Divergent responses of pelagic and benthic fish body-size structure to remoteness and protection from humans

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Abstract :

Animal body-size variation influences multiple processes in marine ecosystems, but habitat heterogeneity has prevented a comprehensive assessment of size across pelagic (midwater) and benthic (seabed) systems along anthropic gradients. In this work, we derive fish size indicators from 17.411 stereo baitedvideo deployments to test for differences between pelagic and benthic responses to remoteness from human pressures and effectiveness of marine protected areas (MPAs). From records of 823,849 individual fish, we report divergent responses between systems, with pelagic size structure more profoundly eroded near human markets than benthic size structure, signifying greater vulnerability of pelagic systems to human pressure. Effective protection of benthic size structure can be achieved through MPAs placed near markets, thereby contributing to benthic habitat restoration and the recovery of associated fishes. By contrast, recovery of the world's largest and most endangered fishes in pelagic systems requires the creation of highly protected areas in remote locations, including on the High Seas, where protection efforts lag.

76 Introduction

77 Body size is a universal biological property that influences ecological processes at the individual, population, and ecosystem level (1). Measuring size spectra (size-frequencies 78 79 plotted on a log-log scale) is therefore a useful framework through which to understand and predict overexploitation (2), nutrient cycling (3), and productivity (4). Moreover, 80 understanding how body sizes are distributed in the oceans has ramifications for conservation 81 and fisheries science and is highly relevant to several of the UN Sustainable Development 82 Goals. In particular, effective biodiversity conservation (5) and 30% protection coverage by 83 2030 ('30 by 30' goal) (6) require understanding of how successful marine protected areas 84 85 (MPAs) are likely to be in different socio-environmental contexts (7). Within a given pelagic or benthic system, size spectra typically show consistent alternations between overrepresented 86 and underrepresented sizes, resulting in regular peaks and troughs (8, 9). When slopes of size-87 88 spectra are shallow and peaks are prominent, the spread between peaks is generally considered 89 to reflect predator-prey relationships, with each peak representing a different trophic group that is preved upon by the next, e.g. plankton, planktivorous fishes, piscivorous fishes (10, 11). 90 However, assessing such size-structured variation across marine habitats and regulations is 91 92 particularly challenging since dedicated survey methodologies with different size-selectivity are used in pelagic and benthic systems. For instance, while pelagic fishes are conventionally 93 sampled through longlines and midwater trawls or acoustic techniques (12, 13), benthic fishes 94 95 are mainly surveyed via underwater visual census (14), or with bottom-trawls and other habitatspecific gears (15), making inter-system comparisons difficult. 96

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98 Stereo baited remote underwater video stations (BRUVS) represent a unifying, non-destructive and fisheries independent method that can estimate relative abundance and body size across 99 100 virtually any marine system (16). Here, we conduct a widespread size-based assessment of 101 marine pelagic and benthic nekton fishes (>1 g), spanning 6 orders of magnitude in body size, from zooplankton size-classes (~3-4 cm), to large oceanic predators (~1,000 kg, Fig. 1). We 102 combine records from multiple surveys inside and outside MPAs, resulting in 6,701 BRUVS 103 deployed in pelagic systems and 10,710 BRUVS deployed in benthic systems, corresponding 104 to 13,402 and 10,710 hours of footage respectively, across the Atlantic, Indian, and Pacific 105 oceans. This database yield length measurements for individual fish, which were converted to 106 weights using taxa-specific allometric conversion parameters (17, 18) (Fig. 2, fig. S1). 107

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109 In order to better understand how MPAs may effectively protect fish size structure in the context of the '30 by 30' goal, we test two competing and mutually exclusive hypotheses 110 111 regarding the influence of human pressures on fish size structure in pelagic and benthic systems. First, we hypothesise a greater human footprint in pelagic systems compared with 112 benthic systems since the larger body size and longer life of many oceanic species renders them 113 more vulnerable to fisheries (19). Therefore, we expect that pelagic fish size structure is more 114 sensitive to protection status and human pressures than for their benthic counterparts. As an 115 alternative hypothesis, the migratory capacity of many large pelagic species and the widespread 116 117 activities of high-sea fishing fleets (20) result in a comparatively low human footprint and low MPA effectiveness in pelagic systems, in contrast to benthic systems where local human 118 pressure has acted longer (21) and where fish size structure would therefore be more impacted, 119 and where sedentary species would benefit more from MPAs (22). 120

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123 Body-size structure across systems

Our surveys, conducted from January 2006 to May 2020, recorded a total 823,849 individual 124 fish (pelagic: 106,424, benthic: 717,425, Fig. 2), representing 139 families and 1,460 species 125 of fishes and sharks (pelagic: 211, benthic: 1,376) and 127 species recorded in both systems), 126 weighing a combined 744 metric tonnes (pelagic: 325 Mt; benthic: 418 Mt). Our dataset lacked 127 representation from the North Pacific, and representation in the central Pacific and in most of 128 the Atlantic was limited to pelagic systems only. Size frequency distributions were generated 129 by aggregating sizes within six broad brackets of absolute latitude (Fig. 3), revealing distinct 130 patterns within each systems that were robust to an unbalanced survey design (17). Benthic 131 median sizes were generally larger than pelagic medians (range of medians; pelagic 4-134 g, 132 benthic 27-120g) due to the greater representation of smaller size classes (<30 g). Upper size-133 classes were better represented in pelagic than in benthic size distributions (range of 95th 134 135 percentiles, pelagic 0.4-83.3, benthic 1.3-2.9 kg, Fig. 3A). Size spectra slopes, a measure of the proportion of large to small individuals (17), were contrasted between systems by 136 regressing normalised size-frequency distributions on the log_{10} - log_{10} scale (Fig. 3B). Slope 137 values were consistently steeper (more negative) in benthic than in pelagic systems (table S1), 138 139 reflecting the greater absolute and relative number of large individuals in pelagic systems (17).

