1 FUNCTIONAL AND PHYLOGENETIC DIVERSITY OF SHARKS IN THE 2 NORTHEASTERN PACIFIC

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Benjamin Baiser is a community ecologist and macroecologist. He takes empirical and
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Author contributions:

ZAS, LBT, and FPC conceived the ideas. ZAS designed the methodology. LBT built the phylogeny. KBL and FPC collated the trait values from the literature. KBL and ZAS did the photogrammetry. ZAS, KBL, and FPC collected pictographs. ZAS did the analysis. All authors contributed to synthesis and interpretation of results, the writing, and review.

Running Title: Shark biodiversity in the northeastern Pacific

68 ABSTRACT

Aim: The expansive spatial scale of pelagic communities and the difficulty in acquiring
pelagic species' functional traits has stymied an understanding of marine community
dynamics. We assembled and analyzed a shark trait database and community
phylogeny to identify the major axes of trait variation that define shark functional groups.
We tested whether membership to biophysical macroecological strata is related to these
functional or phylogenetic relationships.

Location: Northeastern Pacific, 180-255°E and 0-50°N

Major taxa studied: Sharks (Class: Chondrichthyes, superorder: Selachimorpha)

Methods: We built a community phylogeny and collected habitat, reproductive, somatic growth, trophic, and dentition traits. We used Principal Coordinates Analyses (PCoA) to identify axes of trait variation and hierarchical clustering to classify functional groups. We tested whether functional or phylogenetic relatedness determined species' membership to strata from five macroecological gradients: latitude, habitat type, thermal, carbon source, and bathymetry.

Results: We assembled 38 traits from 1,225 records from 130 sources, 260 pictographs
from seven sources, and 631 teeth from 79 jaw specimens. Life history, *r* versus *K*selection, was responsible for the biggest division in the functional dendrogram. Vertical
habitat preference, growth rates, diet, and dental morphology generated further
divisions between *r*- or *K*-selected species. Vertical habitat preference, carbon source,

and biochemical habitat type were significantly dispersed or clustered on the functionaldendrogram or phylogram.

Main conclusions: Habitat and reproductive traits were the most important trait suites
driving shark functional diversity. Through ordination and clustering, we were able to
associate major axes of trait variation to the membership of shark functional groups.
The phylogram approximated well the functional dendrogram's backbone but was a
poor substitute for the trait diversity at the tips. Given the long evolutionary history of
sharks and coincident expansive trait diversity, merging functional and phylogenetic
approaches was necessary to capture the dimensions of shark biodiversity.

Keywords: dimensions of biodiversity, elasmobranchs, museum collections, photogrammetry, pictographs, traits

105 **INTRODUCTION**

106 The pelagic ocean covers over 50% of the planet's surface, but little has been 107 explored of its community ecology (though see Grady et al., 2019; Pimiento et al., 108 2020). Pelagic species, in particular marine megafauna, can range thousands of 109 kilometers and, as a result, pelagic "communities" span immense spatial scales, equal 110 to or greater than the scale of many terrestrial macroecological gradients. These aspects impede the collection of specimens for measuring traits and reduce the 112 application of common community ecology quantitative approaches (Schlägel et al., 113 2020). Thus, we do not have a baseline understanding of the functional and 114 phylogenetic diversity of many marine communities especially those in the pelagic 115 ocean. Neglecting this vast ecosystem stifles our understanding of the ecological mechanisms determining community structure and function (Villéger et al., 2017).

117 In the pelagic ocean, sharks are the most abundant large-bodied species and 118 exert strong top-down control on ecosystems as apex predators, mesopredators, and 119 cannibals (Kitchell et al., 2002). Unlike other large-bodied pelagic fishes (e.g., tunas and 120 billfishes) that evolved in the Miocene (~17 mya), most extant shark lineages evolved 121 far earlier in the early Jurassic (Sorenson et al., 2014) and the first pelagic sharks 122 evolved far earlier in the Early Cretaceous (~140 mya). This long evolutionary history 123 coincides with an immense breadth of shark functional ecology. Sharks have evolved to 124 inhabit nearly every marine habitat (Compagno et al., 2005), exhibit a variety of 125 reproductive strategies from oviparity to various modes of viviparity (Parsons et al., 126 2008), range in length from 20 cm to 18 m (Compagno et al., 2005), and are consumers 127 at almost every trophic level of the ocean food web (Motta & Huber, 2012). Further, 128 sharks are frequently caught in fisheries (Karp et al., 2011; WPRFMC, 2019) and, as a

result, many species have measured traits. Together, their ecological role, trait diversity,
and relatively thorough sampling makes shark assemblages a robust choice for
exploring pelagic community ecology.
Species' traits can provide insight into species functions, interactions,

