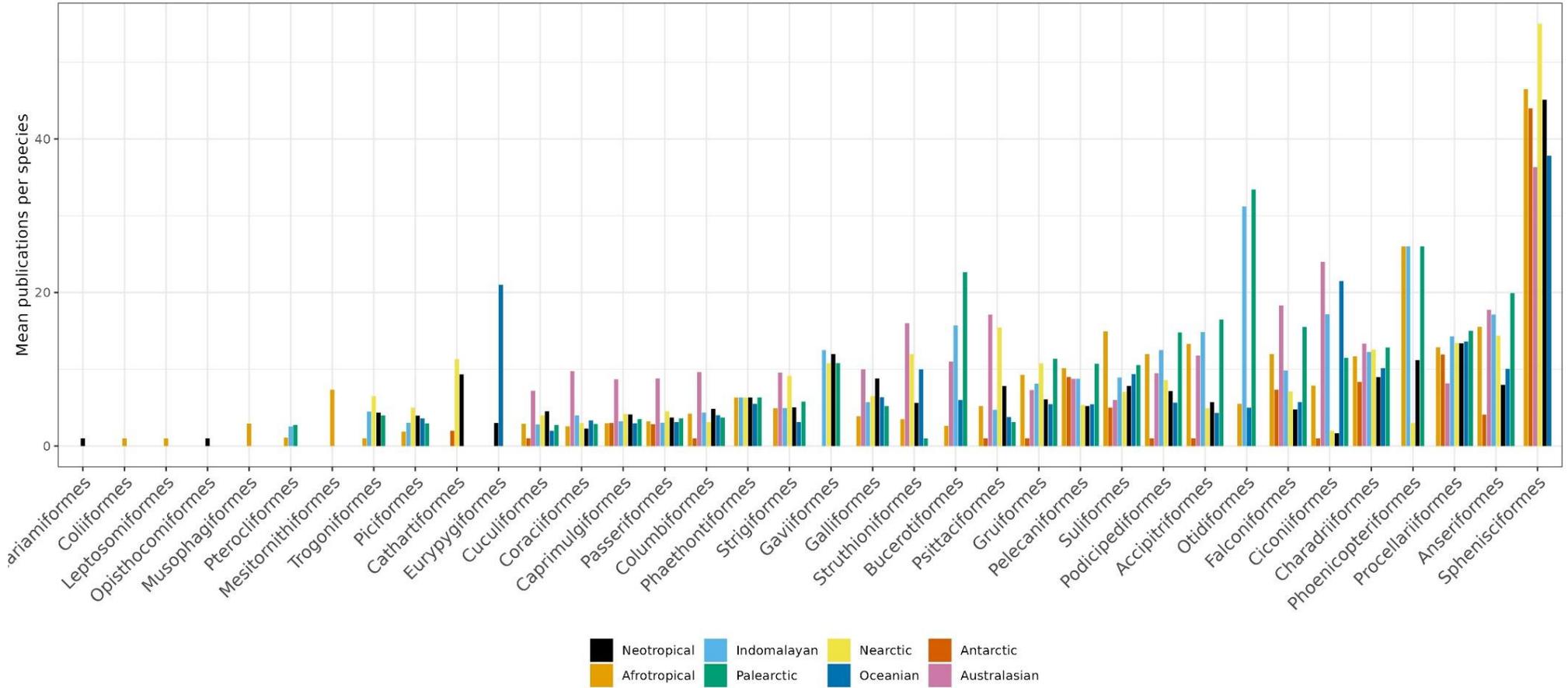


Figure S9b. Mean publications per order per region for all bird species.

