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Threatened and extinct island endemic birds of the world

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1	Article Type: Synthesis
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3	Threatened and extinct island endemic birds of the world: distribution,
4	threats and functional diversity
5	
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35 ABSTRACT

Aim: The world's islands support disproportionate levels of endemic avian biodiversity despite suffering numerous extinctions. While intensive recent research has focused on island bird conservation or extinction, few global syntheses have considered these factors together in combination with morphological traits and functional diversity. Here, we provide a global summary of the status and ecology of extant and extinct island birds, the threats they face, and the implications of species loss for island functional diversity.

42 Location: Global.

43 Taxon: Birds.

Methods: We provide a review of the literature on threatened and extinct island birds, with a particular focus on global studies that have incorporated functional diversity. Alongside this, we analyse IUCN Red List data in relation to distribution, threats and taxonomy. Using null models and functional hypervolumes, in combination with morphological trait data, we assess the functional diversity represented by threatened and extinct island endemic birds.

49 Results and main conclusions: We find that almost half of all island endemic birds extant in 50 1500 CE are currently either extinct or threatened with extinction, with the majority of 51 threatened extant species having declining population trends. We also found evidence of 66 52 island endemic subspecies extinctions. The primary threats to extant island endemic birds 53 currently are agriculture, biological resource use, and invasive species. While there is overlap 54 between the hotspots of threatened and extinct island endemics birds, there are some notable 55 differences, including that the Philippines and Indonesia support a substantial number of 56 threatened species but have no recorded post-1500 CE bird extinctions. Traits associated with 57 threatened island endemic birds are large body mass, flightlessness, aquatic predator, 58 omnivorous and vertivorous trophic niches, marine habitat affinity, and, paradoxically, higher dispersal ability. Critically, we find that threatened endemics i) occupy distinct areas of beak morphospace, and ii) represent substantial unique areas of the overall functional space of island endemics. We caution that the loss of threatened species may have severe effects on the ecological functions birds provide on islands.

Key words: birds, conservation, functional traits, hypervolumes, island biogeography, IUCN
Red List, null modelling, threats

65 INTRODUCTION

66 Islands are fascinating study systems where a range of ecological and evolutionary theories have been developed and tested (Whittaker & Fernández-Palacios, 2007; Warren et al., 2015; 67 Whittaker et al., 2017; Matthews & Triantis, 2021). A wide range of island systems exist 68 69 (Matthews, 2021), but here we are focused solely on true marine islands (i.e., islands of land 70 in the sea). It is also widely acknowledged that island biodiversity is acutely and 71 disproportionately threatened as a result of a wide range of human actions, many of which 72 interact, including habitat loss, hunting, the introduction of non-native species and 73 anthropogenic climate change (Steadman, 1997; Whittaker & Fernández-Palacios, 2007; 74 Szabo et al., 2012; Spatz et al., 2017; Graham et al., 2017; Leclerc et al., 2018; Veron et al., 75 2019; Russell & Kueffer, 2019; Fernández-Palacios et al., 2021). Island birds have been 76 particularly hard hit, with many of the classic examples of extinction being island endemic 77 birds, including the dodo of Mauritius, the giant moa of New Zealand, the Hawaiian 78 honeycreepers, and the elephant birds of Madagascar (Hume, 2017). Much of the empirical 79 work on threatened and extinct island bird species has been undertaken with a focus on 80 specific regions or island groups (e.g., Duncan et al., 2002; Duncan et al., 2013; Steadman, 81 2006; Boyer, 2008; Boyer & Jetz, 2014; Hume et al., 2018; Steadman & Franklin, 2020),

with less systematic combined evaluations of threatened and extinct species undertaken at the
global scale (but see Pimm et al., 2006; Leclerc et al., 2018).

84 Previous global evaluations of threatened and / or extinct island birds have also generally not 85 incorporated multiple functional traits (exceptions include Leclerc et al., 2020b; Fromm & Meiri, 2021; Marino et al., 2022). Even fewer have incorporated multiple continuous traits 86 87 that are important for understanding why particular island species are more vulnerable to 88 extinction and thus the design of effective conservation strategies (Sekercioğlu et al., 2004; 89 Cardillo et al., 2005; Chichorro et al., 2019). This is largely because continuous functional 90 trait data are hard to collect, particularly for extinct species. However, specifically for birds, 91 recent advances (e.g., Sayol et al., 2020, 2021; Soares et al., 2021, 2022; Tobias et al., 2022; 92 Triantis et al., 2022) have sourced and synthesised extensive functional trait data for extant 93 and extinct island birds at the species level. The collection of these data now allows for more 94 in-depth analyses of avian functional diversity – the morphological and ecological 95 characteristics that influence fitness and the effects of organisms on the environment - on 96 islands (Tobias et al., 2022). For example, using recently assembled datasets of traits for 97 extinct bird species, Sayol et al. (2021) and Soares et al. (2022) found that avian extinctions 98 on certain island groups have resulted in large reductions in functional diversity.

99 Our aim here is to provide the first global evaluation of both extinct and threatened island 100 birds simultaneously, including assessment of threats and their causal drivers, and evaluation 101 of the functional diversity represented by these species. This synthesis is particularly 102 pertinent given the large number of relevant studies published on the topic over the last five 103 years. Our objectives are three-fold: to 1) provide a review of the literature on threatened and 104 extinct island endemic birds, with a particular focus on functional diversity; 2) undertake an 105 overview of island endemic bird species in terms of their distribution, taxonomy and threat 106 status; and 3) provide a statistical evaluation of the individual traits, and overall functional

107 space, of threatened and extinct island endemic birds, with comparison to their non-108 threatened counterparts. As such, this synthesis combines a review of the literature with a 109 range of different analyses. In regard to the latter, we focus on all of the world's bird species 110 (11,162 extant and extinct species based on BirdLife's taxonomy) and bring together multiple 111 databases to provide a comprehensive global evaluation of both threatened and extinct island 112 endemic species simultaneously. First, we utilise the International Union for Conservation of 113 Nature and Natural Resources' (IUCN) Red List, which provides an extinction risk 114 assessment for almost all the world's bird species (IUCN, 2021a). Second, we source data on 115 multiple functional traits for extant and extinct species, including nine continuous 116 morphological measurements for all the world's extant bird species from the recently 117 published AVONET trait database (Tobias et al., 2022). We also provide and summarise a novel global dataset of endemic island bird subspecies extinctions. Together, these 118 119 investigations provide the most up-to-date overview of the global conservation status of 120 island endemic birds, the threats they face, the traits that drive their extinction risk, and the 121 implications of their loss on island functional diversity.

122 MATERIALS AND METHODS

123 Literature review

We searched the literature for published studies on threatened and extinct island endemic birds. This was not a fully comprehensive review of all published studies on the topic (which number in the hundreds if not thousands). Rather, we focused our attention more on recent global and regional analyses, particularly analyses incorporating functional trait data.

128 Data Collection - IUCN conservation status and threat data

129 We used the IUCN Red List API (IUCN, 2021a), accessed through the *rredlist* R package

130 (Chamberlain 2020). This allowed us to download the full list of the world's birds (11,162

131 species) along with their IUCN classification and population trend (i.e., increasing, 132 decreasing, stable or unknown). In the IUCN Red List, each assessed species is classified as 133 being one of Extinct (EX), Extinct in the Wild (EW), Critically Endangered (CR), 134 Endangered (EN), Vulnerable (VU), Near Threatened (NT), Least Concern (LC), or Data 135 Deficient (DD), based on a range of different criteria. As a first step, we removed all species 136 classified by the IUCN as data deficient (n = 50), leaving 11,112 species. We created a 137 threatened group (TH) by combining all species classified as CR, EN or VU (cf. Bennett & 138 Owens, 1997; Carmona et al., 2021). Herein, reference to 'threatened' species relates to this 139 TH group. Twenty-two species are classified as CR but with an additional 'Possibly Extinct' 140 marker (IUCN 2021b); we have kept these as CR as this is their actual current IUCN 141 classification. Information on whether each species was an island endemic was taken from Sayol et al. (2020). Following Sayol et al. an island endemic was defined as any species that 142 143 only occurs on islands that were not connected to the continent during the last glacial period, 144 when sea levels were up to 120 m lower than the present day. All other species are referred to 145 collectively as non-island-endemics. For each species, we also recorded higher taxonomic 146 information available in the Red List, such as order.

Our main analyses are focused on full species. However, as part of the data collection for this synthesis, we also used a variety of sources (e.g. Szabo et al., 2012; Billerman et al., 2022) to collate data on island endemic subspecies extinctions (data collection methods and resultant dataset presented in Appendices S1 and S2).

For all species classified as threatened island endemics, we used the 'rl_threats' function in the *rredlist* R package to access the IUCN Red List API and compile information on the threats facing each species. The IUCN Red List lists direct threats that "have impacted, are impacting, or may impact" a species and contributed to its listing, and are categorised into 12 broad groups (e.g., biological resource use, pollution, invasive species and diseases, climate change; see Table S1 in Appendix S3 for the full list along with threat group numbers). The
12th group is defined as 'Other' and we did not include it in our analyses. For each threat
faced by a species, we collected information on threat timing (e.g., Future, Ongoing, Past,
Unlikely to Return) and severity (e.g., Negligible declines, No decline, Rapid Declines) (see
Table S1) as listed in the IUCN Red List entry for that species.

161 We also sourced from the IUCN Red List all bird species classified as extinct (n = 164) since 162 1500 CE. For the present study, as there were only five cases, we considered those species 163 classified as Extinct in the Wild as being extinct. Again, for the extinct species, we sourced 164 island endemism data from Sayol et al. (2020) and the wider literature. For each island 165 endemic species (extant and extinct), we also recorded the island group they were endemic to, 166 and the latitude and longitude of the rough centre of this island group. These island groupings 167 were necessarily coarse, given that most species were not endemic to single islands, with 168 some representing whole island countries that are not easily divided (e.g., Philippines), and 169 others particular archipelagos (e.g., Hawaii, Caroline Islands, south New Zealand Outlying 170 Islands).