133 distributions, and mechanisms that structure and maintain the diversity of communities and the function of ecosystems (Cadotte et al., 2011; McGill et al., 2006). Further, traits 134 135 are the phenotypic expression of genetic diversity and combining trait-based 136 approaches with phylogenetic approaches provides multi-faceted information about the 137 evolutionary structure and resultant functioning of ecological assemblages (Mazel et al., 138 2017; Tucker et al., 2018; Violle et al., 2007). In a macroecological context, traits can 139 provide insight into intra- and inter-specific distributions of niche breadth along ecological gradients (Pigot et al., 2016; Read et al., 2018) as well as the structure of the trait morphospace in an evolutionary lineage or community (Blonder et al., 2014; Price et al., 2019). Typically, the influence of a macroecological gradient on a community is 143 assessed by comparing the taxonomic, functional, or phylogenetic diversity for a set of 144 locales spanning the gradient. However, the open ocean's sheer size, extreme depths, 145 strong seasonal changes, and the ability of pelagic species to move across these 146 dimensions reduce the applicability of a defined local community. Instead, macroecological gradients (e.g., latitude, depth, temperature) can be divided into strata 148 and used to assign species' memberships from a regional pool using natural history observations. The functional and phylogenetic relationships between species that co-150 occur within a given strata can then be a used to assess the influence of the 151 macroecological gradient on community structure (Li et al., 2019).

The ocean has classic latitudinal gradients as well as gradients coincident with increasing depth, such as pressure, light, productivity, temperature, and oxygen, that exert selective pressures on species traits (e.g., the evolution of bioluminescence, Martini & Haddock, 2017), as well as influence community assembly processes (Martini et al., 2019; Yasuhara et al., 2012). Previous studies have found that, at macro-scales, lower latitudes and higher surface temperatures are generally correlated with increased ectotherm diversity, while higher latitudes and lower surface temperatures are generally correlated with lower ectotherm diversity (Worm et al., 2005) and higher endotherm diversity (Grady et al., 2019). Macro-scale gradients result from changes in the carbon source, assessed using stable isotopes, and can reflect a species preference for neritic, transitional, or pelagic habitats (Davenport & Bax, 2002; Miller et al., 2008). At mesoscales, habitat type – as defined by biochemistry (Raes et al., 2018), static features (e.g., seamounts and hydrothermal vents) (Morato et al., 2010), or physical forcing (e.g., eddies) (Carvalho et al., 2019) – can drive differences in oceanic community composition.

167 The Northeastern Pacific (NEP) is an ideal location to explore pelagic biodiversity 168 at macroecological scales as it covers 60° of latitude, several oceanic biomes (Sayre et 169 al., 2021), a range of sea surface temperatures from tropical to Nearctic conditions, 170 neritic and pelagic habitats, and depths from the surface to over 8000 m. This region is 171 characterized by the Northeast Pacific Subtropical Gyre, an anticyclonic current 172 formation. Strong upwelling occurs in the east along the California coast while 173 numerous anticyclonic upwelling eddies occur far from the coast (Sun et al., 2019). 174 Slow zonal currents form a 40° latitudinal swath of warm surface temperatures facilitating the expansion of tropical and sub-tropical species into higher latitudes while
the California Current and cold-core pelagic eddies provide suitable habitat for
temperate species at lower latitudes. Numerous oceanic seamounts, including the
Hawaiian Archipelago, provide opportunities for mixing between epi-, meso-, and
bathypelagic species in the same spatial area.

The goal of this study was to compare the community functional and phylogenetic diversity of sharks occupying the NEP. Our objectives were to 1) collate a trait database for sharks within the NEP using primary collection and literature search, 2) describe the major axes of functional diversity in trait suites, 3) characterize shark functional groups and their associated phylogenetic diversity, 4) identify the principal traits that drive the separation of shark functional groups, and 5) assess whether membership to macroecological strata is related to the functional or phylogenetic relationships between species.

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MATERIALS AND METHODS

Our general methods were to 1) build a community phylogeny, 2) collect and compile traits from a variety of sources, 3) conduct multivariate analyses (i.e., ordination, hierarchical clustering) to find major axes of trait variation among sharks and identify shark functional groups, 4) test whether functional or phylogenetic relatedness determined species' membership to macroecological strata.

194 Regional Pool

We compiled the regional species list for the NEP, 180-255°E and 0-50°N, from
published (Ebert et al. 2017) and online sources on Hawaiian and Californian ocean
biodiversity (e.g., http://dlnr.hawaii.gov/sharks/hawaii-sharks/species-list/ and
https://swfsc.noaa.gov/textblock.aspx?ParentMenuId=123&id=971). For phylogenetic

analyses, we selected outgroup species from three lineages sister to Selachimorpha
(sharks) also found in this region of the NEP: Chimaeriformes, Myliobatiformes, and
Rajiformes.