Reptiles

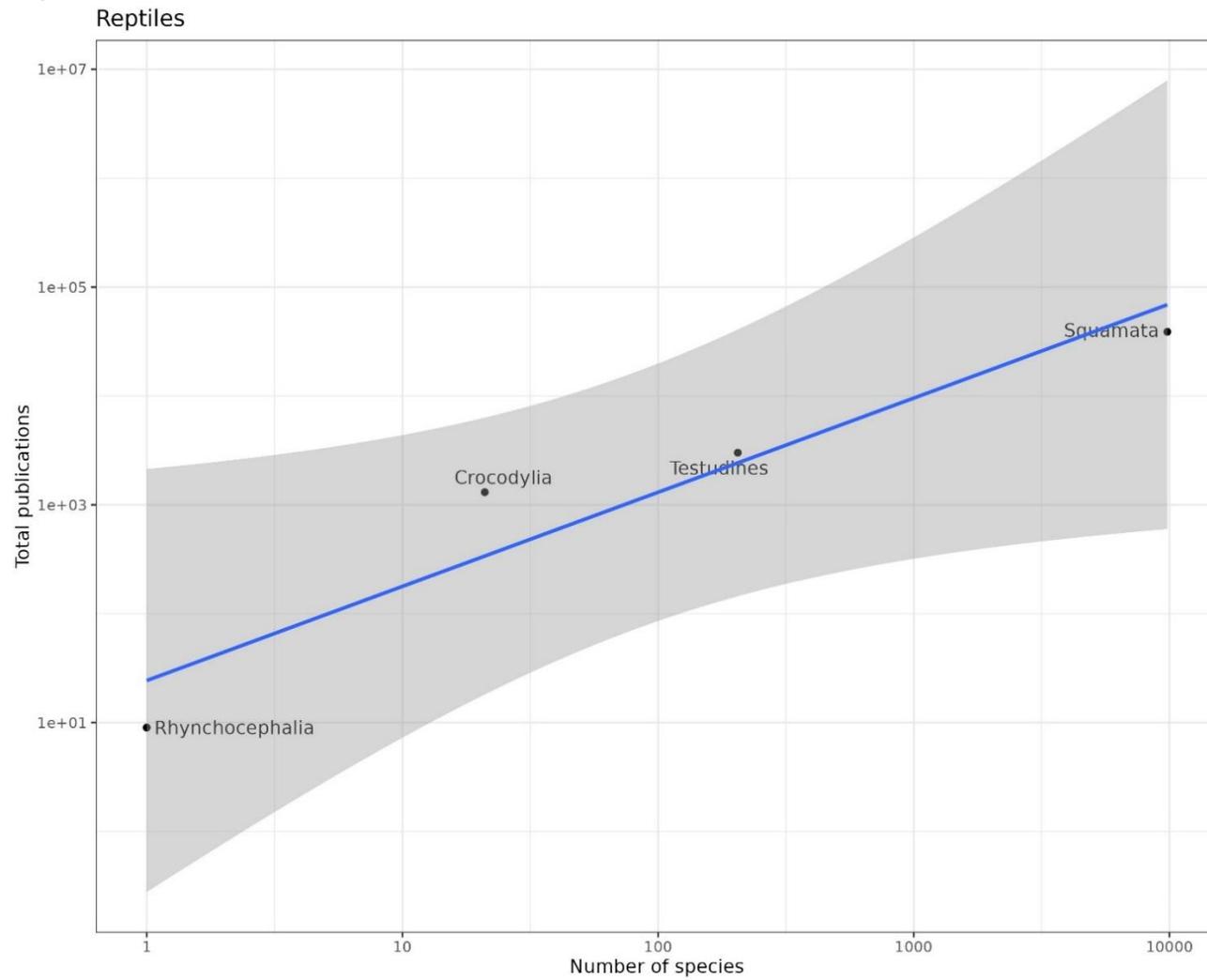


Figure S10a. Total publications vs total number of species per order within reptiles.