171 Going forward, we utilised four main (nested) species datasets in our analyses: 1) all-species

172 dataset (including all extant and extinct birds; n = 11,112), 2) extant species dataset

173 (including all extant bird species; n = 10,948), 3) all-island endemics dataset (including only

174 extant and extinct island endemic species; n = 1,856), and 4) extant island endemics dataset

175 (including only extant island endemic species; n = 1,707).

176 While our main analyses are focused on species that have gone extinct since 1500 CE (as

- 177 these are the only species included in the IUCN Red List), as part of a separate project (F.
- 178 Sayol & T. Matthews, unpublished data; see also Sayol et al., 2020) we also compiled data on

- all island species that are known to have gone extinct in the last 125,000 years. Here, we
- 180 present an overview of these data in relation to island species.

181 Data Collection - Functional trait data

In order to analyse functional diversity patterns, we collected trait data related to volancy and
body mass for extinct and extant species, and a range of additional morphological and
ecological traits for extant birds.

185 *Extant species*

186 We used Sayol et al.'s classifications of volancy (flightless or volant) for each species.

187 Eleven species (including extinct species) were classified by Sayol et al. as weak flyers, and

188 we classified these as flightless. For those species not covered by Sayol et al. we classified

189 species in regard to island endemism and volancy by using a range of literature sources (e.g.,

190 the 'Birds of the World'; Billerman et al., 2022).

191 For all 10,948 extant species (island endemics and non-island-endemics), we sourced 192 additional trait data from the AVONET trait database (Tobias et al., 2022). This included 193 several categorical and continuous traits linked to avian resource use, trophic level, foraging, 194 behaviour and dispersal. The categorical traits were: habitat affinity (e.g., forest, marine, 195 grassland), trophic level (i.e., carnivore, herbivore, omnivore, scavenger; we excluded 196 scavenger from these analyses due to the low numbers of island scavengers -0.2% of the 197 total extant species and no island endemics), and trophic niche (e.g., ten categories including 198 frugivore, invertivore, nectarivore). To reduce the number of habitat categories, we combined 199 coastal, riverine and wetland habitat categories into a single wetland category, forest and 200 woodland into forest, and grassland and shrubland into grassland. For the few (<100 out of 201 ~11,000) species with missing trait data (i.e. habitat and trophic data), we used information 202 from the wider literature to make informed decisions on the missing values. Eight species in 203 the IUCN Red List were not in AVONET (either recent splits or newly described species);

for these we used the trait values of the species each was split from (i.e. the sister species).
Continuous traits included eight morphological measurements (beak length along the culmen,
beak length to nares, beak width, beak depth, tarsus length, wing length, first secondary
length and tail length), body mass, and the hand-wing index (HWI, a measure of dispersal
ability; see Sheard et al., 2020). See Tobias et al. (2022) for more details on all traits.

209 Extinct species

210 For all extinct species, we sourced volancy data from Sayol et al. (2020). We also compiled 211 data on body mass using a range of published sources. As a first step, we checked two 212 primary data sources for body mass values: Birds of the World (Billerman et al., 2022), and a 213 recent analysis of island birds including extinct species (Triantis et al., 2022). Birdlife 214 International's data zone (Birdlife International, 2021) was also checked. For the majority of 215 extinct species, body mass values were not available and thus we used those three sources, in 216 addition to Hume (2017), to identify the closest extant relative for each extinct species, and 217 used its body mass value, with some adjustments when the closest relative was known to be 218 bigger or smaller (e.g., see Triantis et al., 2022). Additional studies were used for certain 219 species (e.g., emu species, Hume & Robertson, 2021). In general, these sourced values only 220 represent coarse estimates of extinct species body mass and should only be used in future 221 analyses with this in mind.

222 Null model analyses

To determine whether i) island endemic bird species in general, ii) specific orders of island endemic birds, and iii) island endemic species with certain traits, were more likely to be classified as threatened or to have gone extinct than expected by chance, we ran a series of null model analyses, each one based on 9,999 iterations. While it would theoretically be possible to use direct quantitative tests (e.g., tests of equal proportions or contingency

analysis) to compare the proportion of island endemics with non-island-endemics in terms of
categorical traits, we decided to use a null model approach for all traits (categorical and
continuous) to ensure a consistent method was applied, and to allow easy visualisation of the
strength of effects. As the null distributions were often slightly skewed (i.e., non-normal), we
instead used an alternative to the typical standardised effect size (SES) approach. Our effect
size (ES) approach (Lhotsky et al., 2016; Matthews et al., 2020a) works by calculating the
empirical probability (*P*) that the observed value is less than expected using the formula:

235
$$P = \frac{length(null < obs) + \frac{length(null = obs)}{2}}{n+1},$$

236 where *null* is the vector of null distribution values, *obs* is the observed value, and *n* is the 237 number of null model iterations (here n = 9,999). This empirical probability was then probit 238 transformed (see Lhotsky et al., 2016) using the VGAM R package (Yee, 2010) to obtain the 239 ES value. To ensure an empirical probability of 0 or 1 is not returned (as these values cannot 240 be probit transformed), the observed value (obs) is added to the vector of null values (hence 241 the n + 1 term). ES values greater than 1.96 (probit of roughly 0.975) or less than -1.96 242 (probit of roughly 0.025) can be considered to be significantly greater or less than expected 243 by chance, based on an alpha level of 0.05. It should be noted that, while the theoretical ES range is between minus and positive infinity, the actual achievable range will depend on *n*: 244 minimum P = 0.5 / (n+1) and max P = (n+0.5) / (n+1). With an n of 999, this equates to a 245 246 maximum ES value of +- 3.29, while for n = 9,999 the equivalent value is +- 3.891. 247 In regard to the null models themselves, for (i), we randomly sampled (without replacement) 248 the total number of extant and extinct island endemic species (n = 1,856) from the all-species 249 dataset, and recorded the number of CR, EN, VU, TH and EX species in each sample (i.e., 250 five null distributions were created).

251 In regard to (ii), to ensure an interpretable number of orders was used, we focused on the 13 252 orders that included more than 150 species in the all-species dataset. Using the all-island 253 endemics dataset, we calculated the number of island endemic species classified as CR, EN, 254 VU, TH and EX. For each of these five cases, we then randomly sampled this number of 255 species (irrespective of IUCN status or order) from the all-species dataset and recorded the 256 number of species belonging to each of the 13 orders. We repeated the analysis but instead 257 randomly sampling from the all-island endemics dataset (i.e. switching from a global species 258 pool to an island endemics species pool).

259 In regard to (iii), separate null model analyses were run for each of seven traits: volancy, 260 HWI, habitat affinity, body mass, trophic level, trophic niche (we focused on the seven most 261 species-rich trophic niches as the remaining three contained very few island endemics) and 262 beak morphology. For beak morphology, we took the four beak traits (length to culmen, 263 length to nares, width, depth; log-transformed) for all extant species and conducted a PCA to 264 obtain four orthogonal axes. We then subsetted the 530 threatened island endemics and built 265 a hypervolume using these four axes and the method outlined in detail below ('Functional 266 morphospace comparison' section; here we used a 'svm.gamma' parameter of 1.2 to provide 267 a tighter wrap to the data), using the total volume of this hypervolume as our measure of beak 268 morphology; here 999 null iterations were used as the process was much more time-269 consuming. For the null modelling, for each trait separately, we randomly sampled the 270 number of threatened island endemic species (n = 530) from the species pool and, using this 271 sample, calculated either the number of species in the different trait categories, the median 272 HWI or body mass, or the volume of the beak hypervolume. We ran the analyses twice, using 273 two different species pools: the extant species dataset (n = 10,948) and the extant island 274 endemics dataset (n = 1,707); the latter constraining the pool to island endemic species only. 275 In the case of volancy and body mass, we also tested whether more or fewer extinct island

endemic species were flightless than expected by chance, and if median body mass of extinct species was significantly different than expected, by sampling the observed number of extinct island endemic species (n = 149) from the all-species dataset (n = 11,112) or the all-island endemics dataset (n = 1,856).

280 Individual trait differences between threatened and non-threatened island endemics

281 To more explicitly compare individual traits between threatened island endemics (TEs) and 282 non-threatened island endemics (NTEs), we directly compared body mass, HWI, beak 283 morphology, habitat (forest, grassland, marine and wetland) and trophic niche (same seven 284 niches used in the null models). For beak morphology, we took the first two axes from the 285 PCA undertaken on just the four beak traits (described above). Here, all four beak traits had a 286 positive loading on PC1 (i.e. it is a measure of beak size; 84% of total variance), while PC2 287 described the trade-off between beak length, and width and depth (13%). Continuous traits 288 were compared between the two species groups using Wilcoxon Rank Sum tests, while 289 categorical traits were tested using chi-square tests.