2 Phylogenetic Reconstruction

203 As none of the recent Selachimorpha phylogenetic trees (Sorenson et al., 2014; 204 Stein et al., 2018) had complete coverage our regional pool, we built a community 205 phylogeny (or purpose-built phylogeny, sensu Li et al., 2019) to reconstruct the 206 evolutionary relationships between the co-occurring shark species. Briefly, we used four 207 mitochondrial loci COI, CytB, NADH2, and 16S, and one nuclear locus, Rag1, to 208 reconstruct the phylogenetic relationships for this dataset (full details in Supplemental 209 Information 1). For each species, we downloaded sequences from GenBank 210 (Supplemental Table 1), aligned sequences using MAFFT v7.388 (Katoh & Standley, 211 2013) plugin in Geneious Prime 2019.1.3 (https://www.geneious.com), and, using 212 PartitionFinder v. 2.1.1 (Lanfear et al., 2012), determined the optimal model of evolution 213 for each locus. We reconstructed phylogenetic relationships for individual gene trees 214 (Supplemental Figure 1) as well as all concatenated loci using Randomized Axelerated 215 Maximum Likelihood (RAxML) (Stamatakis, 2006, 2014). We applied an ordinal level 216 topological constraint to our concatenated RAxML analysis that reflects widely accepted 217 relationships between Selachimorpha lineages deep in the tree (Sorenson et al., 2014) 218 and is common practice in phylogenetic tree building in Selachimorpha (Sorenson et al., 219 2014; Stein et al., 2018).

220 Functional Traits

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221 We desired to capture a broad suite of traits reflecting the habitat use, life history 222 strategies, diet preferences, and morphological variation associated with the functional 223 ecology of the sharks in the regional pool (Violle et al., 2007). To do such, we compiled 224 traits (Supplemental Table 2)(Figure 1) for the species of interest using literature 225 search, pictographs (Supplemental Table 3), or enumeration and photogrammetry 226 (Supplemental Table 4). Pictographs of each shark species' lateral profile (or body 227 shape) were used to capture differences in relative external morphology (e.g., 228 proportions, fin length, angle, and placement) as a supplement to the information on 229 maximum length. Enumeration of shark dentition was used to capture differences in the 230 number of teeth while photogrammetry was used to capture differences in the relative 231 morphology of a species' tooth crown. Each pictograph or photograph was converted to 232 a silhouette and its outline was reconstructed with Elliptical Fourier Analysis (EFA). The 233 resulting Fourier coefficients were used then decomposed using Principal Components 234 Analyses and the resulting principal component (PC) scores were used as traits in 235 downstream analyses. The remaining continuous trait values were from multiple 236 sources for each trait and were combined using a weighted average with the number of 237 citations as weights. All traits were standardized to approximate a standard normal 238 distribution for analyses. The complete trait set was then divided by biological theme 239 into trait suites: habitat, reproductive, trophic, somatic growth, and dental morphology 240 (Supplemental Table 2). Additional details on the trait collation and collection, weighting 241 scheme, and standardization are available in Supplemental Information 2.

242 Principal Coordinates Analysis

To identify and describe the major axes of shark functional diversity in each trait
suite and all suites combined, we conducted a Principal Coordinates Analysis (PCoAs)

on the Gower dissimilarity of the given trait suite. For each trait suite PCoA, all species
that had 50% or more coverage of the suite in question were included. The trait loading
ranks were calculated as a vector sum of the first and second PCo loadings weighted by
the percent variance explained by each PCo. All PCoAs were summarized in plots of
the first and second PCo scores for each species and the trait coverage within the suite
was calculated. Additional details on the PCoA are available in Supplemental
Information 3.

Hierarchical Clustering

We used hierarchical clustering with the complete linkage method on the overall Gower trait dissimilarity matrix to construct a functional dendrogram. We identified the optimal number of functional groups in the functional dendrogram using the gap statistic and the first standard error maximum criterion (Maechler et al., 2019). Using the optimal number of clusters, cluster membership was assigned to each species. The mean trait value was calculated for each cluster removing any species with missing values. We assessed the phylogenetic clustering of each trait and the phylogenetic diversity of each functional group. For the former, the phylogenetic signal of each trait was evaluated by calculating Pagel's lambda using the *phytools* package (Revell, 2012). For the latter, three phylogenetic diversity metrics, phylogenetic distance (PD), the mean pairwise distance (MPD), and the mean nearest taxon distance (MNTD), were calculated for each functional group using the *picante* package (Kembel et al., 2010) using 999 iterations and an $\alpha = 0.05$ to assess significant standardized effect sizes (Z-scores) (Webb et al., 2002) using a tip-swapping null model. Additional details on the hierarchical clustering and optimal cluster search are available in Supplemental Information 3. 268

9 Macroecological relationships

270 To test macroecological relationships of functional and phylogenetic diversity for 271 shark assemblages, we defined strata for five gradients: latitudinal gradient, habitat type 272 based on biochemistry (Sayre et al., 2021) (Supplemental Table 5), thermal gradient, 273 carbon gradient, and bathymetric gradient. These strata were defined using 274 independent sources on species' ranges, ecological marine units, sea surface 275 temperature, and stable isotopes as well as from the depth ranges defined during our 276 trait collection (strata definitions available in Supplemental Information 3). We then 277 tested the phylogenetic and functional dispersion for each stratum across each of the 278 macroecological gradients. The permutation-based standardized effect size was 279 calculated using *picante* package (Kembel et al., 2010) for three diversity metrics: 280 functional or phylogenetic distance (FD/PD), MPD, and MNTD using a tip-swapping null 281 model with 999 permutations and at an $\alpha = 0.05$.