Reptiles

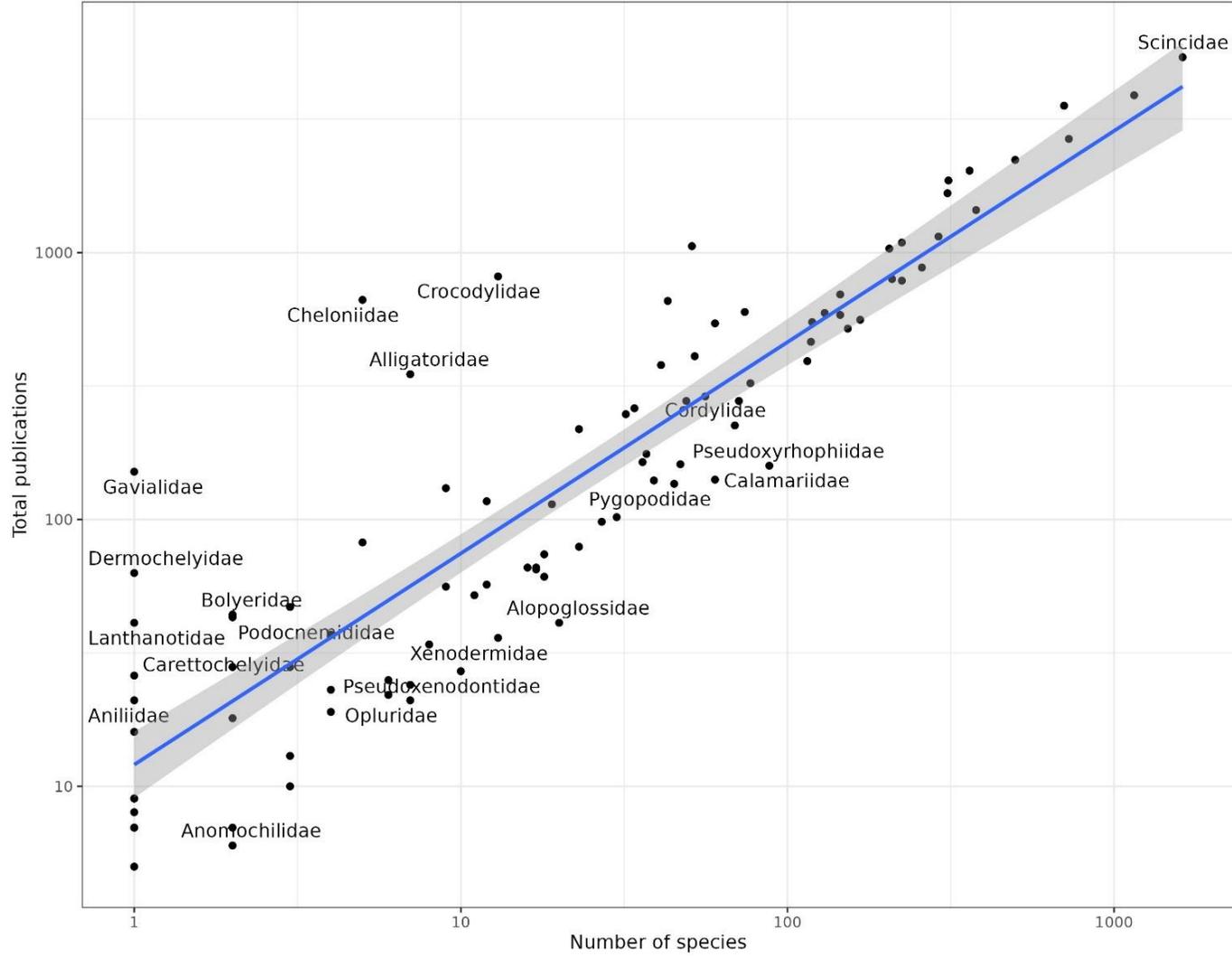


Figure S10b. Total publications vs total number of species per family within reptiles.