290 Functional morphospace comparison

291 As a further analysis of threatened island endemic functional diversity, we compared the 292 overall functional space occupied by threatened and non-threatened island endemics. For this, 293 we used the eight continuous morphological functional traits and body mass for all 10,943 294 extant bird species. This is five less than the full number of extant species as it was necessary 295 to remove the five kiwis [Apteryx spp.] as they represent extreme functional outliers in regard 296 to wing and tail length (see Pigot et al., 2020) and including them distorted the resultant 297 functional spaces. These species were not removed for the separate beak morphospace 298 analyses as they were not outliers with respect to the beak traits. All nine traits were log-299 transformed (cf. Pigot et al., 2020), and scaled to have a mean of zero and unit variance. We

300 ran a PCA on these nine traits (for the 10,943 species) using the 'prcomp' function from the 301 stats R package, and extracted the first five PCA axes (we did not scale the PCA axes). We 302 focused on the first five PCA axes only as they explained 98% of the total variance and, more 303 importantly, it is recommended that hypervolumes be constructed using as few dimensions as 304 required (Mammola & Cardoso, 2020). PCA axis 1 (77% of variation) was positively 305 associated with all measurements (i.e. an overall size axis), PCA2 (9%) described the trade-306 off between beak size vs. tail, tarsus and wing length, PCA3 (5%) the trade-off between beak 307 width and depth vs. beak length, PCA4 (4%) the trade-off between tarsus length and tail 308 length, and PCA5 (2%) the trade-off between wing length, and tail and tarsus length. 309 Using the five PCA axes, we built kernel density hypervolumes using the BAT R package 310 (Cardoso et al., 2015) and the one-class support vector machine method (SVM, Blonder et 311 al., 2018). We used SVM as it has been previously shown to work well for building avian 312 functional morphospace (e.g., Cooke et al., 2019), we are confident the functional outliers in 313 our data represent the true boundaries (Blonder et al., 2018), and we wanted the hypervolume 314 to represent a 'tight wrap' to the data. When using SVM, we increased the default 315 'svm.gamma' parameter to 0.8 while keeping the 'svm.nu' parameter at its default value of 316 0.01. These values were found to generate sensible looking spaces that produced relatively 317 tight (but not restrictive) wraps to the data; however, we also tested a range of other values 318 (see Appendix S4 and Tables S2 and S3). We used the default samples per point values. 319 We built separate hypervolumes for (i) non-threatened island endemics ('NTE') and (ii) 320 threatened island endemics ('TE'). We then calculated pairwise hypervolume dissimilarity 321 (Btotal; Jaccard-family) between NTEs and TEs using the 'kernel.beta' function and the BAT 322 R package (Mammola & Cardoso, 2020; see also Ulrich et al., 2017 for discussion of a 323 similar metric). We partitioned the overall Btotal (Jaccard-family) into replacement (Brepl) 324 and net difference in amplitude (Brich) components. We also calculated the unique portion of 325 combined functional space occupied by each individual hypervolume, as their unique volume 326 divided by the total volume (i.e., the union of the two in the pair). We tested whether the 327 observed Btotal and unique portion values were significantly smaller or larger than expected 328 by randomly classifying 1,702 (the number of observed island endemics, minus the five kiwi 329 species) of the full set of extant global bird species as island endemics, and then randomly 330 classifying 526 of these as threatened, and re-calculating the metrics. This was repeated 999 331 times to create null distributions for each metric. We repeated the null modelling using the 332 extant island endemics dataset (again minus the kiwis) as the species pool. Given PCA1 333 explained 77% of the variation in traits and was an overall size axis, we also repeated the 334 hypervolume analyses using body size corrected traits. For this, we ran eight simple linear 335 regressions with a given morphological trait as the response and body mass (both logtransformed) as the predictor; the residuals from each model were then used as the new trait. 336 337 With the scaled residual traits and body mass, we re-ran the PCA and hypervolume 338 calculations. All analyses were undertaken using R (Version 4.1.0; R Core Team, 2019). The 339 hypervolume null models were run across two 20-core 128GB clusters (~1,500 core-hours). 340 The R code and data used are available on GitHub ("txm676/islandbirds").

341 **RESULTS**

342 Overview of threatened and extinct island endemic birds

In regard to the review of the published literature, Table 1 provides an overview of 29 studies
focused, at least in part, on threatened and/or extinct island birds, particularly those that
included some element of functional trait analysis. We draw on many of these studies in the
'Discussion' section below.

347 In regard to the analysis of the IUCN Red List data, compared to non-island-endemics, there
348 were relatively high numbers of island endemic bird species in each of the four most severe

349 IUCN Red List categories (i.e., EX, CR, EN and VU, Fig. 1a), and the proportion of 350 threatened and extinct species was much higher for island endemics than non-island endemic 351 species (Fig. 1b). Eight percent of island endemic species (known to be present in 1500 CE; n 352 = 149) are classified as extinct by the IUCN, compared to 0.002% of non-island-endemics. Across all extant island endemic species, 31% (n = 530) are classified as threatened; the same 353 354 proportion for non-island-endemic species is 10%. Figure 2 provides order-level summary 355 information on the percentage of threatened species, both for all species and just island 356 endemics. Fig. 2 provides further evidence that, for almost all avian orders, the proportion of 357 island endemics that are threatened / extinct is (often much) larger than the proportion of all 358 species that are threatened / extinct. Of the 530 threatened island endemic species, 371 have 359 decreasing population trends, 38 are increasing, with 97 stable and 24 unknown population 360 trends. Thirty-nine Critically Endangered endemic species (35% of all endemic CR species) 361 have a total global population size of less than 50 individuals. We also found evidence of 66 362 island endemic subspecies extinctions (or likely extinctions) (Appendices S1 and S2). In regard to threats (in the species' IUCN listings) faced by threatened island endemics, when 363 364 all threat timings and severity levels were included, the threats affecting the most species according to the IUCN Red List were agriculture and aquaculture, biological resource use 365 366 (e.g., hunting), invasive species and disease, and climate change (Fig. 3). A chi-square test 367 was not significant ($\chi^2 = 29.8$, df = 20, P = 0.07), but analysis of the Pearson's residuals and

cell contributions (Fig. S1 in Appendix S5) indicated that there were more CR species
threatened by invasive species, and fewer by biological resource use, than expected, and more
endangered and fewer vulnerable species threatened by human intrusions and disturbance
(e.g. wars) than expected. When only immediate threats causing rapid species declines were
included, the patterns were similar with the exception that a lower proportion of species were

threatened by climate change and pollution, and no species were threatened by transportation(Fig. 3).

375 Overview of all known island bird extinctions

Only species that have gone extinct since 1500 CE are included in the IUCN Red List and are thus the focus of our main analyses. However, compiling data on all known bird extinctions over the last 125,000 years reveals approximately 595 bird species have gone extinct, of which 477 (80%) are island endemics (F. Sayol & T. Matthews, unpublished data). Thus, approximately 22% of island endemic bird species, present 125,000 years ago, are known to have been driven extinct.

382 Threatened and extinct species hotspots

Threatened island endemic species are found on a wide range of island groups across the 383 384 world, but hotspots include the Philippines, several island groups within Indonesia, 385 Madagascar, Hawaii, the Caribbean, New Zealand, and the Bismarck and Solomon 386 archipelagos (Fig. 4a). Several other Pacific island groups support numerous threatened 387 endemic bird species. A wide range of island groups have also seen species extinctions (Fig. 388 4b), with the four most affected being the Mascarene Islands (32 extinctions), the Hawaiian 389 Islands (27), New Zealand (13) and the Society Islands (10). Overall, Polynesia and 390 Melanesia, the Caribbean, East Asian islands and the island groups around Madagascar have 391 all seen large numbers of extinctions. The full lists of threatened and extinct island endemic 392 species per island group are provided in Table S4 in Appendix S5.

393 Null model analyses

- 394 There were significantly more extinct, CR, EN, VU and all threatened (TH) island endemic
- 395 species than expected; all ES and empirical *P*-values were the maximum value (i.e., ES =
- 396 3.891; and *P* equivalent to < 0.001) (Fig. S2).

397 Taxonomic order

398 When using the all-species dataset as the species pool, there were always significantly fewer 399 passerines (perching birds) and Piciformes (including woodpeckers and barbets) than 400 expected by chance within all five categories of species (EX, CR, EN, VU and TH), and 401 Caprimulgiformes (nightiars and hummingbirds) in all except CR. There were significantly 402 more Columbiformes (pigeons and doves) in all categories, Psittaciformes (parrots) in all 403 except EN, and Gruiformes (including cranes, crakes and rails) in all except CR and EN (Fig. 404 5). A number of other orders were also significantly over (e.g., Strigiformes - owls) and 405 under (e.g., Galliformes - game birds) represented in certain IUCN Red List status categories 406 (Fig. 5). The Anseriformes (waterfowl) were overrepresented amongst extinct species. Using 407 the all-island endemics dataset as the pool resulted in more conservative results (Fig. S3), 408 particularly in regard to the CR and EN threat status groups, where the only significant result 409 was fewer threatened passerines than expected by chance. All ES and empirical P-values are

410 provided in Table S5.

411 Functional traits

412 In terms of traits, and when using all extant species (or the all-species dataset for the extinct 413 species analyses) as the species pool, there were significantly more threatened and extinct 414 flightless island endemic bird species than predicted by the null models (Fig. 6). Observed 415 threatened island endemic median HWI and body mass were both significantly higher than 416 expected given the null models (Fig. 6). Median body mass of extinct species was also 417 significantly larger than expected. There were significantly more forest and marine, and 418 fewer grassland, threatened island endemics than expected given our null model. There were 419 significantly more aquatic predator, omnivorous and vertivorous threatened island endemic 420 species than expected, while there were fewer granivorous, invertivorous and nectivorous 421 species (Fig. 6). None of the trophic level categories were significant. For beak morphology, 422 the volume of the hypervolume built using the beak traits of threatened island endemics was 423 significantly larger than expected given the null model. Using only island endemic species as 424 the pool resulted in broadly similar results (Fig. S4). The main differences related to habitat; 425 for the island pool analyses there were significantly fewer threatened forest species 426 (compared to significantly more for the all-species pool), significantly more wetland species 427 (compared to non-significance for the all-species pool) than expected, and no significant 428 difference for grassland species. All ES and empirical P-values are provided in Tables S6 and 429 S7.

430 Individual trait differences between threatened and non-threatened island endemics

431 Body mass (larger average for threatened species), HWI (larger average for threatened species) and beak morphology PC1 (larger average for threatened species, meaning larger 432 433 average beak size) all significantly differed between threatened and non-threatened island 434 endemic species (Wilcoxon test *P*-values all < 0.01) (Fig. 7), while beak morphology PC2 did 435 not (P = 0.32). For the categorical traits, the chi-square tests were significant for both habitat $(\chi^2 = 84.4, P < 0.001)$ and trophic niche $(\chi^2 = 52.5, P < 0.001)$; Fig. 7 indicates that threatened 436 island endemic species contained a lower proportion of forest, grassland, invertivorous and 437 438 nectivorous species, and a higher proportion of marine, wetland, aquatic predator and 439 vertivorous species, than non-threatened species. These findings largely match with those 440 presented in Figures 6 and S4.