282 RESULTS

283 Regional Pool

The regional shark list included 56 species, but four species had either zero sequences (i.e., *Apristurus spongiceps*, *Centrophorus tessellatus*, *Etmopterus villosus*) or a few low quality sequences (i.e., *Cephaloscyllium ventriosum*) available on Genbank and thus were excluded from the regional pool, reducing the total to 52 species.

288 Phylogeny

In addition to the regional pool, six additional species were included in the
phylogeny as an outgroup (Supplemental Information 1). For all species (ingroup +
outgroup) our dataset had 81.4% coverage across all sequences for the regional pool
and the outgroup species (Supplemental Table 1). The final phylogram has 57 internal

293 nodes, 12 of which were constrained (Figure 1). For unconstrainted nodes, bootstrap
294 values ranged from 27 to 100 with and average bootstrap value of 84.84%
295 (Supplemental Figure 2).

296 **Functional Traits**

Each trait included at least 58% of species in the regional pool (Figure 1). Generally, age at maturity and von Bertalanffy k values were missing together and missing most among the traits. Similarly, diet compositions and δ^{15} N were missing together and missing the second most often among the traits. Minimum and maximum depth of occurrence, maximum length, and reproductive mode all had 100% coverage. Maximum depth, reproductive mode, size at birth, number of offspring, maximum length, δ^{15} N, and proportion of diet containing mollusks, crustaceans, zooplankton and plants all had strong phylogenetic signal (Figure 1).

Literature Traits

306 Fourteen traits came solely from literature-derived sources (73% of all records), 307 while four were informed by additional data collection through the photogrammetry 308 process. A total of 1,225 trait value records were compiled from 130 unique sources. 309 The median number of records per species was 26 from a median of 8 sources, with a 310 minimum of 5 records (3 sources) and a maximum of 103 records (28 sources) 311 (Supplemental Figure 3 & 4). On average, the literature-derived trait coverage was 78% 312 per species with a minimum of 14% and a maximum of 100% (Supplemental Figure 5). 313 Four traits had 100% coverage (Figure 1) (Supplemental Figure 6).

314 Pictograph Traits

315 Body shape profiles (Figure 1) were compiled for 51 species (Supplemental 316 Table 3). In total, seven sources were used to compile body shape silhouettes 317 (Supplemental Figure 7) with a median of 5 sources per species, a minimum of 2 318 sources, a maximum of 7, and a total of 260 pictographs. Landmarks located at the 319 apical point of the rostrum, the first dorsal fin, and the upper caudal fin lobe 320 (Supplemental Figure 8) were needed to sufficiently align the silhouettes (Supplemental 321 Figure 9). After harmonic calibration, 15 harmonics were used in EFA of body shape morphology (Supplemental Figure 10). 322

3 Photogrammetric Traits

Tooth crown morphology was compiled for 35 species from 80 specimens for a total of 631 teeth (Figure 2, Supplemental Table 4). A minimum of one jaw specimen per species was obtained, a maximum of 12, and a median of 2. Teeth were aligned with centering and scaling (Supplemental Figure 11). After harmonic calibration, 16 harmonics were used in EFA of tooth crown morphology (Supplemental Figure 12).

9 Trait Processing

For the Principal Components Analysis on the EF pictograph coefficients, body shapes varied principally in terms of fin erectness where species with the "classic" shark profile such as Carcharhinids and Lamnids separated from species with more "torpedo" profiles such as Squaliforms for PC1 (Supplemental Figure 13). Within the "classic" shark profiles, further separation along PC2 occurred as a function of whether the pectoral, dorsal, and caudal fins extended perpendicular to the anterior-posterior axis, as in Longfin Mako Shark (*Isurus paucus*), or Oceanic Whitetip Shark (*Carcharhinus* 337 *longimanus*), or the caudal fin extended parallel to the anterior-posterior axis, as in the338 Alopiids (Supplemental Figure 13).

For the PCA on EF photogrammetric coefficients, teeth shapes separated
whether the crown height was longer than the crown width or vice versa for PC1
(Supplemental Figure 14). Along PC2, convex teeth, as in Lamnids and Carcharhinus
species, separated from concave teeth, as in Gulper Shark (*Centrophorus granulosus*)
and in Gray Smoothhound Shark (*Mustelus californicus*). A large cluster of species was
identified that all roughly possessed the classic shark tooth, with roughly identical crown
heights and widths as well as slightly concave (Supplemental Figure 14).