Reptiles

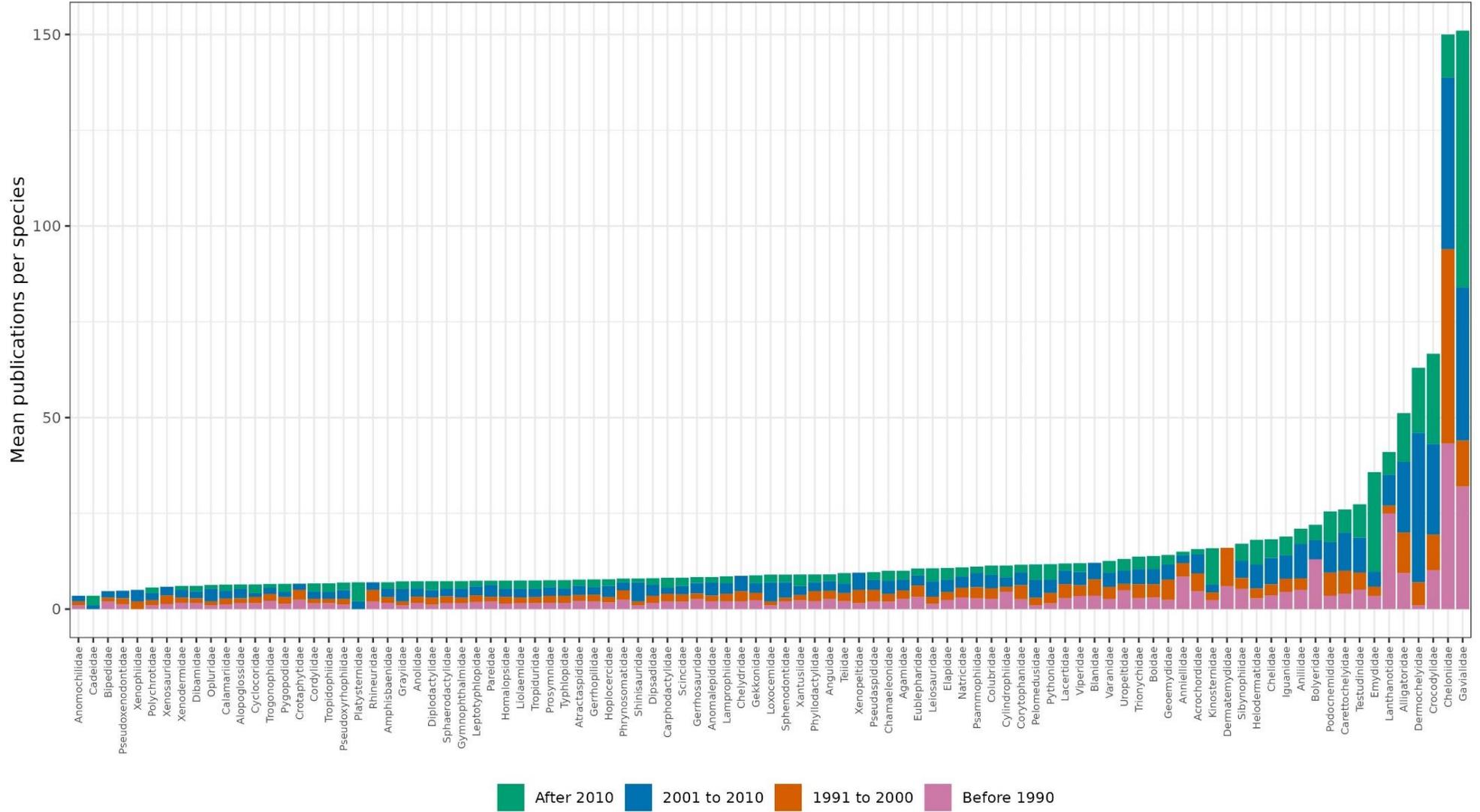


Figure S11. Mean publications per period per family for reptiles.

Reptiles (single realm only)

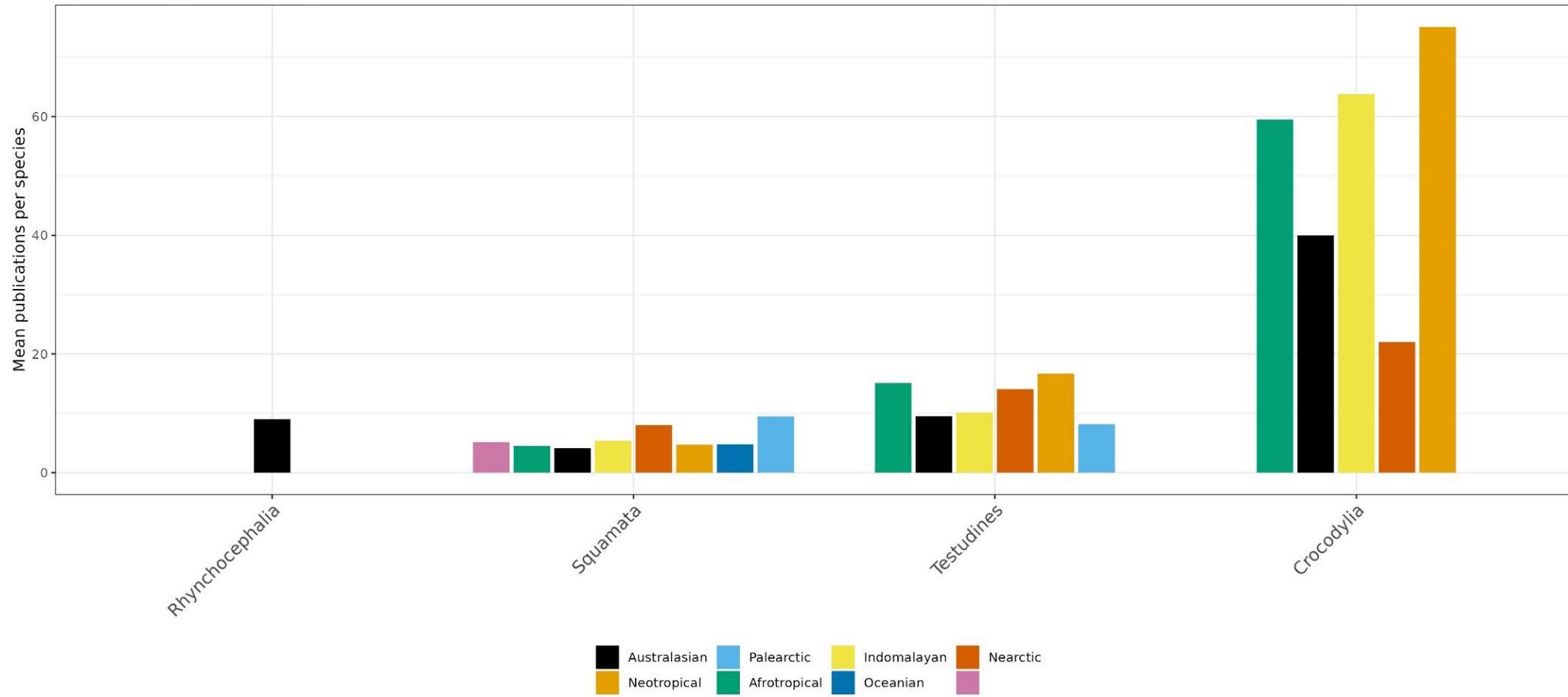


Figure S12a. Mean publications per region per order for reptiles with distributions restricted to a single realm.