441 Comparing functional morphospaces using hypervolumes

When comparing the hypervolumes of non-threatened island endemics ('NTE') with threatened island endemics ('TE'), overall dissimilarity (Btotal) was moderate (0.45; zero representing identical, and one representing completely dissimilar, assemblages), with the largest unique portion of the combined hypervolumes represented by TEs (26% of the union 446 of the two hypervolumes) compared to NTEs (20%). Brepl (0.38) comprised a larger portion 447 of Btotal than Brich (0.07) (Fig. 8). The hypervolume for TEs (volume = 52.6) was larger 448 than that for NTEs (48.0). When using the global extant species pool, the null modelling 449 indicated that, while the observed overall Btotal was not significantly different than expected, 450 the unique portion represented by non-threatened island endemics was significantly lower, 451 and the unique portion represented by TEs significantly larger, than expected by chance (Fig. 452 8). Equivalent findings were observed when using the extant island species pool (Fig. S5). 453 When using body size corrected traits, Btotal was similar (0.56), and TEs represented an even 454 larger unique portion of combined hypervolumes (43% vs. 15% for NTEs). The main 455 difference was that Brepl (0.28) and Brich (0.29) comprised similar fractions of Btotal (see 456 Appendix S5 for the full results).

457 **DISCUSSION**

458 Overall conservation status of island endemic birds

459 In the present study, we have combined a review of the published literature (see Table 1) with 460 an analysis of various data sources in order to provide an overview of the conservation status 461 of the world's island endemic bird fauna. One disheartening observation is that 8% (n = 149) 462 of island endemic species classified by the IUCN have gone extinct since 1500, which is 463 orders of magnitude larger than the extinction rate for continental bird species over the same 464 time period (Pimm et al., 2006). These results align with several previous studies reporting 465 that island species have suffered disproportionate numbers of extinctions (Pimm et al., 2006; 466 Whittaker & Fernández-Palacios, 2007; Szabo et al., 2012; Loehle & Eschenback 2012; 467 Whittaker et al., 2017; Sayol et al., 2020; Fromm & Meiri, 2021; see also Table 1). Another 468 alarming finding is that almost half of all island endemic birds (that were known to be extant 469 in 1500 CE) are either extinct or threatened with extinction. This number is also a

470 considerable underestimate. First, it does not include species that went extinct as a result of 471 human actions prior to 1500 CE. Pre-1500 CE human communities are known to have caused a large number of avian extinctions on islands through hunting, the introduction of non-native 472 473 species and habitat loss (Milberg & Tyrberg, 1993; Steadman, 2006; Whittaker & Fernández-474 Palacios, 2007; Boyer, 2008; Szabo et al., 2012; Duncan et al., 2013; Hume, 2017; Russell & 475 Kueffer, 2019; Sayol et al., 2020; Soares et al., 2021, 2022; Table 1). Indeed, we found 476 evidence of at least 307 pre-1500 CE island endemic extinctions (i.e. the 8% extinct figure 477 increases to 22% if we include all known island endemic bird extinctions). Second, the 478 number of extinct island endemics is likely an underestimate as some species classified by the 479 IUCN as extant are likely extinct, given the time since they were last seen (Pimm et al., 2006; 480 Butchart et al., 2018). Indeed, the IUCN applies a "Possibly Extinct" marker for some 481 Critically Endangered species in this category. For example, the endemic New Caledonian 482 rail (Gallirallus lafresnayanus) has not been conclusively reported since the 19th century, but 483 unconfirmed reports since mean the species is still classified as CR. Overall, there are 484 estimated to be 20 island endemic bird species that have not been seen for more than fifty 485 years (Martin et al., 2022). That being said, there are some famous cases of bird species being 486 rediscovered after not having been reported for decades (so called 'Lazarus species'). For example, the black-browed babbler (Malacocincla perspicillata; although not technically an 487 488 island endemic based on the definition used here) was recently re-discovered in the 489 rainforests of Borneo after not having been reported for 172 years (Akbar et al., 2021). Third, 490 it is very unlikely that the fossils of all, even recently extinct, species driven extinct by 491 humans have been discovered and, as Pimm et al. (2006; see also Duncan et al., 2013) argue, 492 we should in fact report our numbers as species that are known to have gone extinct since 493 1500 CE. Finally, it is worth noting that these estimates do not include endemic subspecies 494 extinctions, about which much less is known historically. We found evidence of 66 likely

495 island endemic subspecies extinctions, including four from continental islands (i.e.

496 technically not island endemics based on our definition employed here), one (San Benedicto 497 rock wren) that went extinct from natural causes (volcanic eruption), and some from islands 498 that have not suffered known full species extinctions (e.g. Cyprus). The data also indicate that 499 island extinctions extend to families not otherwise represented in summaries of extinct 500 species (e.g. Paridae). Interestingly, some extinct subspecies belong to otherwise wide-501 ranging species, often with broad ecological niches (e.g. Columba palumbus maderensis), 502 indicating that the inherent vulnerabilities of island endemics extend beyond those possessing 503 high evolutionary isolation and ecological specialization.

504 While there was overlap between the threatened and extinct hotspot maps, there were some 505 notable differences (Fig. 4). For example, the Philippines and Indonesia have seen no post-506 1500 CE extinctions of island endemic species, but support large numbers of threatened 507 species, while the Mascarenes suffered a larger number of extinctions than remain as 508 threatened species, indicating perhaps that the majority of the most sensitive endemic species 509 have already been lost (see also Johnson & Stattersfield, 1990). These differences could be 510 due to one or a combination of the i) larger number and size of islands in the Philippines and 511 Indonesia buffering endemics from extinction to a certain extent, ii) better knowledge of 512 extinctions (e.g., higher density of fossil excavations) in the Mascarenes and the fact that 513 several areas of the Philippines and Indonesia are relatively understudied, or iii) focus here 514 only on post-1500 CE extinctions. It should also be noted that this analysis does not include 515 subspecies extinctions, and only relates to species classified as Extinct by the IUCN. The 516 Philippines in particular has seen extinctions of numerous subspecies (n = 8), including the 517 Cebu white-bellied woodpecker (Dryocopus javensis cebuensis), endemic to the island of 518 Cebu in the Philippines and not seen for over 50 years. In addition, various full species 519 endemic to these island groups have also not been convincingly reported for decades, and, as

discussed above, are possibly extinct despite still being classified as CR by the IUCN. These
include the Sulu bleeding-heart (*Gallicolumba menagei*), a species that has no confirmed
records for over 100 years.

523 In terms of threatened species, the Philippines was the 'hottest' hotspot, with almost double 524 the number of threatened species of the second ranked hotspot (Hawaii). However, the 525 comparison with other island groups is slightly unfair given that, for ease, we considered the 526 Philippines as a single archipelago despite its size. Regardless, what can be said with 527 certainty is that the biogeographic region encompassing the Philippines, Malaysia, Indonesia 528 and Papua New Guinea, a region known to support large amounts of threatened biodiversity 529 (Johnson & Stattersfield, 1990; Mittermeier et al., 2011), is home to a substantial number of 530 threatened island endemic birds (Fig. 2) and is thus an essential focal point for future avian 531 island conservation efforts.

532 Threats and variation in sensitivity between orders

533 Our analyses build on the findings of previous studies to highlight that the main threats to 534 island endemic bird species are agricultural expansion, introduced species and biological 535 resource use (e.g., hunting) (Table 1; Johnson & Stattersfield, 1990; Spatz et al., 2017; 536 Leclerc et al., 2018, 2020b; Russell & Kueffer, 2019; see Lees et al., 2022, for a review of 537 threats to all bird species), with climate change expected to become an increasingly prevalent 538 threat going forward (e.g., see Leclerc et al., 2020a, for a vulnerability assessment of island 539 endemic mammals and future climate change). There is a large literature on the impacts of 540 introduced species on island species, in particular the loss of many endemic seabirds and 541 ground-nesting birds due to predation from introduced cats and rats (Bellard et al., 2016; 542 Spatz et al., 2017; Richards et al., 2021; Marino et al., 2022). Our analyses indicate that CR 543 species in particular are threatened by introduced species, highlighting the urgency required

544 to deal with this issue on many islands before it is too late. While also an issue in continental 545 systems, the effects of biological resource use, and especially hunting, are particularly acute on islands due to the small population sizes of many island endemics coupled with the small 546 547 nature of the island themselves and thus lack of refugia (Steadman, 2006; Whittaker & 548 Fernández-Palacios, 2007; Matthews et al., 2020b). While all the aforementioned drivers are 549 detrimental when occurring in isolation, we found that many species are affected by more 550 than one driver and it is likely that certain drivers will interact in a multiplicative fashion 551 (Holdaway & Jacomb, 2000). For example, the loss and degradation of natural habitat opens 552 up areas for introduced species to more easily spread through the landscape (Johnson & 553 Stattersfield, 1990). One important thing to highlight is that habitat loss and fragmentation, 554 known to be primary drivers of species loss across taxa (Haddad et al., 2015), are not 555 included as specific threats by the IUCN but are instead incorporated within multiple 556 different threats (e.g., agricultural expansion).

557 When using all global species as the species pool, our analysis of taxonomic orders found that 558 certain orders of island endemic birds are particularly threatened, such as those including 559 pigeons, crakes and rails, parrots and owls. These orders tend to contain species that possess 560 particular traits that place them at risk of extinction, including flightlessness and large body 561 size, and in the case of parrots, colourful feathers that put them at the risk of collectors 562 (Boyer, 2008; Spatz et al., 2017; Lévêque et al., 2021). Interestingly, the results for 563 Gruiformes (which includes the rails) were non-significant for Critically Endangered and 564 Endangered species, which could indicate that the most sensitive species have already gone 565 extinct; further evidence for this is provided in Figure 5 which shows that more Gruiformes 566 have gone extinct since 1500 than expected based on our null model.