Principal Coordinates Analysis of Trait Variation

347 The habitat PCoA scores split into two clusters (Figure 3A) defined by minimum 348 depths at and below the surface, while within those clusters, species separated by δ^{13} C 349 and maximum depth (Supplemental Figure 15, Supplemental Table 6). Reproductive PCoA scores separated by life history strategy (Figure 3B). Species with large size at 350 351 birth, late ages at maturity, low number of offspring, and high maternal investment 352 separated from species with small sizes at birth, early ages at maturity, high number of 353 offspring, and less maternal investment (Supplemental Figure 16). Similarly, the somatic 354 growth PCoA scores separated larger, slower growing species from smaller, faster 355 growing species (Figure 3C; Supplemental Figure 17). Nitrogen stable isotopic signature (δ^{15} N), a trait integrating across the diet categories, was the strongest loading 356 357 for the trophic trait suite PCoA (Supplemental Figure 18; Supplemental Table 5), with 358 clear separation between apex predators like Great White Shark (Carcharodon 359 carcharias), and zooplanktivores like Basking Shark (Cetorhinus maximus) (Figure 3D).

360 In the dental trait suite PCoA, species with higher dorsal and ventral symphyseal 361 and row counts separated from the rest of the species (Supplemental Figure 19). Teeth 362 PC scores grouped tightly by PC axis across all eight teeth positions (Figure 3E). In the 363 overall trait suite, the PCoA scores strongly separated by life history strategy, grouping 364 species by reproductive traits, and minimum depth of occurrence (Figure 3F) 365 (Supplemental Figure 20). Four of the five reproductive traits and two of the three 366 habitat traits were in the top ten ranked loadings of the overall suite (Supplemental 367 Table 5). Across PCoAs, species with trait coverage, that surpassed the exclusionary 368 threshold, but was still low tended to have extreme PCoA scores, but not all in the same 369 direction (Figure 3).

370 Hierarchical clustering of functional groups

371 We identified ten as the optimal number of functional groups from the shark 372 functional dendrogram (Figure 4). Group A was all Lamniforms with the exception of 373 Blue Shark (*Prionace glauca*; Carcharhiniformes) and was a cluster of viviparous, 374 mostly oophagous, pelagic species that on average exhibited a "classic" shark lateral 375 profile, grew slowly, matured late, were high on the food chain and more specialized on 376 cephalopods than teleosts with spear-shaped teeth (Figure 4B). Group B contained 377 large, pelagic Lamniforms with large sizes at birth, very slow growth rates, late ages at 378 maturity, and high tooth counts, at least for Megamouth (Megachasma pelagios) and 379 Basking sharks. Group C contained mostly Lamniforms except for the Sphyrnids and 380 had traits similar to group A but with higher nitrogen signatures from diets more 381 generalized on teleosts, cephalopods, and marine mammals, and with tooth crowns 382 equally wide and high. Group D was all Carcharhinid epipelagic, neritic, placentotrophic 383 species that exhibit a "classic" shark lateral profile and were mostly teleosts specialists

384 with tooth crowns equally wide and high. Group E was a small mesopelagic cluster of 385 viviparous oophagic species with mostly missing values.

Group F contained small-sized, pelagic, viviparous lecithotrophic mostly

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Squaliform species but with entirely different tooth crown shapes, whose convex crowns were angled laterally. Group G had only two species, Whale Shark (*Rhincodon typus*) and Sixgill Shark (*Hexanchus griseus*), with extremely slow life history strategies 389 390 relative to the regional pool. Group H had the most taxonomic heterogeny with species 391 from four shark orders that are viviparous lecithotrophic, diet generalists with tooth 392 crowns wider than high. Group I were crustacean feeding specialists with a fast life 393 history strategy relative to the regional pool and included only Carcharhiniforms with the 394 exception of Horn Shark (Heterodontus francisci; Heterodontiformes). Group J was 395 small-sized, viviparous lecithotrophic, mesopelagic Squaliform species. No shark 396 functional groups were significantly over-dispersed (Figure 4B). Overall, groups B, C, D, 397 and J were significantly under-dispersed across the phylogeny using the PD metric. 398 Further, groups C and D were significantly under-dispersed as measured by MNTD (i.e., 399 near the tips of the tree), while groups C, D, J, and I were under-dispersed according to 400 MPD (i.e., deep in the phylogeny).

401 Overall, the functional diversity of the regional pool split broadly into two groups 402 along an axis of r (F-J groups) versus K (A-E groups) life history strategy: lecithotrophic 403 viviparous and oviparous species with many, small offspring or placentotrophic and 404 oophagous viviparous species with few, large offspring (Pianka, 1970) (Figure 4B). 405 Differences in bathymetric habitat selection, somatic growth rates (e.g., age at maturity 406 and Brody growth coefficient), and dietary specialization further split *r*-selected species.