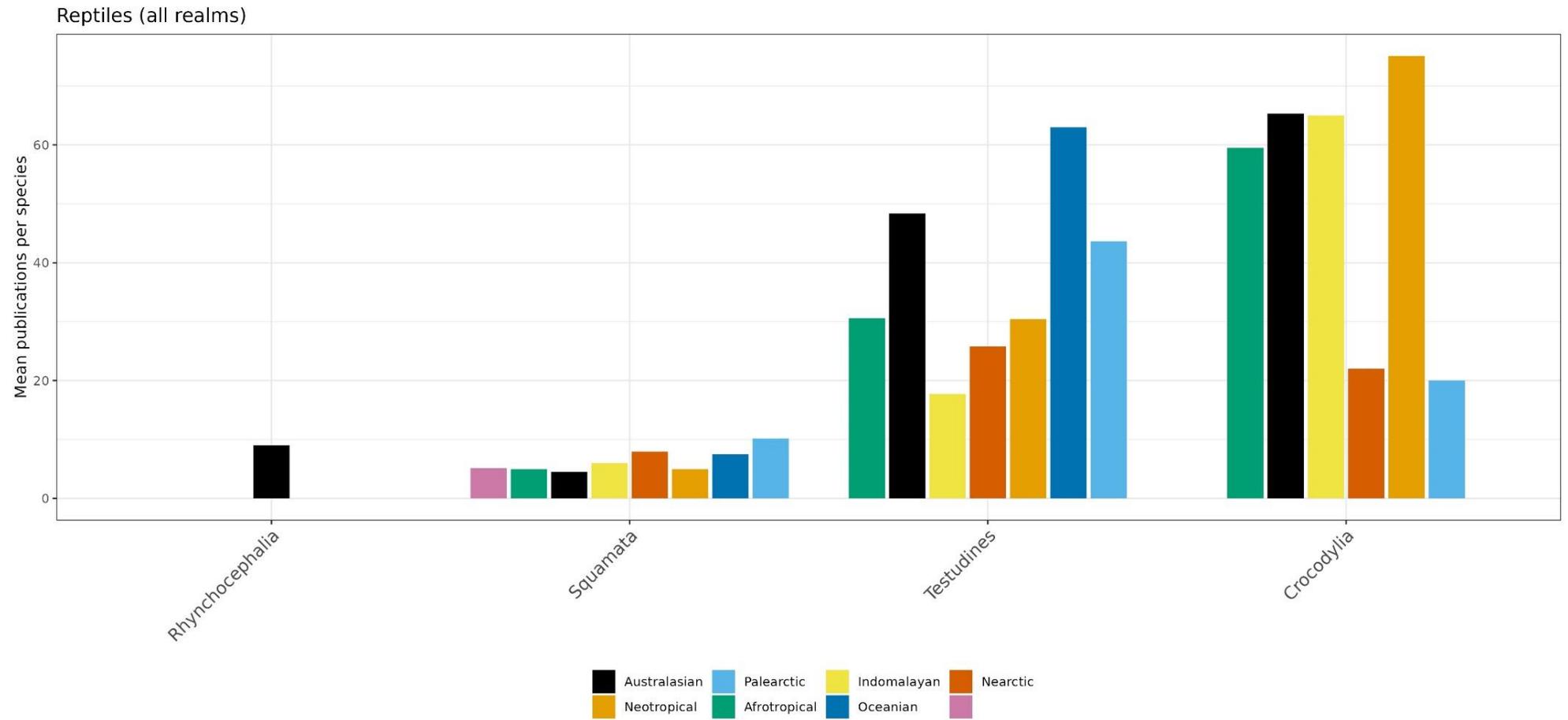


Figure S12b. Mean publications per region per order for all reptiles.