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141 Both the spread between peaks and size spectra slope values were distinct between pelagic and 142 benthic systems across biogeographical scales, suggesting that each system supports distinct food webs and energy pathways (23). The presence of prominent peaks in pelagic systems is 143 consistent with previous reports (10) and suggests that each peak reflects a trophic group 144 145 preved upon by the next, with shallower slopes reflecting carnivorous feeding (11). In benthic systems, peaks were less clearly defined and slopes steeper, consistent with greater levels of 146 147 herbivorous feeding (11) likely stemming from greater dependence on seabed algae compared 148 to in the midwater (24). Greater prevalence of carnivory in pelagic systems implies that the proportion of production retained between trophic levels is higher (25), as a result of more 149 direct energy transfer than in benthic systems. Overrepresentation of intermediate size-classes 150 (30-500 g) in benthic systems is consistent with complex habitat structure in coastal ecosystems 151 such as kelp forests and coral reefs (26) providing size-selective refugia (27). Elevated benthic 152 productivity within these size classes are further promoted through system connectivity and 153 benthic-pelagic coupling (28), whereby passively drifting plankton are consumed by 154 planktivorous and piscivorous fishes near the seabed (29). Conversely, pelagic productivity 155 156 and energetic needs in upper trophic levels are promoted by more direct energy transfer (11) 157 and are facilitated by greater home ranges in order to forage from the top of multiple benthic 158 food-webs (30), or from more productive geographical regions such as those in temperate 159 latitudes (31). Mobile strategies in these upper trophic levels typically involve pelagic foraging 160 incursions, or are associated with fully pelagic lifestyles (32), resulting in greater prevalence 161 of upper trophic levels in pelagic systems.

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163 Human footprint on size structure

We tested our hypotheses concerning the difference in relative sensitivity of pelagic and benthic size structure by extracting three size indicators (33) from frequency size-distributions of nekton fishes aggregated by survey date (17) (fig. S2), the typical body sizes (log₁₀, kg) of relatively small individuals and of relatively large individuals, as represented by the values at the first and second modal frequency peaks, and the exponent *b* of the size spectra slope (34). These three indicators capture dimensions of size structure within each system, at the scale of the survey day, with the size of relatively small and large individuals representing relatively

- 171 lower and higher trophic levels respectively (10), and the size spectra slope theoretically 172 reflecting the steepness of the trophic pyramid (25). We then built explanatory generalised
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least-square (GLS) models (35) to test the two competing hypotheses by identifying how 173 174 human pressure and protection status affected pelagic and benthic fish size indicators. In addition to controlling for spatio-temporal autocorrelation and socio-environmental conditions 175 known to influence the effectiveness of spatial protection status (36) (fig. S3, table S2), our 176 models considered interactions between systems (pelagic or benthic) and protection status, as 177 represented by three different categories of spatial protection (37) (not protected, partially 178 protected, or highly protected)(17), and human pressure, as represented by travel time to human 179 180 markets (38) (log₁₀ minutes).

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GLS models of relatively small and relatively large fishes achieved moderate explanatory 182 power (adjR², small individuals: 0.257, large individuals: 0.343) revealing an effect of market 183 proximity and protection status, which was consistent in direction but specific in magnitude to 184 185 each system (P < 0.05, Fig. 4A, fig. S4 to 5, table S3 to 4). In both systems, individuals were larger if highly protected and remote from markets, consistent with our current understanding 186 regarding how vulnerability and exploitation vary with protection and accessibility (36). 187 However, relatively small and large individuals in pelagic systems were both consistently more 188 189 sensitive to protection status and to market remoteness, with a cumulative impact of protection status and market remoteness. In benthic systems, relatively small individuals were less 190 sensitive to protection than large individuals, in keeping with expectations on how vulnerability 191 192 to exploitation varies with differences in life history (14, 19). Moreover, the effect of protection status saturated with remoteness, with remoteness having increasingly less relative impact 193 194 under higher protection.

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GLS models of size spectra (adjR², size spectra slope: 0.273, Fig. 4B, fig. S6, table S5) showed 196 197 divergent effects in each system, with size spectra slopes in pelagic systems showing a 198 pronounced and rapid steepening with market proximity under high protection, and marginal effects of protection status and market proximity after that. In contrast, slopes in benthic 199 systems were marginally affected, becoming less negative (shallower) near markets, 200 independently of protection status. Without protection, steepening of pelagic slopes and 201 shallowing of benthic slopes resulted in converging size structure between systems with 202 considerable overlap in slope values in unprotected locations near markets. A sensitivity 203 analysis testing the model robustness to the unbalanced survey reported similar effects of 204 market proximity, with minor differences between models re-run with 10% of randomly 205 dropped data points (17). Greater differences were observed between model re-runs with 206 ocean-specific data dropped. Notably, the results of pelagic systems being highly responsive 207 208 to highly protected remote areas were conditional on the inclusion of the Indian Ocean data 209 (fig. S9). Our main findings concerning the direction of both remoteness and protection in 210 pelagic and benthic systems remained largely unchanged from those derived using the full 211 dataset.

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Taken together, our models support our first hypothesis, that pelagic fish size structures are 213 214 more vulnerable to human pressure than their benthic counterparts. That both relatively small and relatively large individuals in pelagic systems were consistently affected near markets 215 means that greater sensitivity in pelagic systems cannot be attributed solely to the greater 216 occurrence of larger (and therefore more vulnerable) individuals. In benthic systems, the 217 218 magnitude of protection effect declined with market distance, in contrast to a cumulative effect with market distance in pelagic systems. This contrasting result means that high protection 219 220 status can - even near markets - mitigate human pressures in benthic systems, whereas 221 effective protection in pelagic systems requires market remoteness.