407 In the K-selected group, carbon source (i.e., δ^{13} C), zooplanktivory, tooth counts, and 408 tooth crown shape further split apart members. Species to species differences at the 409 tips or within a functional cluster tended to result from differences in continuous traits. 410 For example, in cluster D, differences in δ^{13} C gave rise to four subgroups likely 411 reflecting affinity for coastal zones. These comprised of an extremely coastal species, Whitetip Reef Shark (*Triaenodon obesus*), coastal reef shark species, such as Gray 412 413 Reef (Carcharhinus amblyrhynchos) and Blacktip Reef Sharks (C. melanopterus), 414 continental slope species, such as Spinner Shark (C. falciformis), and, lastly pelagic species, such as Oceanic Whitetip Shark.

Macroecological signal

In the macroecological analysis, only Leopard Shark (*Triakis semifasciata*) was excluded from all analyses using AquaMaps distributions (latitude, thermal, and habitat type), and species without δ^{13} C values were excluded from the carbon gradient test. The composition (Supplemental Table 7) of the latitudinal strata, habitat types, thermal strata, carbon source strata, and bathymetric strata had few significant instances of over– or under-dispersion on the functional dendrogram or the phylogeny across all diversity metrics (Figure 5). However, the epipelagic assemblage was over-dispersed for FD, the bathypelagic assemblage was under-dispersed for MNTD, the neritic assemblage was under-dispersed for both FD and MPD, and the Northern Subtropical Epipelagic habitat assemblage (EMU 11) was under-dispersed for MNTD. For the phylogeny, only neritic assemblages were significantly under-dispersed for MPD and only North Pacific and Beaufort Sea Epipelagic habitat assemblages were significantly over-dispersed for PD and MPD.

Of the five macroecological gradients we tested, bathymetric habitat selection and carbon source had the most non-random dispersions relative to the functional dendrogram and phylogeny (Figure 5F-G). Many species occur in the epipelagic resulting in significant over-dispersion while bathypelagic species mostly come from Squaliformes with similar functional ecology (group F) resulting in significant underdispersion (Figure 4). This can be clearly seen in the habitat trait suite PCoA where the strongest clustering between species was along minimum depth preference (Figure 3A) as well as by depth selection falling in the top three rankings of the habitat and overall trait suite PCoAs (Table 1). Preference for neritic waters, identified by higher δ^{13} C values, also strongly matched the functional and phylogenetic structure. Differences in carbon source tended to structure a few of the functional groups broadly, with group B comprised of strongly pelagic species (low δ^{13} C values) and group D comprised of neritic species (Figure 4A); however, most of the functional groups did not strongly align to a particular end of the carbon gradient axis (Figure 5F). On the phylogeny, neritic species were generally from Carcharhinidae and were clustered together deep in the functional dendrogram and phylogeny (under-dispersed for MPD), but not at the tips (random for MNTD) (Figure 5G).

By combining literature sources, pictographs, and primary photogrammetric collection, we were able to produce a robust, novel trait database for sharks in the 450 Northeastern Pacific. Combining these trait data with a phylogeny, we described major 451 axes of functional diversity, tested shark traits for phylogenetic signal, defined shark 452 functional groups, and assessed the phylogenetic and functional relatedness of shark

453 species that co-occurred across a suite of macroecological gradients. Principally, we 454 found the diversity within a functional group was poorly explained by phylogenetic 455 distance and that the community phylogeny was a proxy for differences between 456 functional groups. This is empirical support of simulation studies that have suggested 457 that phylogenetic diversity may not encapsulate all the functional diversity in a community (e.g., Mazel et al., 2017; Tucker et al., 2018). Across the macroecological 458 459 gradients we tested, we found bathymetry to be the strongest driver of community 460 structure, which parallels similar findings in teleosts both nearshore (Fujita et al., 1995; 461 Moranta et al., 1998) and offshore (reviewed by Sutton, 2013).

Likely as a result of the broad species' ranges of most species in our regional pool, 463 we did not find support for latitudinal or thermal gradients as other marine megafauna 464 studies have found (Grady et al., 2019; Worm et al., 2005) (Figure 5). We posit that the 465 scale of the contrast between the surface and vertical gradients drives this 466 phenomenon. For example, the surface thermal gradient in the NEP spans roughly 467 4000 km and varies from as low as 10°C in the California Current to as high as 30°C in 468 the Pacific North Equatorial Current. In contrast, the vertical thermal gradient is equally 469 as large within the first 500 m from the surface. Along with increasing pressures and 470 decreasing dissolved oxygen, depth is likely to be a stronger functional diversity driver than latitude in the pelagic ocean (Rosa et al., 2008; Yasuhara et al., 2012). In addition, 472 our finding of weak support for functional and phylogenetic clustering based on carbon 473 source (Figure 5F-G) is similar to other studies that have documented changes as a 474 function of distance from shore for large taxa oceanic communities (Davenport & Bax, 475 2002; Morato et al., 2010).