Amphibians

Amphibians

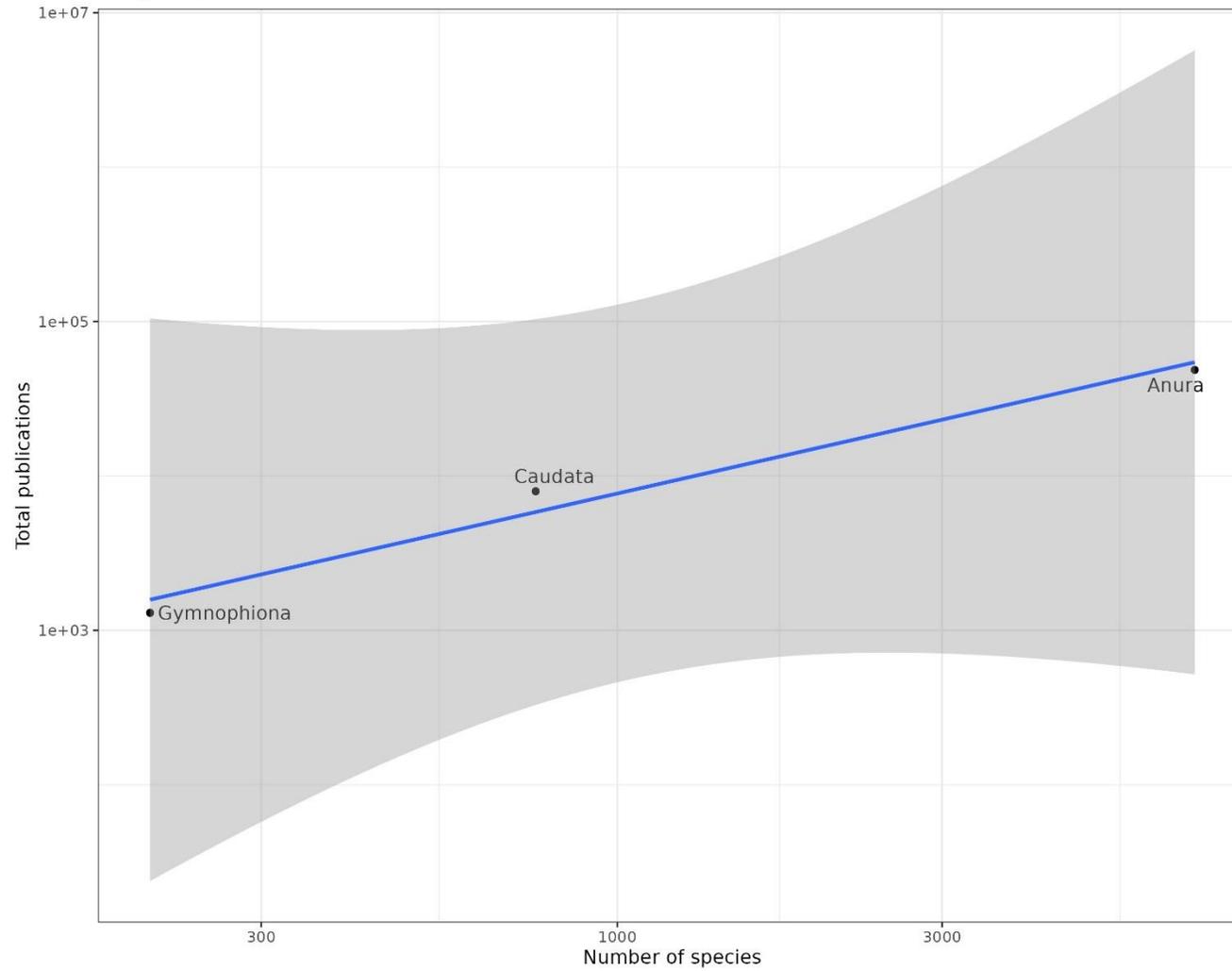


Figure S13a. Total publications vs total number of species per order for amphibians.