Our results suggest that size structure resilience to human pressure is lower in pelagic than in 223 224 benthic systems. In theory, size spectra slopes are expected to steepen with increasing human exploitation as a consequence of predator depletion, leading to a commensurate decline in mean 225 trophic level (39). However, reports of human pressure responses in benthic systems are 226 conflicting, with both a steepening size spectra slope (39) and a modest increase in mean 227 trophic level reported (14, 40). This apparent conflict may stem from difficulties in 228 229 establishing appropriate baselines in 'pristine' benthic systems, which show wide ranging size spectra slope values (39) (i.e -1.95 to -1.13) and both inverse and concave trophic pyramids 230 231 (14, 30). Our observations of only a marginal effect on benthic slopes are, in any case, 232 consistent with reports of a comparatively modest impact of human pressure on mean trophic level, which has been corroborated from across a wide range of benthic systems, and arguably 233 by a greater range of survey methods, including underwater visual censuses, scientific trawl 234 235 surveys, and stock assessments (14, 40). Our confidence that human pressure results in only marginally shallower benthic size spectra as a reflection of a comparatively minor change in 236 relative proportion of larger size classes is strengthened by the observed consistency of this 237 shallowing across protection status, but is in contrast with expectation from 'fishing down the 238 239 food web' and other predictions from size-structured biodiversity loss (41).

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241 Our results add to a body of evidence suggesting that benthic systems are relatively resilient, 242 compared to their pelagic counterparts. The emergence of benthic resilience is not fully understood and any proposed mechanism in support is speculative. However, one possible 243 244 explanation may be related to the emergence of alternative energy pathways when heavy 245 exploitation triggers trophic cascades (42). Prey releases are generally predicted to occur as a consequence of trophic cascades under predator depletion (43). However in benthic systems 246 247 such as coral reefs, prey releases can be counteracted through size-based redundancy and 248 alternative feeding strategies, promoted by high species richness (14). For example, increases in relative proportion of trigger fish and wrasse are observed to counteract prey-release of sea-249 urchin, following depletion in high trophic levels (14), resulting in greater food web flexibility 250 and resilience. Benthic habitat complexity, which offers refugia for fish of intermediate sizes 251 (30-500 g), may act further to moderate top-down control (4). Conversely, pelagic systems are 252 associated with lower species richness and carnivorous feeding strategies with larger 253 movement scales (19) across a wider range of body sizes, resulting in low size-based 254 redundancy. Trophic replacements have been reported in a pelagic food web (44), in the 255 256 Benguela upwelling, involving a benthic species (the bearded goby *Sufflogobius bibarbatus*) thriving after the depletion of sardines (Sardinops sagax), as a result of unique foraging 257 258 behaviour and physiological tolerances to anoxia. This emergence of a novel benthic-pelagic 259 association in response to external pressure suggests that lack of resilience in pelagic food webs 260 is associated with low size-based redundancy and limited alternative energy pathways.

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Disentangling ecological processes from human pressures is notoriously complicated by the 262 correlated and often confounding nature of human activities. Here, potentially confounding 263 differences in exploitation histories and fisheries practices exists between pelagic and benthic 264 ecosystems. Benthic trawl fisheries were some of the first to be developed following 265 industrialisation (45), whereas pelagic fisheries developed comparatively later (21), under 266 rising profit requirements (46). As such, a loss of baseline and a preselection of particular sizes 267 likely occurred prior to our surveys (47). However, potentially confounding histories in each 268 system is unlikely to explain the distinction in size-structured characteristics, or the divergent 269 270 responses to human pressure. This is because human pressure near markets resulted in pelagic and benthic systems that are more similar in size structure than their remote and more pristine 271 272 counterparts, with greater overlap in size spectra slope values and convergent size structure. If the effect of market distance on size spectra or the general distinction between pelagic and benthic systems were confounded by historical size preselection, we would expect to see remote pelagic and benthic systems with greater overlap in size spectra value than near market,

as a reflection of more pristine and therefore less distinct states in those remote locations, in

277 contrast to our results. Moreover, that historical baselines in pelagic and benthic systems are

278 likely more characteristic and dissimilar to each other than their present state is consistent with

- 279 hypothesised preselection from historical habitat loss (45, 48): under habitat degradation
- scenarios benthic size spectra are in fact expected to adopt characteristics more reminiscent of pelagic systems, with more pronounced peaks and greater spread (4), reflecting loss in size-
- 282 structured refugia at intermediate sizes.
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284 Policy implications

International policy, including the Kunming-Montreal Global Biodiversity Framework COP15 declaration of 30% of the ocean to be protected by 2030 (*6*) requires that extensive areas of the oceans are set aside for protection in order to enhance biodiversity, ecosystem function, and ecological integrity and connectivity. To meet multiple of the GBF targets and address several of the UN Sustainable Development Goals, our analysis addressed two questions critical to the implementation of MPAs, related to ecological indicators and MPA placement, and one question concerning sustainable fisheries practices more broadly.

- (i) Particular characteristics of pelagic systems result in size structure highly sensitive
 to human pressure and render size indicators a powerful guide for priority
 placements of spatial protection, monitoring, and ecosystem-based management. In
 benthic systems, size indicators are comparatively less sensitive, so decisions
 should be informed through other indicators such as biomass (7) or functional
 diversity (49).
- (ii) Pelagic vulnerability across multiple size classes reinforces the need for protection 298 to provide refugia and rebuild depleted populations. A reversal of ongoing marine 299 megafauna loss (19) is possible but require intervention efforts that include 300 implementation of highly protected MPAs in remote locations, including on the 301 High Seas, consistent with the new High Seas Treaty (50). Homogenisation of 302 pelagic and benthic size structures signals the extent of already-experienced human 303 impacts on benthic systems. For benthic systems, we confirm that protection would 304 offer greater relative benefits in accessible locations (7), which should also be 305 prioritised in order to rebuild coastal ecosystem. 306
- Human impact across pelagic size-classes indicate it is not just the large predators 307 (iii) 308 that are vulnerable but also smaller sizes, which underpin major fisheries such as the anchoveta and sardines (12). Whether for single species or 'balanced harvesting' 309 strategies that target the entire size spectra, pelagic fisheries remain attractive to the 310 commercial industry (12, 19). However, top-down control and low body-size 311 redundancy are characteristics that render pelagic ecosystems inherently dynamic 312 and vulnerable to overexploitation. We therefore caution against further expansion 313 in pelagic fisheries, many of which are already over- or fully-exploited, particularly 314 as long as pelagic megafauna and the top-down control they exert remain threatened 315 (19). 316 317