476 Relative to other community ecology datasets, many NEP shark species are 477 large, mobile, marine organisms with close to circumglobal distributions (Supplemental 478 Table 7). Defining a community is difficult in these circumstances without fine-scale 479 occurrence data (Schlägel et al., 2020), which is often strongly biased against rare 480 species that can disproportionately contribute to functional diversity (Leitão et al., 2016). Another consideration is that the habitat matrix is three-dimensional and strongly 482 dynamic. Increases in depth coincide with increases in pressure and decreases in light, 483 productivity, temperature, and oxygen generating sub-surface habitats that can result in 484 different assemblages (Farré et al., 2016; Martini et al., 2019). An inexact analog is 485 migratory birds whose community membership changes along their migratory pathways 486 (Chen et al., 2018; Zuckerberg et al., 2016). We use "inexact" purposefully as the 487 seasonal dynamics within a given locale in the NEP can be equivalent to the creation 488 and erosion of elevational gradients and 20° shifts in latitudinal gradients within a year 489 as eddies form and dissipate, current strength waxes and wanes, and sub-surface 490 features stabilize and abate. Subdividing these seasonal and vertical components more 491 explicitly may be necessary to draw better comparisons to between macroecological 492 gradients relevant to the pelagic ocean to those commonly studied in terrestrial, 493 freshwater, or neritic ecosystems.

An obvious caveat to our conclusions is the role of missing data within the trait matrix. Not surprisingly, traits derived from more labor-intensive collection, such as growth rates, standardized diets, and age at maturity, were missing for the greatest number of species. Similarly, rare and deep-water species, such as Frilled Shark (*Chlamydoselachus anguineus*), were missing the greatest number of traits (Figure 1).

Compared to community studies of other taxa, many shark species in our regional pool
are exploited either directly or indirectly through fisheries bycatch (WPRFMC, 2019).
For example, Filetail Catshark (*Pseudotriakis microdon*) has been collected in fisheriesindependent surveys (Keller et al., 2014), but has not had a formal study on age and
growth. Thus, for some species, the hurdle to improving trait coverage is not the
collection of specimens but generating usable data from those collections.

Our use of pictographs for body morphology and photogrammetry for tooth crown 506 morphology represent one method to generate functional traits for these data-poor 507 species. These digitization efforts were designed to provide holistic traits with 508 reasonable species coverage (51/52 and 35/52 species, respectively). It appears this 509 holism was accomplished as the broad splitting of the functional dendrogram along the 510 r-K axis was reflected in the body shapes and tooth crown morphologies. The contrast 511 between species with elongated first dorsal and pectoral fins as well as a high aspect 512 ratio caudal fin (groups A-D) and species with more pronounced second dorsal and anal 513 fins as well as lower aspect ratio caudal fins (groups F-J)(Figure 4) is consistent with the 514 groups from the seminal pictograph analyses on shark body shapes by Thomson and 515 Simanek (1977). Similarly, groups A-E had tooth crowns with centered apexes, often 516 long crowns, and flat root margins while F-J groups had off-centered apexes, short 517 crowns, and, for three of the five groups, bulbous root margins. We were impressed with 518 this parallelism across trait axes as the pictographs and photographs were analyzed in 519 a scale-free way. We recommend other functional ecology studies attempt similar 520 efforts for difficult to acquire traits based on their ease of implementation (at least for the 521 pictographs) and success herein.

In terms of impact of trait coverage on our analyses, species with lower coverage tended to be on the fringes of the PCoAs; especially those in trait suites with a mixture high and low coverage (e.g., habitat, reproductive, somatic growth, and overall) (Figure 3 and Supplemental Figures 15-20). Low trait coverage played a role in determining the functional groups with groups E and H seemingly defined by it (Figure 4). A reasonable assumption would be that species with many missing trait values would likely be reassigned to other clusters or grouped into a larger cluster with improved data coverage. This is important for considering downstream applications, such as calculating functional diversity at finer spatiotemporal scales, because the dendrogram structure is partially influenced by coverage, and is likely to change as new data are included (Kim et al., 2018).

533 For our phylogenetic analyses, we chose to use a phylogram over a chronogram. 534 This allowed us to focus on comparing trait diversity to feature diversity rather than 535 divergence time between species (Jantzen et al., 2019). Phylogenies are often used as 536 proxies for functional diversity based on the assumption that, when using a robust 537 phylogeny and including numerous functional traits, the two should be highly correlated; 538 though this is not always the case (Mazel et al., 2017; Tucker et al., 2018). In this study, 539 we sought to explicitly relate the multiple facets of functional diversity to the 540 phylogenetic information derived from our highly sampled, well-resolved community 541 phylogeny (Gerhold et al., 2015). We found that individual traits tend to either have very 542 high or very low phylogenetic signal (Figure 1). Across functional groups, half of them 543 were clustered deep within the phylogeny and 40% were clustered overall. Despite this 544 strong similarity in the functional dendrogram and phylogram's backbone structure, only

545 20% of functional groups had species clustered near the branch tips. Thus, for our
546 shark species, the phylogram is a proxy for extreme differences in functional traits
547 derived from evolutionary divergence deep in the tree but, not for the diversity within a
548 functional group occurring near the functional dendrogram tips.