567 We also found that the orders including pigeons, rails, parrots and ducks have suffered

568 disproportionate numbers of island extinctions (see Szabo et al., 2012; see also Steadman,

569 2006 and Lévêque et al., 2021, for discussions on island rail extinctions). Pigeons and rails 570 are one of the small groups of birds known to be substantially negatively impacted by both 571 introduced species and habitat loss (Owens & Bennett, 2000), which likely partly explains 572 this observation. As outlined above, these species also possess traits that make them very 573 vulnerable to human activities, such as hunting and species introduction. In fact, perhaps no 574 other group better illustrates the colossal loss of island birds than the Columbidae (pigeons 575 and doves). Hume (2017) lists 47 Columbidae taxa (note this includes certain taxa listed by 576 the IUCN as CR but for which no confirmed records have been reported for decades) that are 577 known to have gone extinct due to human actions (both pre- and post-1500 CE), almost all of 578 which were island species, including four turtle doves (Nesoenas), a range of flightless taxa 579 such as the dodo (Raphus cucullatus), the St Helena pigeon (Dysmoropelia dekarchiskos) and 580 numerous ground doves (Alopecoenas), four blue pigeons (Alectroenas), and four imperial 581 pigeons (Ducula). Of the few non-island species, the passenger pigeon (Ectopistes 582 *migratorius*) is perhaps the most famous. Interestingly, many relatively small islands were 583 historically able to support surprising numbers of endemic pigeons, although this is no longer 584 the case. For example, Henderson Island in the South Pacific, an island of only 37 km² and a 585 maximum height of 33 m, once supported four pigeon species, three of which (the Henderson 586 imperial pigeon Ducula harrisoni, Henderson archaic pigeon Bountyphaps obsoleta, and 587 ground dove Pampusana leonpascoi) have been driven extinct (Hume, 2017). 588 Many of the aforementioned groups are known to be over-represented in threatened birds 589 more generally (Bennett & Owens, 1997), although other bird groups known to be generally 590 threatened (e.g., Galliformes - game birds; Bennett & Owens, 1997) were not found to be 591 over-represented amongst island endemics. This could be due to their general under-592 representation on islands, likely owing to their lower dispersal ability. Alternatively, it could 593 be due to a lack of representation in the fossil record for these groups. For example, in

594 relation specifically to Galliformes, a recent study described three newly discovered extinct 595 species of quails in Madeira and Cabo Verde (Rando et al., 2020); all three species are 596 believed to have been flightless, likely explaining their extinction after human colonisation of 597 these islands. Across all categories (extinct through to all threatened species), we found that 598 there were fewer passerine species than expected. This could be driven by the fact that non-599 passerines tend to be larger, with lower reproductive rates, and are thus more at risk of threats 600 such as hunting (Pimm et al., 2006). In addition, the order-level focus will likely have 601 masked patterns at lower taxonomic levels within passerines, such as the Fringillidae 602 (finches) family that includes, amongst others, the Hawaiian honeycreepers (e.g., Fig. 1a), a 603 group that has suffered large numbers of extinctions (Hume, 2017). We also found fewer 604 threatened Piciformes than expected, but this could be biased by the relatively small number 605 of Piciformes on islands (19 extant and extinct island endemics out of a global total of 483 606 species).

607 Interestingly, when using the all-island endemics dataset as the species pool (i.e. restricting 608 the pool only to island endemics), some avian orders no longer contained more / less 609 threatened species than expected. This was most notable with Columbiformes, which were no 610 longer significantly different from expected in any of the five threat status categories (Fig. 611 S3). Columbiformes are known to be overrepresented on islands relative to their frequency on 612 the mainland, likely due to their ability to pass through the dispersal and environmental filters 613 necessary to colonise islands (Triantis et al., 2022). This could partly explain the 614 overrepresentation of these species in the threatened and extinct groups when using the all 615 global species pool. Using the all-island endemics dataset as the species pool is arguably a 616 more realistic scenario. However, it is far more conservative than using all the world's 617 species, as each sample of 530 species represents a relatively large proportion (29%) of the total 1,856 island endemics, and thus each sample will contain a considerable number of 618

actual threatened island endemics. Regardless, these results indicate that accounting for
island endemism status in analyses of this type (which several previous analyses were unable
to do, e.g. Bennett & Owens, 1997) can influence the results for certain taxonomic groups.

622 Traits associated with threatened island endemics birds

623 Our null model analyses of species functional traits revealed that there is a higher proportion 624 of flightless threatened species on islands than predicted. In birds, the increased tendency for 625 island endemics to have lost the ability to fly, most notably in Anatidae, Columbidae and 626 Rallidae, alongside the evolutionary loss of predator avoidance, is often provided as evidence 627 of the vulnerability of island endemic species (Steadman, 2006; Whittaker & Fernández-628 Palacios, 2007). Flightless species are unable to easily escape predators and are thus 629 particularly at risk from introduced species, a known extinction driver for many island taxa, 630 such as cats and rats, and indeed humans (Table 1; Duncan et al., 2002; Boyer, 2008; Wright 631 et al., 2016; Sayol et al., 2020; Fromm & Meiri, 2021).

632 Previous studies of threatened birds have found that body size is often *not* a significant 633 predictor of threat status, because different threats tend to target different sized species 634 (Leclerc et al., 2020b); larger-bodied species being more at risk from hunting, while smaller 635 species often being more at risk from habitat loss (Owens & Bennett, 2000, Chichorro et al., 636 2019). In addition, an analysis of avian extinctions in the Hawaiian Islands found that species 637 that went extinct in prehistoric times (i.e., prior to European contact) tended to be largebodied, whereas those in historic times (i.e., after European contact) tended to be mid-sized 638 639 species, possibly because the most vulnerable large-bodied species had already been lost 640 (Bower, 2008). However, in our null model and individual trait comparison analyses, we 641 found that larger-bodied island endemic species were more likely to be threatened and to 642 have gone extinct (see also Fromm & Meiri, 2021, and Soares et al., 2022). This result could

illustrate that hunting, which typically targets larger-bodied bird species (e.g., Duncan et al.,
2002, 2013), is the most pervasive threat on islands, or it could be that the traits that tend to
correlate with body size (low reproductive rates, low rates of population growth, small
population sizes, small clutch size, long intervals between clutches, larger home ranges;
Gaston & Blackburn, 1995; Bower, 2008) are driving this pattern.

648 We also observed that threatened island endemics had a higher median hand-wing index 649 (HWI) than expected given our null model (when using both species pools), and average 650 HWI was significantly larger for threatened compared to non-threatened island endemics 651 (Fig. 7). This is surprising given that HWI is positively associated with dispersal ability 652 (Sheard et al., 2020), a characteristic that is believed to negatively correlate with extinction 653 risk. This could be due to the fact that island bird species need to have high enough dispersal 654 ability to reach many islands in the first place (Whittaker & Fernández-Palacios, 2007), a 655 pattern that will then be dampened by the subsequent evolution of flightlessness in many 656 lineages due to the energetic advantages of flightlessness on islands lacking mammalian 657 predators, at least before the arrival of humans (Diamond, 1981; Wright et al., 2016; Sayol et 658 al., 2020). However, the same result was obtained when the null model species pool was 659 restricted to only island endemics, and when comparing threatened and non-threatened island 660 endemics. It is also likely partly related to the high number of threatened seabirds (see 661 Richards et al., 2021), many of which have high dispersal ability but are endemic breeders on 662 only one or two islands; examples include the New Zealand storm petrel (Fregetta maoriana) 663 and Mascarene petrel (Pseudobulweria aterrima), both Critically Endangered. Indeed, re-664 running the null model analyses after removing marine species resulted in lower observed 665 HWI values and a closer match between observed values and the null distributions, although 666 the observed values were still significantly larger.

667 Our null model (Fig. 6) and individual trait comparative (Fig. 7) analyses indicated that there 668 were significantly more threatened island endemic aquatic predators and vertivores than 669 expected, but interestingly fewer invertivores. Invertivores are often listed as being 670 particularly threatened, for example, by habitat loss and climate change (Boyer, 2008; Bowler 671 et al., 2019; Stouffer et al., 2021), although Şekercioğlu et al. (2004) did report that, as a 672 guild, they contained fewer extinction-prone species than average. It is worth noting that 673 invertivores represent the dominant avian trophic niche globally, and this proportion is 674 relatively similar between all bird species (48%) and just island endemic species (44%). 675 There were also fewer threatened island endemic granivore and nectarivore species than 676 expected. One point to bear in mind is that current threatened island species patterns will be 677 biased by the fact that many island species with certain traits that predispose them to 678 extinction will have already been lost (Boyer, 2008; Leclerc et al., 2018). For example, Boyer 679 (2008; see also Carpenter et al., 2020) found that granivores were more susceptible to 680 extinction in Hawaii prior to European contact, possibly due to the specialisation of island 681 endemic birds on specific plant species. If the most vulnerable island endemic granivores 682 have already gone extinct, we would be less likely to observe a significant pattern for 683 threatened species in regard to those granivores that remain. It was not possible to test this 684 idea using the datasets we collated as we did not have trophic niche data for extinct species. 685 However, a recent study by Soares et al. (2022) did determine the primary diet type 686 (invertivore, carnivore, frugivore, granivore, omnivore and herbivore) for 759 native bird 687 species (including 214 extinct species; both pre- and post-1500 CE extinctions) across 74 688 oceanic islands. Interestingly, a simple analysis of the data in Soares et al. reveals that the 689 proportion of extinct species in each of the six diet categories is roughly similar to the 690 proportion of extant native species in each category (see Table 2), with invertivores being the 691 only group with a greater than 5% difference between extinct and extant species proportion

(26% of extinct species were invertivores compared with 39% of extant species). However, if
we look at the proportion of total species in each diet category (i.e., extant + extinct) that
have gone extinct from those islands (Table 2), it reveals that fewer invertivores (24% of the
total) have gone extinct relative to the other groups, particularly (non-invertivorous)
carnivores (41%) and herbivores (48%). Thus, it does appear that invertivores have suffered
less relative to birds in other diet groups.