318 Conclusion

319 Our size-based assessment has enriched our understanding of ongoing marine biodiversity loss, revealing divergent impacts across pelagic and benthic communities, which may – as a result 320 - converge toward a common intermediate and artificial size structure. Many processes 321 important for maintaining productivity across trophic levels are supported by size-structured 322 association within coupled benthic-pelagic systems. Convergence of pelagic and benthic 323 communities toward an artificial size structure should be of concern if this result in a 324 decoupling of pelagic and benthic ecosystem components, thereby disrupting fundamental 325 326 processes underpinning functionality. Alternatively, it is plausible that these processes are 327 buffered by the emergence of novel benthic-pelagic associations, thereby ensuring resilience under size-structured biodiversity loss. To help address the uncertainty concerning the 328 functional consequence of size structure erosion, we recommend that future research effort 329 330 explores the link between size structure, ecosystem functioning, and connectivity, particularly in the context of coupled benthic-pelagic systems. Such knowledge would also have 331 application within biodiversity conservation and ecosystem restoration. 332

334 335 **Figures**



336 337 Fig. 1. Body-size variability in pelagic (left panels) and benthic (right panels) systems, 338 recorded by stereo baited remote underwater video systems (BRUVS) (A) Great white 339 shark (Carcharodon carcharias). (B) Grey reef shark (Carcharhinus amblyrhynchos). (C) 340 Yellowfin tuna (Thunnus albacares). (D) Horse-eye jack (Caranx latus). (E) Juvenile jack 341 (Carangidae sp). (F) Tiger shark (Galeocerdo cuvier). (G) Two-spot red snapper (Lutjanus bohar). (H) Spiny dogfish (Squalus acanthias). (I) Goldband fusilier (Caesio chrysozona). (J) 342 343 Creole wrasse (*Clepticus parrae*) 344



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Fig. 2. Body sizes of pelagic and benthic fishes identified on BRUVS. (A) Survey effort of BRUVS, showing the outlines of the world's Economic Exclusive Zones in grey contours (some of which are contested). Each dot represents a single expedition, with the dot diameter being proportional to the number of BRUVS deployed. Dots are jittered to minimise overplotting. (B) Pelagic and benthic fish body-sizes (kg, n=823,849) categorised by species identity (n =1,460), rank-ordered by median species body size (C) Marginal density distribution plots of body-sizes.



Body size (kg)
Body size (kg)
Fig. 3. Pelagic size spectra are shallower than their benthic counterparts across
biogeographical scales. (A) Frequency density distribution of body sizes aggregated into six
absolute latitude brackets (0-10, 10-15, 15-20, 20-23, 23-33, 33-65) of equal numbers of body
sizes (n = 137,308), with vertical line and number showing median and 95th percentile values.
(B) Abundance size spectra, normalised by dividing the frequency counts by the width of the
bin, with lines representing fit of linear regressions (pelagic slope mean: -1.38, range: -1.47 to
-1.29 ; benthic mean: -1.58, range: -1.63 to -1.54).



Fig. 4. Human influences on fish body-size structure in pelagic and benthic systems.
Marginal plots of the influence of increased travel time to market (log₁₀, minutes) on fish size
indicators under different levels of protection status (not protected, partly protected, and highly
protected). (A) Mean body size of relatively small and relatively large fishes (log₁₀ kg). (B)
Slopes of fish size spectra. Lines indicate predictions from generalised least-square models,
and shaded areas indicate 95% confidence intervals.

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401 Data availability statement

Data from New Caledonia, Tonga and French Polynesia will be made available upon acceptance on Zenodo at https://doi.org/10.5281/zenodo.7793637 for seabed BRUVS and at https://doi.org/10.5281/zenodo.7793697 for midwater BRUVS. The remaining data from the other 77 locations and reproducible code for this analysis will be made available upon acceptance at <u>https://github.com/LauraMannocci/sizespectra</u> and can be found on the FishBase BRUVS portal (www.fishbase.org).

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409 Permits

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- 433 Conceptualisation: TBL, DM, LVi, and JJM.
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- 435 Formal analysis: TBL, DM, LM
- 436 Funding acquisition: JJM, ES, TBL, LVi, DM, NM, EM
- 437 Visualisation: TBL
- 438 Writing original draft: TBL, DM, LM
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442 Competing interests

- 443 The authors declare no competing interests
- 444 445
- 446 Supplementary Materials
- 447
- 448 Materials and Methods
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- 450 Result in context
- 451
- 452 Figs. S1 to S9
- 453 Tables S1 and S5
- 454 References (51-79)

455 Material and Methods

456 Fish survey

457 We assessed size structure of fish assemblages in pelagic and benthic systems by collating data 458 from new and existing baited videographic surveys, deployed in the midwater and on the seabed, respectively. The surveys were conducted from January 2006 to May 2020, with 459 varying geographical representation of tropical, subtropical, temperate, and subarctic regions, 460 461 in the Indian, Pacific and Atlantic Ocean, ranging from 64° N to 40° S. The surveys used 462 standardised stereo baited remote underwater video systems (BRUVS, n = 17.411, Fig. 2A), described below, deployed in the midwater (n = 6,701) and on the seabed (n = 10,710), from 463 147 expeditions (66 in the midwater, 81 on the seabed) nested within 80 locations (39 in the 464 midwater, 50 in the seabed, 9 in both). 465