Amphibians

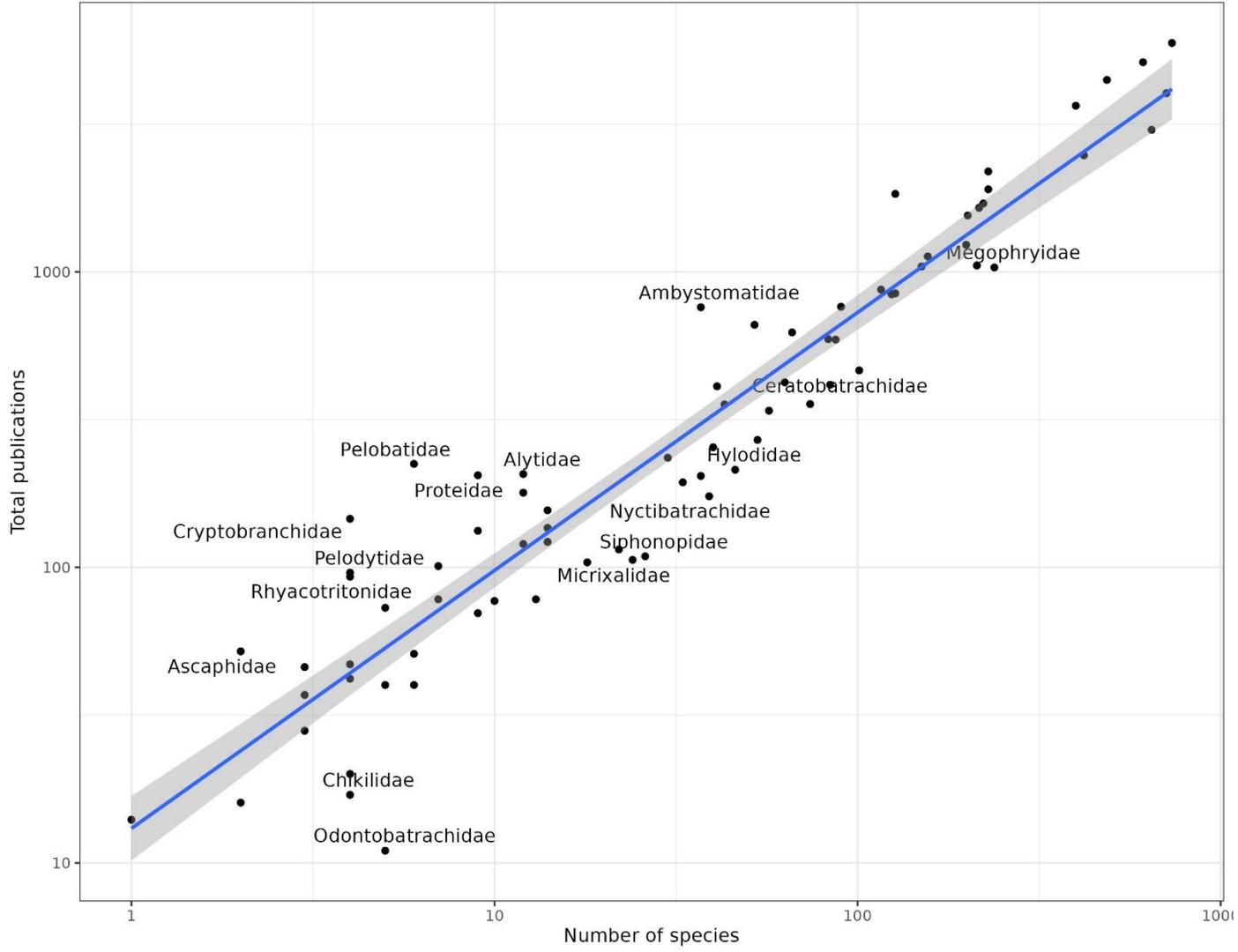


Figure S13b. Total publications vs total number of species per family for amphibians.