698 The analysis of Soares et al.'s data, in combination with the findings of our main analyses, 699 highlights how the loss of island endemic species, and potential future loss of threatened 700 species, has likely affected (and will likely affect) key ecosystem functions on islands, 701 including scavenging, nutrient recycling, pollination and herbivory (see several studies listed 702 in Table 1, including Boyer, 2008; Boyer & Jetz, 2014; Heinen et al., 2017; Carpenter et al., 703 2020). For example, the loss of non-invertivorous carnivores (vertivores), which we also 704 found were more threatened with extinction than expected, can lead to increases in the 705 population sizes of species lower down the trophic pyramid, including species considered 706 pests by humans (Şekercioğlu et al., 2004). As a second example, our analysis of beak 707 morphology indicated that threatened endemics incorporate unique areas of beak morphospace (Fig. 6), particularly larger overall beak sizes (Fig. 7). This is also likely the 708 709 case for many extinct species given that they tended to be larger and flightless, and thus will 710 have often occupied distinct feeding niches (Sayol et al., 2021). Beak size and shape are 711 linked to a number of ecosystem functions provided by birds, such as seed dispersal, as they 712 are directly related to resource use (Pigot et al., 2020; Tobias et al., 2020). As such, the future 713 loss of these threatened species, coupled with the species already lost to extinction, will likely 714 have severe impacts on many important functions. Indeed, the loss of frugivorous species has 715 been shown to have affected forest regeneration on the islands of Reunion (Albert et al., 716 2021) and Guam (where all native vertebrate frugivores have been lost, Caves et al., 2013)

due to the reduced dispersal of (particularly large-seeded) fruiting plant species (Thébaud &
Strasberg, 1997). This issue is particularly pertinent on islands given that the non-avian taxa
that also undertake these roles on mainlands (e.g., large non-volant mammals) are often
absent from islands (Whittaker & Fernández-Palacios, 2007).

721

The functional space occupied by threatened island endemic birds

722 It was apparent that, although comprising fewer species (526 vs. 1176), threatened island 723 endemics occupy a larger volume and distinct areas of morphospace compared to non-724 threatened endemics (Fig. 8). In addition, these findings are conservative given the highly 725 distinct five Apteryx (kiwis) species (four of which are threatened), endemic to New Zealand 726 and located in a completely different part of morphospace to the rest of the world's birds (see 727 also Pigot et al., 2020), were excluded. This finding has potential conservation implications 728 as it indicates that the loss of these threatened island endemics will substantially reduce the 729 functional trait space of island endemic birds (see also Leclerc et al., 2020b; and see Cooke et 730 al., 2019, for similar conclusions regarding bird species in general), which could have knock-731 on effects on island ecosystem functioning given the aforementioned functional roles birds 732 provide (Şekercioğlu et al., 2004; Dirzo et al., 2014; Lees et al., 2022). This aligns with the 733 recent findings of Sayol et al. (2021; see also Table 1) who, in analysis of extinctions on nine 734 archipelagos, found that extinct species occupied distinct areas of morphospace relative to 735 extant and introduced species. It is worth noting that non-threatened island endemics, many 736 of which are still affected by anthropogenic activities (Fig. 3), also occupy distinct areas of 737 island endemic morphospace. Thus, any future change in the status of these species could 738 also have important implications for island ecosystem functioning.

739 Future research

Our review and analyses have shown that island endemics are disproportionately threatened
with extinction, and represent the large majority of known extinctions, although this situation

742 may now be in the process of changing given the increasing extinction rates observed in 743 continental species (Pimm et al., 2006; Butchart et al., 2018; Lees et al., 2022). As a next 744 step, what is necessary is to move beyond analyses of the numbers / proportions of threatened 745 and extinct island endemics, to a focus on the wider impacts of this species loss. Early work 746 in this area has been revealing, indicating that island bird extinctions have resulted in large 747 declines in functional diversity in specific island regions (e.g., Boyer & Jetz, 2014; Sayol et 748 al., 2021), with the disproportionate loss of particular guilds affecting wider ecosystem 749 processes on islands, such as predation of soil and leaf-litter invertebrates (Boyer & Jetz, 750 2014), and the aforementioned examples of fruiting tree seed dispersal (Caves et al., 2013; 751 Heinen et al., 2017; Albert et al., 2021). Further research on how extinctions have impacted 752 (and potential future extinctions will impact) specific ecosystem functions will prove 753 rewarding, as will a better understanding of how the functional roles of birds on islands 754 overlap with other taxonomic groups (Heinen et al., 2017; Carpenter et al., 2020; Albert et 755 al., 2021), particularly given some (e.g., non-volant mammals and amphibians) are generally 756 underrepresented on islands. To achieve this, it will be necessary for future studies to focus 757 on a broader range of island species and contexts. Our analyses are focused on island 758 endemics and global extinctions. However, i) island avifaunas comprise varying numbers of non-endemic bird species that also undertake functional roles, and ii) globally extant species 759 760 may have been extirpated from many individual islands.

Identifying at what point future extinctions of highly threatened species (including birds and
other taxa) could result in ecosystem collapse in individual island systems is also an
important area of future research, as is the extent to which introduced species may
compensate the functional diversity and ecosystem roles lost through extinction on islands
(e.g., Sobral et al., 2016; Carpenter et al., 2020; Sayol et al., 2021; Soares et al., 2022). For
example, in an evaluation of seed predation in New Zealand, the Mascarenes and Hawaii,

767 Carpenter et al. (2020; see Table 1) found that, while introduced birds (including many game 768 bird species) and mammals were functionally similar to some of the avian seed predators that 769 have gone extinct on the islands following human arrival, many extinct species have no 770 functional equivalents, which will likely impact this particular ecosystem function. For 771 example, the extinct moa-nalo, a group of large flightless Anatidae that were endemic to 772 Hawaii and capable of destroying the largest seeds in the Hawaiian flora, have no functional 773 equivalents among the numerous introduced Hawaiian birds. Some introduced mammals in 774 Hawaii can also destroy the largest seeds, but they do so in a different way and with varying 775 consequences on seed dispersal (Carpenter et al., 2020). To take another example, looking at 776 the overall functional diversity of birds on nine archipelagos, Sayol et al. (2021) found that, 777 while introduced species had often compensated for the loss of extinct species in terms of 778 species numbers, they did not fill the gap left by extinctions in terms of overall functional 779 diversity. Soares et al. (2022) found similar patterns in an analysis of birds on 74 oceanic 780 islands. Similar research in other island groups and for other taxa and ecosystem functions is 781 clearly warranted.

782 Another outstanding question of interest in regard to island birds and ecosystem functioning 783 relates to the prevalence of functional extinction. Many island endemic birds are still extant, 784 and thus still included in analyses of island functional diversity, but are present in such low 785 numbers that it is unlikely they contribute in any meaningful way to ecosystem processes. For 786 example, the Cebu flowerpecker (Dicaeum quadricolor) is endemic to the Philippines and 787 had an estimated population size of only 60-70 mature individuals in 2005 (Billerman et al., 788 2022). Indeed, we found that 35% of all endemic CR species had a global population size of 789 less than 50 individuals. Analyses of the contribution of these 'functionally extinct' species to 790 overall island functional diversity are thus warranted. Linked to this, it would be useful (for 791 many reasons) to determine which of those island endemic species that have not been

792 recorded for decades are in fact extinct (Martin et al., 2022). This is not a straightforward 793 task, given the remote nature of most of the islands in question, and the fact that many are uninhabited. However, initiatives such as the 'Search for Lost Birds' (supported by Re:wild, 794 795 American Bird Conservancy, and BirdLife International) which helps fund and organise 796 expeditions to search for such 'lost' species should provide vital information in this regard. 797 Finally, there are a lack of continuous functional trait data for extinct species, which is 798 understandable given that many extinct island bird species are only known from a small 799 number (sometimes a single set) of sub-fossil remains (Steadman, 2006; Hume, 2017). Aside 800 from further fossil excavations, which are evidently required but are also time and resource 801 intensive, the development and testing of alternative approaches for estimating extinct species 802 trait data is required. For example, this could include identifying and using the closest extant 803 relative (Triantis et al., 2022), and machine learning techniques (Fromm & Meiri, 2021) and 804 related trait imputation methods (Sayol et al., 2021; Marino et al., 2022).

Overall, we have shown that the world has lost a substantial number of island endemic bird species (and sub-species) due to anthropogenic activities, including many highly distinctive species with unique functional roles. Worryingly, if current trends continue, we can expect the loss of many more, with concomitant reductions in functional diversity. In this way, island birds can be seen as being representative of island biodiversity more generally (Whittaker et al., 2017), highlighting the necessity of increasing conservation activity in island environments.

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- 818 needed to carry out this work.

819 DATA AVAILABILITY STATEMENT

- 820 The data are available on DRYAD (https://doi.org/10.5061/dryad.9w0vt4bjn). The code is
- 821 available on GitHub (txm676/islandbirds).

822 AUTHOR CONTRIBUTIONS

- TJM, JPW, FS, JPH, JAT, FCS, CT, TEM and KAT collected the data; TJM analysed the
- data with input from PC, FS, and WU; TJM led the writing, and all authors contributed to the
- 825 writing and interpretation of the results.

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1059 **BIOSKETCHES**

1060 Tom Matthews is a macroecologist and biogeographer at the University of Birmingham,

1061 UK. He is interested in the application of macroecological methods to global environmental

1062 change questions, and he has a particular interest in islands and the impacts of human actions

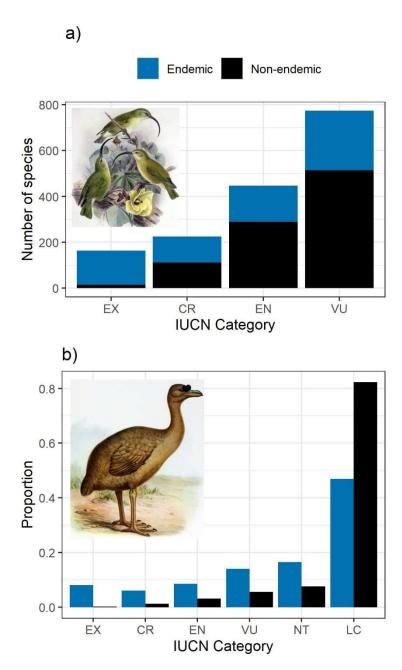
1063 on island biodiversity.