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467 Considerable efforts have already established the strengths and characteristics of BRUVS in accurately survey fish assemblages, and they have repeatedly been shown to be robust in time 468 and space to detect changes in marine ecosystems (51, 52). In brief, stereo-BRUVS provide a 469 470 video record of fish species relative abundance and their size which are generated through fully 471 standardised deployments and video-processing (53). A permanent video record ensures that species identifications can be retrospectively validated or revised as a function of new 472 information (e.g., independent ground-truthing) or in the case of taxonomic revisions. As is the 473 474 case for every survey method, BRUVS do not capture the entire species pool equally (54). Notably, the use of bait means BRUVS are considered particularly effective at surveying 475 476 predatory fishes and sharks at the top end of the trophic/size spectrum (55). While BRUVS are particularly suited at sampling carnivores, they also quantify herbivores and omnivores (56) 477 and we would therefore expect to quantify these taxa in a size class if present. Here, these 478 particular BRUVS consisted of a central bar with two fixed, underwater cameras (either GoPros 479 480 Hero versions 2 to 7 or - prior to 2012 - Sony HDR-CR2 version or similar), calibrated in stereo. From the central bar a bait-pole was fixed, from which a bait container (either a meshbag 481 482 or perforated cylinder) loaded with approximately 1 kg of fresh or defrosted mashed fish, 483 typically a small pelagic species like herring (Sardinops spp) or small tuna (e.g., Katsuwonus spp). The central bar was then customised for deployment using rigs tailored for either 484 midwater or seabed deployments. In midwater deployments, for surveying of pelagic systems, 485 486 the central bar was suspended at ten meters from a surface float, and counter-balanced with a 487 ballast held underneath, typically a 1-2 kg metal piece. These midwater units were then either moored on the seabed, using a separate mooring line (n = 300) or - more frequently - deployed 488 as a freely drifting string of five (57) (n = 6,400), with 200 meters of surface line separating 489 each unit. The string was left to soak, record and drift for at least two hours. Two strings were 490 typically deployed as a pair, separated by approximately 500 meters, one pair in the morning 491 492 and one in the afternoon. The daily survey regimes varied, usually as a consequence of vessel and crew capacity but ranged between 5 and 30 BRUVS (median 10) per day. In seabed 493 494 deployments, for surveying of benthic systems, the central bar was either encased within a steel frame or supported on a tripod, which was lowered to- and recovered from the seabed using a 495 tether line and surface float. These units were left to record on the seabed for one hour. The 496 number of seabed deployments ranged between 1 and 69 per day (median 13). All deployments 497 498 occurred between 08:00 and 17:30 local time.

499

After recovery, the video footage was downloaded and analysed following a set protocol using
 EventMeasure (http://seagis.com), by research technicians or postgraduate students trained in
 fish taxonomy and video analysis. The protocol consisted of identifying all fish observed on

503 footage to the nearest taxonomic resolution, and recording their relative abundance as Max*N*,

the maximum number of individuals on a single frame for a given species. Although we 504 505 expected midwater and seabed BRUVS to sample the pelagic and benthic fish size-distribution equally, small fish in benthic systems (3-4 cm) are typically cryptic (58) and may be harder to 506 spot on the portion of the seabed footage comprising benthic habitat, than against a uniformly 507 coloured background in the midwater. Lengths measurement (fork length; midwater n =508 27.697, seabed n = 297.651) were recorded at the time of MaxN. Although efforts were made 509 to measure each individual fish, this was not always possible, either because of time constraints 510 (e.g., for very high MaxN values $\sim >300$) or because the fishes were located too far from the 511 rigs for accurate stereo measurements (nominally >7 m). Individual fish not measured at the 512 time of MaxN were allocated a value in a hierarchical manner, based on availability, starting 513 with species average either from the BRUVS in question (or string, in the case of midwater 514 BRUVS), from the expedition or, from across all expeditions. All individual fork lengths (cm) 515 516 were converted to body mass (kg) using published Bayesian species-specific parameters (log a vs b) for allometric length-weight conversion from FishBase (18) (www.fishbase.org, fig. 517 S1). For individuals not identified to species, lengths were converted to weight (kg) by 518 allocating average a and b conversion parameters for the genus, family or assemblage. 519 520 Conversions were made using the R package rfishbase (59). We applied a lower cut-off point of 1 g (~3-4 cm, n=56,393) since these small individuals were probably not comparatively 521 sampled in pelagic and benthic systems, nor are the stereo measurements and allometric 522 523 conversions associated with those sizes particularly reliable. This restricted all further analysis to nekton fish size classes (>1g, ~3-4 cm, n=823,849). 524

525 526 Survey design

Surveys prior to 2012 (n=~4,000) were limited to seabed BRUVS within Western Australia. 527 Surveys outside of Western Australia, and in the midwater occurred from 2012 onwards. The 528 529 spatial design between locations varied as a function of expedition-specific differences in survey vessels type (which included small skiffs, tugboats, private yachts, fishery and 530 oceanography research vessels) and in research objectives, but was broadly aimed to cover a 531 diverse range of pelagic and benthic systems in oceanic and coastal regions. For locations with 532 recurring expeditions, subsequent expeditions either aimed for partial replacement of 533 534 previously surveyed locations or replication of a fixed survey design.

535

Habitats targeted included shallow and deep seamounts, abyssal plains, continental shelves and 536 slopes, temperate and coral reefs, and submerged banks and shoals. Midwater BRUVS 537 deployments covered a range of seabed depth from shallow to abyssal (mean depth (m), range: 538 539 642 [2-5725]). Seabed BRUVS deployments were primarily in shallow water (mean depth (m), range: 28.3 [2-468]). The survey spanned a gradient of human pressures from near coastal hubs 540 541 and cities to remote locations such as the Galapagos (Ecuador), Cocos Island (Costa Rica), the 542 Chagos Archipelago (UK), the Chesterfields Islands (France), the Ascension (UK), the Selvagens (Portugal) and Gough Island (UK), in the Atlantic, Indian, and Pacific Oceans, and 543 in marginal and often heavily exploited seas such as the Red Sea, Norwegian Sea, North Sea, 544 545 and Coral Sea.

546

547 Contrasting size structure across pelagic and benthic systems

548

Analysis of body-size frequency distributions and size spectra are highly sensitive to the spatio-549 temporal and taxonomic scale across which sizes are aggregated (60). Our analysis was 550 551 therefore hierarchical, at two levels, to capture different ecological processes that may be

occurring at either biogeographical scales or at the scale of the survey day. First, we assessed 552

553 high-level generalities and differences between pelagic and benthic systems at biogeographical scales, by grouping body sizes into six absolute latitude brackets (0-10, 10-15, 15-20, 20-23, 23-33, 33-65), each containing an equal number of body-size records (n = 137,308, Fig. 3A).