Amphibians

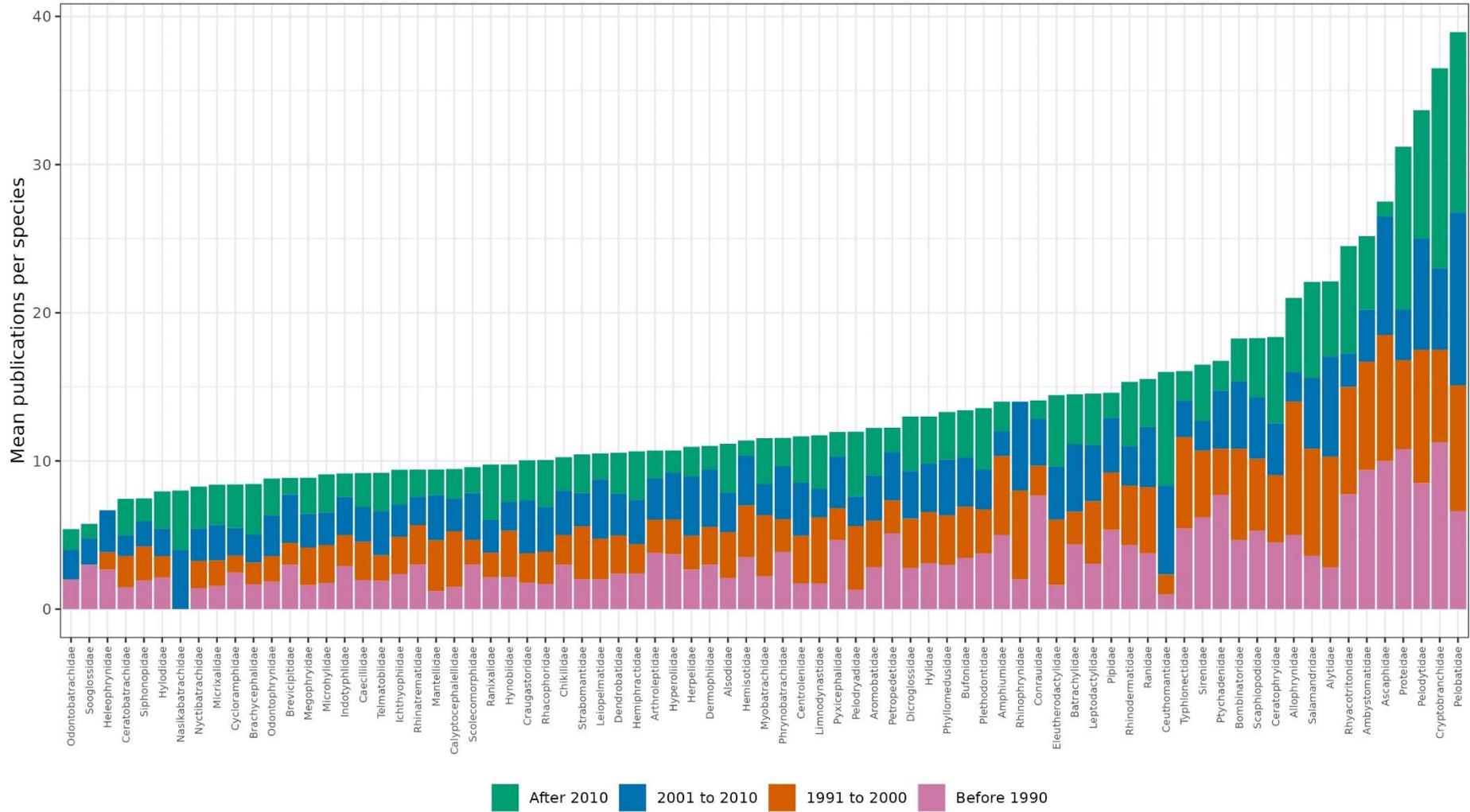


Figure S14. Mean publications per period per family for amphibians.

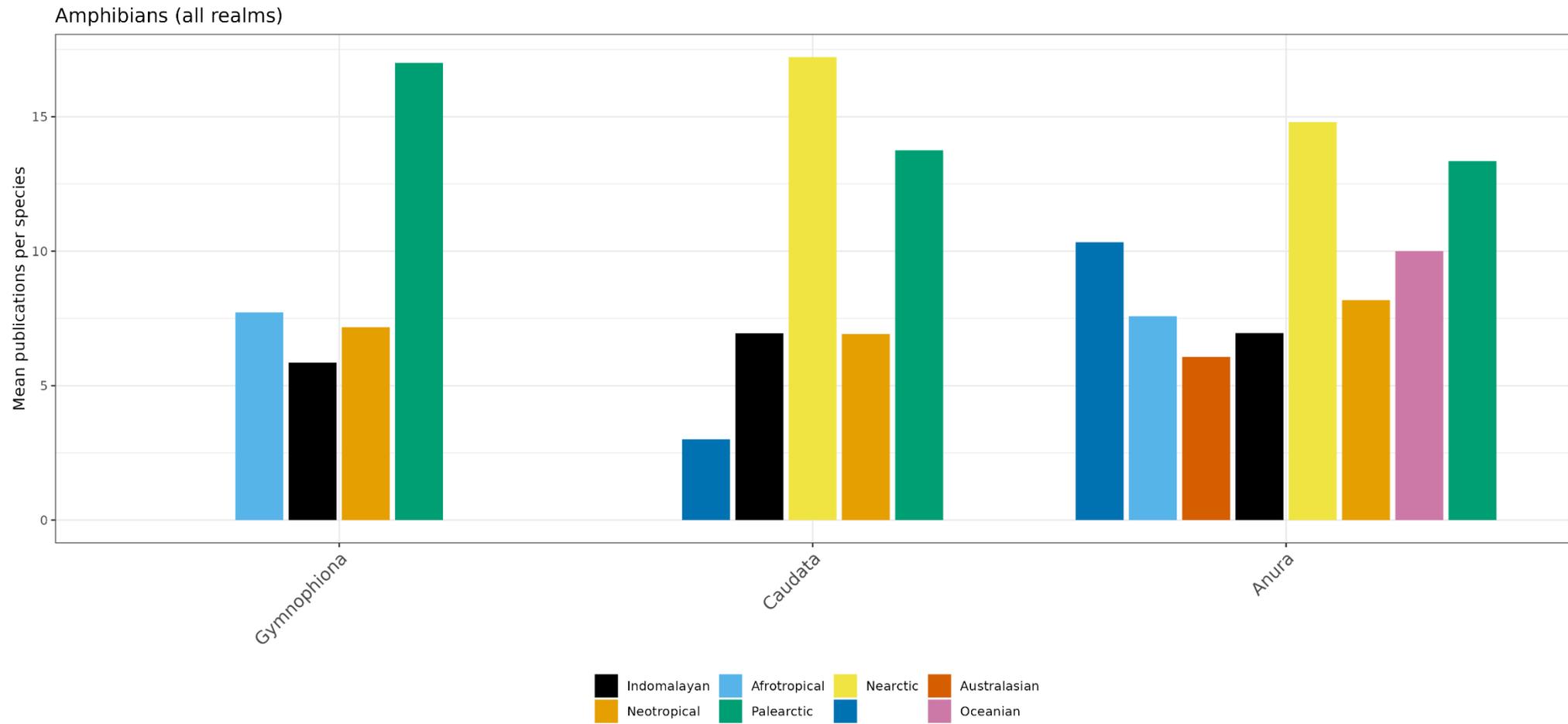


Figure S15b. Mean publications per region per order for amphibians for all species.