1064

1065 SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Informationsection.

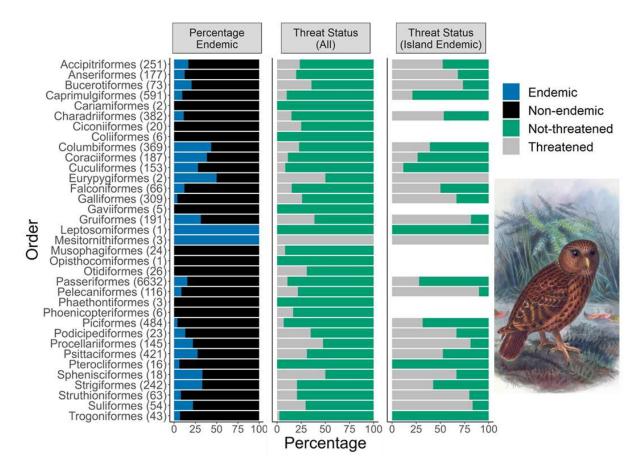
1069 FIGURES



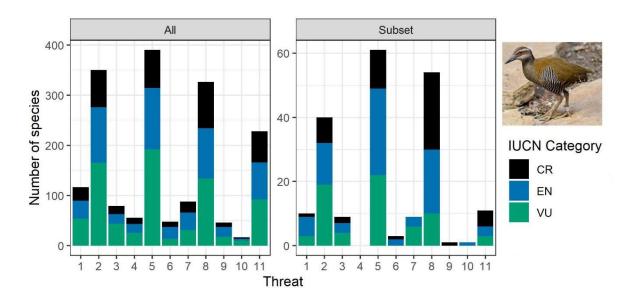


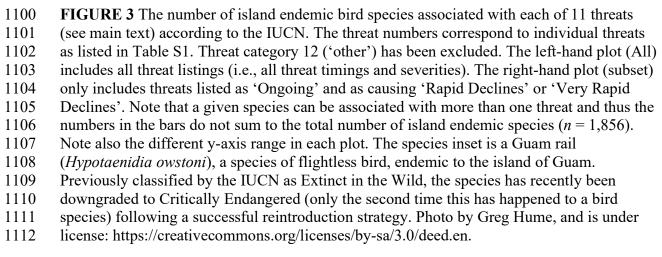
1072 FIGURE 1 a) The number of bird species in four different IUCN Red List categories (EX = 1073 Extinct, CR = Critically Endangered, EN = Endangered, and VU = Vulnerable), split by 1074 island endemism status (endemic and non-endemic). b) The proportion of species in each 1075 category, plus those classified as Near Threatened (NT) and Least Concern (LC). The proportion of island endemic species in each category was calculated relative to the total 1076 1077 number of island endemics (1.856), while the non-island-endemics proportions were relative 1078 to the total number of non-island-endemics (9,256); both totals included extinct species. The 1079 species inset in (a) is a Maui Nui 'akialoa (Akialoa lanaiensis), a Hawaiian honeycreeper that was driven extinct by the end of the 19th century (drawn by Lionel Walter Rothschild and 1080 1081 John Gerrard Keulemans); the species in (b) is a Rodrigues solitaire (Pezophaps solitaria), an

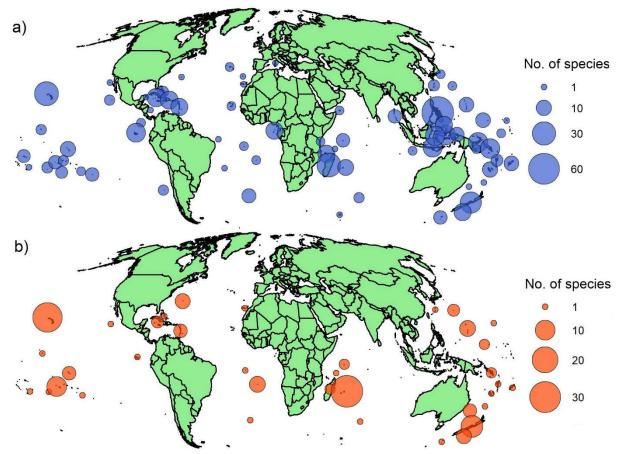
- extinct flightless bird that was endemic to the island of Rodrigues, east of Madagascar (drawn
 by Frederick William Frohawk). Both pictures are in the public domain.
- 1084
- 1085



1087 FIGURE 2 The proportion of species (including historically extinct species) in each avian 1088 order (n = 36) that are island endemics, and the proportion of all species [Threat (All)] and of island endemics [Threat (Isl.)] that are threatened with extinction / extinct. The numbers in 1089 1090 parentheses represent the number of species in each order (11,112 species in total; all values are calculated after the removal of Data Deficient species). The gaps in the furthest right-1091 hand column are orders with no island endemic species. Here, threatened also includes 1092 1093 extinct species (i.e., Extinct, Critically Endangered, Endangered and Vulnerable species). The 1094 image inset is a laughing owl (Sceloglaux albifacies rufifacies; drawn by John Gerrard Keulemans and in the public domain), endemic to New Zealand and driven extinct by 1095 introduced species and specimen collecting by the early 20th century. 1096







1115 **FIGURE 4** Hotspot maps of a) threatened and b) extinct island endemic bird species,

1116 according to the IUCN Red List. In (a) all threatened island endemic species (i.e., those

1117 classified as Critically Endangered, Endangered, and Vulnerable) are included. Threatened

species endemic to multiple island groups were double counted. Only native ranges (i.e., not

1119 introduced ranges) were included, and for seabirds, we only focused on islands used for

1120 breeding. In (b), only species classified as Extinct by the IUCN are included (i.e., species that

1121 went extinct since 1500 CE). Antarctica was cropped out of both maps to save space (no

- threatened or extinct species were located on Antarctic islands. A Mollweide projection was
- 1123 used.
- 1124

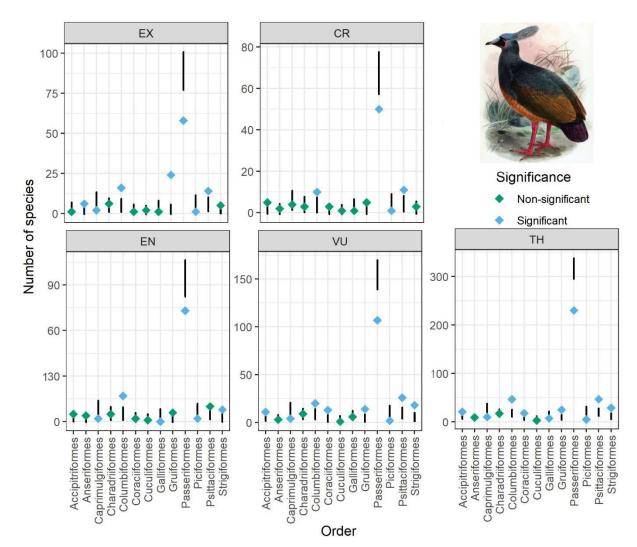
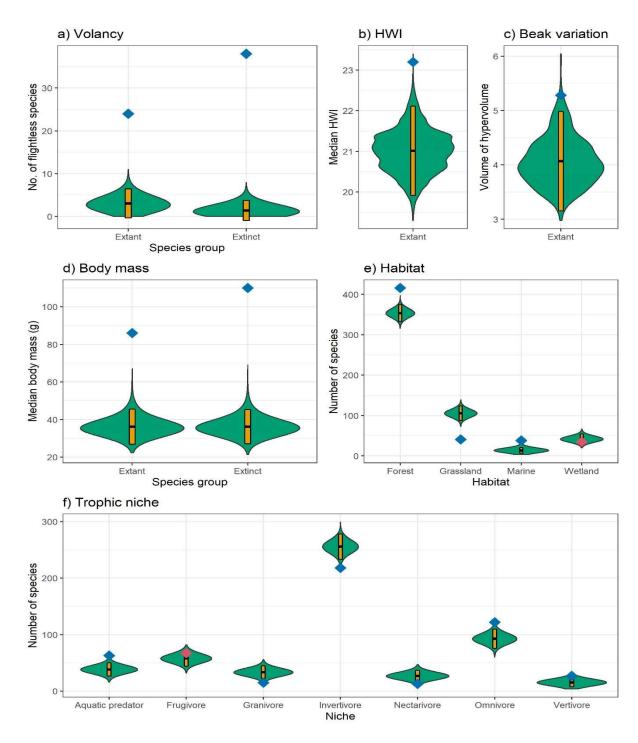
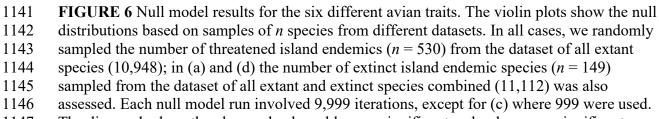


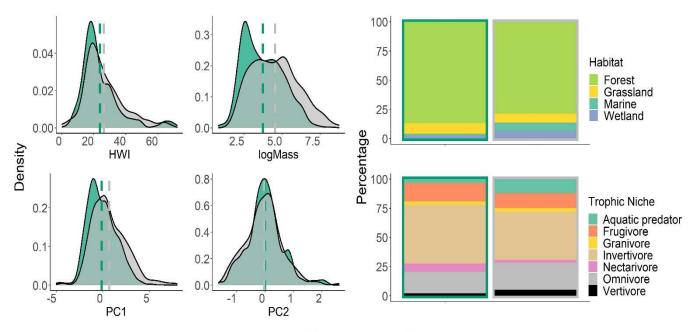
FIGURE 5 Null model results for different bird orders, split by IUCN classification category 1126 1127 (see legend of Figure 1). Here, the all-species dataset was used as the species pool. TH 1128 represents the number of threatened species classified as CR, EN and VU combined. Only the 1129 13 orders with more than 150 species were used. In each plot, the number of island endemic 1130 species with that IUCN classification were randomly sampled from the all-species dataset and 1131 the number of sampled species belonging to each of the 13 orders recorded. This process was 1132 repeated 9,999 times and the null distributions (black bars) compared with the observed 1133 number of island endemic species with that classification in each order (coloured diamonds). 1134 Effect sizes were then calculated to determine significance in each case. Note the different y-1135 axis range in each plot. The species inset is a Choiseul crested pigeon (Microgoura meeki), an 1136 extinct species that was endemic to the Solomon Islands and was driven extinct, likely largely by introduced cats, by the beginning of the 20th century. The picture was drawn by John 1137 1138 Gerrard Keulemans and is in the public domain.