556

For each of the resulting six body-size frequency distributions, we estimated and visualised the 557 normalised slope of the pelagic and benthic abundance size spectra. Although some of the 558 guiding principles had been identified earlier, the concept of the size spectra stems from work 559 originally pioneered by Sheldon et al (61) and their conjecture that 'the total mass within log 560 spaced size bins was constant over the size range from bacteria to whales'. We estimated the 561 size spectra slope from a linear regression of frequency distribution of pelagic or benthic sizes 562 on a log₁₀-log₁₀ scale, within each latitudinal bracket (Fig. 3B). Within each bracket, we fitted 563 linear regression models of log_{10} counts (n) of either pelagic or benthic sizes as a function of 564 counts within log₁₀ unit bins. We normalised the abundance (count) by dividing the count 565 566 within each bin by the actual width of the bin. This normalisation procedure is customary (62) 567 in order to account for different bin width and has the effect of reducing the linear regression coefficient of the size-spectrum by 1, thus making the estimates directly comparable to the 568 exponent b derived from a power law using a Maximum Likelihood Estimate (34) (MLE). 569 570 Given the unequal number of midwater and seabed BRUVS deployed within each absolute latitudinal bracket, we use these regressions only for purposes of comparing the slope between 571 pelagic and benthic size spectra, not the y-axis intercept value, which would vary depending 572 573 on the number BRUVS deployed.

574

575 Deriving size indicators of size structure

Fishing is a highly size-selective activity and typically targets large individuals first which are 576 more economically attractive (33). Size indicators are therefore commonly used to assess 577 ecosystem responses to environmental change and to human activities, as part of ecosystem-578 579 based management. Next, in order to assess the local-scale impact of human pressures on size structure, we therefore developed three size indicators of pelagic and benthic fish assemblages 580 (fig. S2). Individual frequency distributions were generated by aggregating sizes using the date 581 of the BRUVS deployments as a grouping term (n = 1,470), resulting in a median number of 582 10 midwater BRUVS and 13 seabed BRUVS being aggregated, per date of survey. This 583 approach ensured strengthening the existing signal-to-noise ratio, by reducing variability in our 584 indicators, whilst retaining sensitivity to local environmental and human drivers. 585

586

587 Next, for each date-aggregated individual frequency distribution, we generated two indicators of representative sizes by extracting the value of the first and second mode, when two modes 588 589 were significantly detected (p < 0.05; n = 919). These modal values were chosen to represent the size of relatively small fish and relatively large fishes, respectively. We opted for modal 590 591 values due to the multimodal nature of the frequency distributions, which would render 592 measures such as the median or mean value (63) unrepresentative of common values, since median or means would typically belong to a size class that was underrepresented e.g located 593 in the trough between two modes. Modal significance testing and extractions were done using 594 595 the function modetest(), and locmodes() in base R.

596

603

597 Finally, for individual size distributions that included a minimum of 20 individuals (n = 1,041) 598 we estimated the slope of the size spectra. We opted for the Maximum Likelihood Estimate 599 (MLE) of the power law exponent *b* of the size spectra slope, using code provided in (*34*). The 600 MLE approach directly estimates the coefficient *b* using classical likelihood methods, which 601 finds the value that maximizes the likelihood function for – in this case – the individual body 602 size data defined by the probability density function

604
$$f(x) = \frac{(b+1)x^b}{x_{\max}^{b+1} - x_{\min}^{b+1}}$$

605

606 where x is the body size, b is the scaling exponent, and the distribution is bounded by the possible sizes (x_{min} and x_{max}). We opted for the MLE approach for slope estimates at the scale 607 608 of the survey day, in contrast to regressing the count within bin (e.g. the log-linear method) used at the biogeographical scales. Other alternative approaches for estimating the slopes were 609 considered during analysis (34), although the MLE approach produces values that were most 610 611 consistent and coherent values across the greater variability of frequency distributions encountered at the scale of the survey day. All size indicators were truncated to three standard 612 deviations from the mean, to remove outliers (< 2% of records, for each indicator). 613

614

615 Assessing size structure under human pressures

Our objectives were to identify how size structures in pelagic and benthic systems would be 616 617 affected along a human pressure gradient under different levels of protection status. Our analysis relies on an extensive body of literature documenting mechanisms by which pelagic 618 619 and benthic ecosystems are shaped through bio-geophysical processes and human activities. These processes were captured by a suite of 25 socioeconomic (human), environmental, and 620 geomorphic variables, which we considered as potential explanatory variables in our 621 622 explanatory models of size indicators (table S2). All explanatory variables were extracted at the latitude and longitude coordinates of the individual midwater or seabed BRUVS 623 deployment, and then averaged at the level of the survey date, to yield values corresponding 624 with the resolution and location of the size indicator records. In addition to these numerical 625 626 variables, we also considered two categorical variables, namely protection status (see below) 627 and system habitat (pelagic or benthic).

628

A considerable body of literature has already established the power in using metrics of human 629 630 accessibility- whether measured by travel-time to nearest market, distance to nearest population or human 'gravity'- in capturing the comprehensive nature of human pressures on benthic 631 systems (16, 38). Notably, conservation gain from protection status has been shown to be 632 highly contingent upon human accessibility (7). Here, although we anticipated human 633 accessibility to be the most generalisable indicator of human pressure on local size structure, 634 the inclusion of pelagic systems within our modelling framework, for which accessibility 635 636 indicator are less established than for benthic systems (although see (64)), meant that we initially considered a broad range of human activity indicators, prior to model selection. We 637 developed metrics of human accessibility which included travelling time to market (min), and 638 639 linear distance to nearest population (38), linear distance to cities, and distance to nearest port 640 (m, https://globalfishingwatch.org/). Human variables related to governance included the following national level variables: government effectiveness (World Governance Indicators, 641 642 WGI, <u>https://papers.ssrn.com/sol3/papers.cfm?abstract_id=1682130</u>) (65), number of year of conflict (UCDP/PRIO Armed Conflict Dataset version 19.1), rule of law (WGI), absence of 643 violence (WGI), voice and accountability (WGI), control of corruption (WGI), Human 644 development index (https://hdr.undp.org/), number of active NGO, marine ecosystem 645 dependency (66). Fisheries activities specifically was considered by including an estimate of 646 total reconstructed catch (67) (https://www.seaaroundus.org/), total fishing effort from 647 648 automated identification systems (20) (https://globalfishingwatch.org/). Protection status was classified as a three-level categorical term, determined using the World Database of Protected 649 Areas(68). Sites were classed as 'highly protected' if geographically situated inside a no-take 650 marine protected area (MPA) or inside an MPA with a no-take section (IUCN category I-II), 651

652 'partly protected' if inside an MPA with some fishing allowed or of unknown status (IUCN 653 category III-VI), 'not protected' if open to fishing. For each site, we used the protection status 654 two years prior to the date of survey, to ensure sufficient time had passed for the protection 655 status to take effect. As a result of this classification scheme, each protection status category 656 contained a balanced number of records (between one quarter or one third of records), and each 657 system and protection status combination contained a range of variate values with substantial 658 overlap (fig. S3).

659

Environmental variables included the following variables: primary productivity, chlorophyll-a
 concentration, sea surface temperature, weekly median and standard deviation
 (<u>https://oceancolor.gsfc.nasa.gov/atbd/sst/</u>)

663

664 Geomorphic variables included the following variables: seabed depth (30 arcsecond, 665 https://www.gebco.net/data_and_products/gridded_bathymetry_data/), seabed slope 666 (computed using QGIS tools and GEBCO layer), distance to seamount (*69*) (m, computed 667 using QGIS and predictions of seamount locations), distance to coast (computed using QGIS 668 and coast lines from GADM 3.6), distance to coral reef (computed using QGIS tools, 669 https://data.unep-wcmc.org/datasets/1).

670 671

672 Explanatory modelling

Prior to model fitting, the full suite of candidate explanatory variables was tested for 673 674 correlation: whenever a pair of variables were found to be correlated one of the variables was discarded (Pearson's correlation values >0.7, table S2). To disentangle the interactions between 675 system (pelagic vs benthic), protection status, and human pressures on the three size indicators, 676 677 we build explanatory generalised least-square models (GLS) using the R nlme package (70). These models controlled for background variability in socio-environmental and geomorphic 678 conditions which varied between midwater and seabed BRUVS deployments across our 679 survey, whilst accounting for spatial and temporal autocorrelation in the model residuals. 680

681

682 The fully saturated models, where system and protection status were interaction terms of all 683 socioeconomic variables, and system was an interaction term of all remaining variables (either 684 untransformed or using the log_{10} value, table S2), took the following form, for each size 685 indicator:

686

687 Size indicator ~ System * protection status * (Travel time to market + Distance to port) +
 688 System * (Seabed depth + Seabed slope + Distance to Seamount + Distance to Coral Reef +
 689 Distance to Coast + Year of Survey + poly(Sea surface temperature median, 2) +
 690 poly(Chlorophyll-a, 2))

691

The saturated models were further simplified using a variance inflation factor approach to 692 identify and remove residual collinear variables, in which variables yielding VIF > 10 were 693 removed. Different correlation structures were tested and compared using their Akaike 694 Information Criteria (AIC) values. The rational quadratic correlation structure ('corRatio') 695 696 vielded the lowest AIC value, for all size indicators. The VIF-simplified models and correlation 697 structure were further simplified using stepwise model selection, using the AIC, and the stepAIC function in the 'MASS' package (71). Simplified models were further evaluated by 698 699 deriving the adjusted R² value, using the model performance function in the 'performance' package (72), and through visual inspections of model prediction vs residuals plots, and 700 701 semivariograms. We tested for spatial autocorrelation in the model residuals using a Moran's

index I. Standardized effect sizes of each explanatory variables and their interactions were
extracted and visualised with the function *plot_model* using the 'sjPlot', 'sjlabelled', and
'sjmisc' packages (fig. S4 to 6, table S3 to 5).

706 Marginal relationships between travel time to market and size indicator in the six alternative interaction term categories combination (System: pelagic or benthic; protection status: not 707 708 protected, partly protected, or highly protected) were evaluated using the ggpredict function from the 'ggeffects' package (73). Usually, marginal relationships between a response variable 709 710 and an explanatory variable of interest are evaluated by generating model predictions across 711 the range of the explanatory variable of interest, whilst holding the remaining variables fixed at the mean values. However, since the range of travel time to market sampled within each 712 categorical combination differed, this approach could lead to extrapolation and illegitimate 713 714 predictions beyond this range. Furthermore, using a global mean value may give an unrealistic picture because of the different variable values within each system. To avoid extrapolation and 715 unrealistic predictions, we imposed three restrictions: 1) Marginal predictions were produced 716 only for the range of travel time to market encountered within each categorical combination, 717 718 meaning that the range of predictions varied between combinations. 2) We held remaining 719 variables at the mean values of either pelagic or benthic records for predictions in their corresponding system (fig. S4). 3) We avoided combinatorial extrapolation by not 720 721 extrapolating marginal predictions into new combinations of variables, e.g. instances where distance to port is high but travel time to market is low do not exist in reality (since every 722 market is by requirement also a port), so distance to port was by necessity held at the most 723 724 common value sampled within each category combination $(1.2 = \log_{10} 15, \text{ km})$. 725

726 Sensitivity analyses

727 All locations were not equally sampled by both midwater and seabed BRUVS, and some locations were disproportionately surveyed. To ensure the robustness of our analysis to 728 unbalanced survey design and uneven effort we performed three sensitivity analyses. First, we 729 730 conducted the biogeographical analysis but this time aggregating the sizes within six longitudinal brackets instead of absolute latitude (fig. S7). Second, we reran the GLS models 731 on 10 data subsets, after randomly removing 10% of the size indicators records (fig. S8). Third, 732 we reran the GLS models on 3 data subsets, by dropping all records from either the Atlantic, 733 734 Indian and Pacific oceans (fig. S9).