1147 The diamonds show the observed values: blue are significant and red are non-significant 1148 cases. The barplots inside the violin plots show the mean of the distribution (black line) and

- 1149 extend to +- 2 standard deviations.
- 1150



Threatened status 🔲 Non-Threatened 🗌 Threatened

FIGURE 7 Left hand side: density distributions for (clockwise from top left) HWI, body
 mass (log-transformed), and two measures of beak morphology (PC1 and PC2), split into
 threatened (n = 530) and non-threatened (n = 1177) island endemic bird species. Dashed lines

1155 correspond to the mean of each distribution. The distributions significantly differ (according

to Wilcoxon tests) in all but PC2. Right hand side: bar charts show the proportion of each

species group represented by different species habitat classifications and trophic niches. Both

1158 are significant based on a χ^2 test.

1159

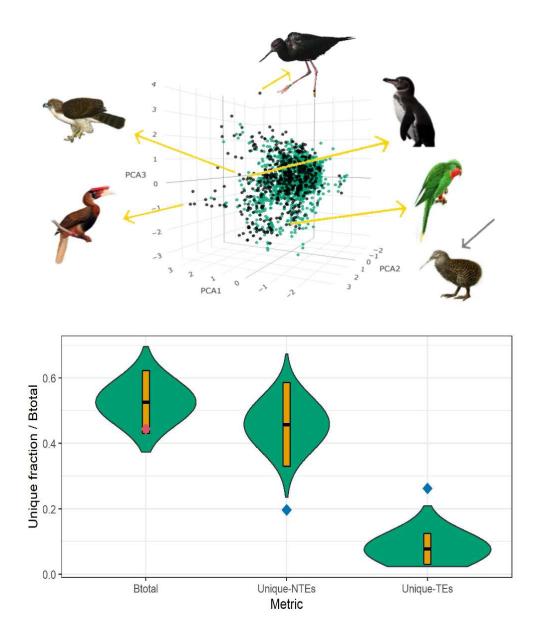




FIGURE 8 Top: functional morphospace of island endemic birds, split by threatened (black 1162 1163 dots) and non-threatened (green dots). The yellow arrows highlight specific threatened and

1164 relatively functionally distinct island endemic species, from bottom-left in clockwise

1165 direction: rufous hornbill (Buceros hydrocorax mindanensis; Vulnerable: illustration by

Joseph Smit and in the public domain), Philippine eagle (Pithecophaga jeffervi; Critically 1166

Endangered; image by Henrik Grönvold and in the public domain), black stilt (Himantopus

- 1168 novaezelandiae; Critically Endangered; image by Ben-Seabird NZ flickr, under license: https://creativecommons.org/licenses/by-nd/2.0/), Galapagos penguin (Spheniscus 1169
- 1170 mendiculus; Endangered; cut from image by Santiago Ron under license:
- 1171 https://creativecommons.org/licenses/by-nd/2.0/), and red-throated lorikeet (Charmosyna
- 1172 amabilis; Critically Endangered; illustration by John Gerrard Keulemans and in the public
- domain). The grey arrow relates to great spotted kiwi (Aptervx haastii; Vulnerable; 1173
- 1174 illustration by John Gerrard Keulemans and in the public domain), one of five Apteryx
- 1175 (kiwis) species endemic to New Zealand, four of which are threatened, and located in a
- 1176 highly distinct area of morphospace (PCA1 ~ -10, PCA2 ~-9); these species were excluded
- from the main hypervolume analysis for this reason. Bottom: results of the hypervolume null 1177

- 1178 modelling comparing threatened island endemics (TEs) with non-threatened island endemics
- 1179 (NTEs). See the main text for details and the legend of Fig. 6 for descriptions of the plot. The
- 1180 two unique components are the unique proportions of the combined hypervolumes
- 1181 represented by each hypervolume individually. The all extant species dataset was used as the 1182 species pool.

1210 TABLES

- 1211 **Table 1.** An overview of a selection of studies investigating threatened and / or extinct island
- 1212 birds. It is a non-exhaustive summary of studies, with a particular focus on studies undertaken
- 1213 at the global scale and those involving an analysis of functional trait data (bird habitat
- 1214 information classed here as a functional trait).

Study	Geog. scope	Trait data	Main findings
Bellard et al.	Global	No	60% of post-1500 AD extinctions (majority island endemics) due to
(2016)			alien species.
Blackburn et	Global	No	The probability that a bird species has been lost from each island
al. (2004) Boyer (2008)	Hawaii	Yes	positively related to number of introduced predatory mammals. Prehistoric extinctions involved larger, flightless and ground-nesting species, while historic extinctions involved medium sized species in particular diet niches.
Boyer & Jetz	Pacific	Yes	Holocene extinctions have substantially affected island avian
(2014)			functional diversity, with some islands supporting five times greater
O ((1	N	V	functional diversity prior to arrival of humans.
Carpenter et al. (2020)	New Zealand, Mascare nes and Hawaii	Yes	Prior to human arrival, all seed predation was undertaken by birds, ranging from large, flightless species (e.g., the dodo) to small volant parrots and finches. Many driven extinct by humans, and seed predation now undertaken largely by introduced game birds and mammal species.
Duncan et al.	New	Yes	Birds that were hunted to a greater degree by prehistoric humans
(2002)	Zealand		were more likely to have gone extinct.
Duncan & Blackburn (2007)	NA	No	Link between extinctions and genetic factors, and elevated extinction rates in highly endemic clades and those with large-bodied species.
Duncan et al. (2013)	Pacific	Yes	Flightless, large-bodied and single island endemic species suffered larger extinction rates. Extrapolating, at least 983 non-passerine land birds went extinct after human colonisation of remote Pacific islands.
Fromm & Meiri (2021)	Global	Yes	469 avian extinctions attributable in some way to humans, the majority being island species. Many extinct species found to be flightless, and average body mass of extinct species seven times larger than that of extant species.
Heinen et al. (2017)	Global	Yes	33 islands found to have suffered frugivore extinctions, with large and flightless species having higher extinction probabilities. An average of 34% of the pre-extinction frugivore community lost.
Holdaway	New	Yes	Evidence for the extinction of at least 77 breeding bird species on the
(1999)	Zealand		main New Zealand islands over the last 2000 years.
Hume (2017)	Global	No	Comprehensive compilation of information regarding all human- driven extinct bird species, including many island species
Johnson & Stattersfield (1990)	Global	Yes	driven extinct bird species, including many island species. Island endemics are overrepresented in terms of extinctions. Most threatened species are forest birds and, while introduced species were the leading cause of extinctions, the biggest threat was habitat loss.

Leclerc et al. (2018)	Global	No	Cultivation, wildlife exploitation and introduced species reported to be the most significant threats associated with extinct island birds, and to a lesser extent also for threatened birds.
Leclerc et al. (2020b)	Global	Yes	One fifth of island mammal and bird functional diversity supported by threatened species. Cultivation and wildlife exploitation biggest threats for island endemic birds.
Loehle & Eschenback (2012)	Global	No	The majority of mammal and bird extinctions have been on islands, with the extinction being 187 times higher than for continents.
Marino et al. (2022)	Global	Yes	IUCN classified threatened birds represented 29% of total island endemic functional richness, and birds threatened by invasive species (both those classified as threatened and non-threatened) occupied smaller functional spaces than expected given their richness.
Milberg & Tyrberg (1993)	Global	No	Evidence for over 200 prehistoric extinctions, mostly concentrated in particular orders and families (e.g., rails), in addition to evidence of distribution reductions for many extant species.
Pimm et al. (2006)	Global	No	Extinction rates are underestimated due to several reasons. Most human-driven extinctions have been on islands, but future extinctions likely to be continental species.
Richards et al. (2021)	Global	Yes	Threatened seabirds, many of which occur on islands, occupied different areas of trait space to non-threatened species; threatened species were larger, longer-lived and with narrower niche breadths.
Sayol et al. (2020)	Global	Yes	Including extinct species increased total avian richness by 5%, but quadrupled the number of flightless species.
Sayol et al. (2021)	Global	Yes	Introductions have generally not filled the functional gap left by extinct species on islands, and extinctions and introductions have resulted in functional homogenisation across archipelagos.
Şekercioğlu et al. (2004)	Global	Yes	21% of all bird species are threatened with extinction and 6.5% are functionally extinct. Island birds are particularly at risk, but this is due to their small ranges rather than any 'island effect'.
Soares et al. (2022)	Global	Yes	Although bird species extinctions and introductions combined led to an increase in the average species richness and prevalence of most functional traits per island, the average functional richness and evenness declined.
Spatz et al. (2017)	Global	No	296 highly threatened bird species breed on 1288 islands.
(2017) Steadman (2006)	Tropical Pacific	Yes	Overview of extinct birds (primarily land birds) on numerous tropical Pacific islands. Extinctions have impacted biogeographical patterns such as the island species-area relationship.
Steadman & Franklin (2020)	Bahamas	No	Evidence of distributional changes (including extinction) for 69% of species.
(2020) Szabo et al. (2012)	Global	No	141 avian species and 138 subspecies gone extinct since 2015; with a majority occurring on oceanic islands. Invasive species the most important extinction driver on oceanic islands, and hunting on continental islands.
Triantis et al. (2022) 215	Global	Yes	While pre-extinction communities exhibited community convergence, extinctions have strengthened these patterns.

1216 **Table 2.** The number of native extant and extinct species (pre- and post-1500 CE) from 74

- 1217 oceanic islands in one of six diet groups. The numbers in parentheses are the proportion
- 1218 across all values in that column (e.g., the proportion of all extinct species that were
- 1219 invertivores). The final column (Prop. Extinct) shows the proportion of total species (extant +
- 1220 extinct) in each diet group that have gone extinct. Data are from Soares et al. (2021). Note
- 1221 that the diet groupings used here differ slightly from those used in our main analyses.
- 1222

Diet group	Extinct	Extant	Prop. Extinct	
Invertivore	56 (0.26)	173 (0.39)	0.24	1224
Carnivore	30 (0.14)	43 (0.10)	0.41	1225
Frugivore	35 (0.16)	69 (0.16)	0.34	1223
Granivore	31 (0.14)	48 (0.11)	0.39	1226
Omnivore	52 (0.24)	101 (0.23)	0.34	1227
Herbivore	10 (0.05)	11 (0.02)	0.48	1221
	× /			1228