735

705

736 Our sensitivity analysis revealed that differences between pelagic and benthic size structure 737 across latitude were also congruent with differences across longitude (fig. S7). Moreover, GLS models produced through the sensitivity analysis on subset datasets reported similar effects of 738 739 market proximity (fig. S8). Although we observed some minor to moderate differences in 740 model reruns with different ocean dropped (fig. S9) our main findings concerning the direction 741 of both remoteness and protection status in pelagic and benthic systems remained largely 742 unchanged. Taken together, these results suggest that our analysis was not overtly influenced by unbalanced survey-design and uneven effort. Moreover, this suggests that our conclusions 743 concerning distinctness between pelagic and benthic size structures, relative influences of 744 market proximity, and effect of protection status across different systems are robust. 745 Geographical expansion in unsampled and unbalanced regions remains a priority in our 746 747 ongoing investigations. Nevertheless, we find it improbable that our conclusion concerning pelagic and benthic response to human pressure and protection status will change with further 748 749 geographic coverage, as the inclusion of heavily fished areas (e.g., in the North Pacific and 750 Atlantic) will likely make these patterns more pronounced (10, 27). Moreover, our conclusion 751 that pelagic systems invariably contain the largest and smallest individuals, while being

- species-poor, in contrast to benthic systems that contain an overrepresentation of medium
 sized-individuals, though species-rich appear robust.
- 754

755 **Results in context**

Through use of stereo-BRUVS and size indicators, we have conducted a fish size assessment across marine habitats, and revealed fundamental differences in vulnerability of pelagic and benthic systems, with implication for effective conservation strategies. We find that pelagic size structures are only effectively protected inside highly protected MPAs if they are remote from markets. More generally, pelagic size spectra are very rapidly eroded under increasing human pressures, in contrast to benthic size spectra, which show resilience.

762

The value of the global abundance size spectra slope was originally hypothesised to be equal 763 764 to a b exponent of -2 (61). This value was recently confirmed empirically for the global ocean, yielding a b exponent estimate of -2.04 (74). At smaller spatial scales, empirical size spectra 765 slopes typically deviate from this theoretical expectation. This in part due to variability inherent 766 in ecological systems but also because slope estimates are sensitive to taxonomic and spatio-767 768 temporal resolutions, and to methodological differences (23). Here, the greater spread of pelagic size spectra slopes compared with the benthic values (standard error, pelagic: 0.16, 769 benthic: 0.09) at the scale of the survey day probably reflects the greater patchiness of pelagic 770 771 ecosystems (75). However, this variability further means that the averages of our slope estimates at the scale of the survey day (fig. S3) are not directly comparable between pelagic 772 773 and benthic systems, and that the comparison is better done at biogeographical scales, showing 774 consistently shallower size spectra in pelagic systems than in benthic counterparts (fig. S2 and 775 S8, table S1).

776

777 Elevated size-selectivity of most pelagic fishing gear means few applications of size spectra analysis to pelagic fish assemblages exist in marine systems, with most existing pelagic 778 examples stemming from freshwater lakes (8, 10), making it difficult to find independent 779 780 validation of our slope values. In benthic systems however, fish size spectra analysis is commonly applied to size structure. Our benthic slope estimates at biogeographical scales 781 (mean: -1.58, range: -1.63 to -1.54, Fig. 3, table S1) are shallower than previous estimates at 782 783 similar scales (76) (-1.88 \pm 0.06). Consistently, our benthic size indicators MLE slope estimates (mean -1.11, range: -2.28 to -0.13, fig. S2) are also shallower than those previously reported 784 (39) (-1.95 to -1.13). This contrast is consistent with expectation from BRUVS size-selectivity, 785 compared with size-selectivity of underwater visual census (UVC), from which these previous 786 slope estimates are derived. Although UVC typically under-sample larger size classes due to 787 predators such as sharks avoiding divers (77), BRUVS are baited precisely in order to attract 788 predators from across a greater catchment. We would therefore expect larger size-classes to be 789 790 relatively overrepresented in BRUVS compared to other survey methods, leading to shallower slope estimates, in line with our findings. We note that inverted trophic pyramids with very 791 792 shallow slopes have been reported from UVC in both tropical and temperate systems [-0.49 to -0.45 ± 0.13 to 0.14(30); $-0.55 \pm 0.3(78)$; we subtracted 1 from the unnormalized slope values 793 reported by (30) and (78) to make them directly comparable]. Such slope values are consistent 794 with ecological theory only in the presence of strong trophic subsidies from adjacent systems, 795 796 which act to support overrepresentation of larger size-classes. Our near-global survey reported 797 several instances of such abundant levels of sharks (e.g MaxN>30), but only near remote oceanic islands, on seamounts or on submerged reefs, where localised nutrient and energy 798 799 subsidies in the absence of human pressure can occur e.g. (79). Our maximum slope value of -0.13 and our slope estimate of \sim -0.7 derived from the GLS model in remote and protected 800

locations are therefore consistent with values reported elsewhere, under comparable conditions,
using UVC. Finally, we note that although BRUVS probably resulted in overrepresentation in
larger size classes compared with other survey methods, our size spectra showed truncation at
larger size classes for the linear regression fit (fig. S2B), as is commonly observed in empirical
spectra (23).

806

MPAs can be more effective in countries under efficient management regimes (36). However, 807 our investigation did not detect any evidence of government effectiveness influence on neither 808 809 pelagic nor benthic size indicators, and the term was discarded due to high Variance Inflation Factor (IF>10) in our GLS. Further inspection did not reveal any indication that size spectra in 810 effectively managed countries were less impacted, with shallower size spectra slopes. This 811 absence of a clear signal may be related to two possible factors (i) overall low variability of 812 813 benthic size-indicators resulting in low power to detect effect of government effectiveness, and (ii) high sensitivity of pelagic size-indicators meaning that government effectiveness has little 814 to no influence near markets where pelagic size structure has already been impacted. 815

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