Lastly, conducting PCoAs alongside the functional dendrogram analyses 550 facilitated a better understanding of how the structure of the functional dendrogram was 551 generated. Distinct clustering and strongly loading traits in the habitat and reproductive 552 trait suite PCoAs reflected deep splits and influential traits in the functional dendrogram 553 while equivocal clusters in somatic, trophic, and dentition trait suite PCoAs reflected 554 shallower splits. Additionally, by conducting PCoAs on the suites independently, we 555 could identify major axes of variation for each suite and compare to how those axes 556 integrated in the functional dendrogram, in the functional groups, and in the overall 557 PCoA. This is entirely expected as the functional dendrogram and PCoAs used the 558 same data but, by facilitating different visualization, yielded complementary and 559 confirmative approaches.

560 Trait datasets have a multitude of applications within functional ecology and 561 community phylogenetics (Cadotte et al., 2011). Applying trait filling approaches to our 562 trait matrix is a likely necessary step for pursuing some of these applications. The 563 strong signal of bathymetry and carbon source gradients apparent in the PCoAs and 564 functional groups are an opportunity to explore the correlates of macroecological 565 turnover in taxonomic, functional, and phylogenetic diversity in the pelagic ocean. 566 Lastly, there are opportunities to apply these diversity enumerations to the management 567 of sharks for the numerous fisheries operating in the NEP. The listing of Oceanic

Whitetip Shark and Scalloped Hammerhead Shark (*Sphryna lewini*) under the
Endangered Species Act places considerable pressure on United States fisheries to find
solutions to reduce shark-fishing interactions (Karp et al., 2011; WPRFMC, 2019). This
trait database and community phylogenetics analysis can be a complementary way to
categorize bycatch risk across shark species, define appropriate surrogates for risk
analyses of data-deficient species, and provide holistic metrics of shark biodiversity
impacts.

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775 DATA AVAILABILITY STATEMENT

All scripts and data to reproduce the data and supplementary information can be found at <u>https://osf.io/eszvb/</u>.

- 779 **TABLE 1**
- 780 Percent of total variance explained by each principal coordinate (PCo) for each trait
- suite and the top three loadings from the Principal Coordinates Analysis of NE Pacific
 - 82 shark functional traits.

Trait Suite	PCo1	PCo2	PCo3	Top 3 loadings
Habitat	58	21	7	min. depth, max. depth, δ^{13} C
Reproductive	41	17	15	Size at birth, reproductive mode, # of offspring
Somatic Growth	46	17	14	$k_{\text{male}}, k_{\text{female}}, L_{\text{MAX}}$
Trophic	19	13	11	δ^{15} N, % mollusks, % teleosts
Dental	39	31	9	D symph, V symph, D row count
Overall	31	12	11	Size at birth, reproductive mode, min. depth

785 **FIGURE 1**

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SC D D S C



Summary of the phylogram (left-side) and trait table (right-side) for the 52 shark species
in the NE Pacific regional pool. Different colors in the phylogram identify different shark
orders. All traits are blocked by suite (habitat, reproduction, somatic growth, and trophic)

791 with darker colors indicating higher scaled values for continuous traits. The four 792 reproductive modes are colored individually. The proportion of the trait filled and the 793 phylogenetic signal of the trait, measured by Pagel's λ , are along the bottom with darker 794 colors indicating values closer to 1 (i.e., complete coverage or strong phylogenetic 795 signal for a particular trait). The mean body shape from pictographs for each species is 796 shown on the right.



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Summary of the dental traits and subset of the phylogram (left-side) for NE
Pacific shark species with jaw specimens. The number of teeth replicates (ranging from
8 to 96), the dorsal row count, ventral row count, dorsal symphyseal count, and ventral
symphyseal count are shown in colored circles on the left, warmer colors indicate higher
trait values. The mean tooth shape is drawn in black for each dorsal (D) and ventral (V)
position one through four adjacent to the symphysis.

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The first and second principal coordinate from a Principal Coordinates Analysis (PCoA) of each trait suite, habitat (A), reproductive (B), somatic growth (C), trophic (D), dental (E), and the overall trait matrix (F) for the NE Pacific shark regional pool. For each PCoA, the percent variance explained by the principal coordinate is shown in the axis labels, the coordinates of each shark species included in the analysis is shown in the

circles colored by the percent trait coverage for each suite, and the loadings are shown
in the gray arrows. Loadings are provided to show the relative variation in trait loading
across suites, see Supplemental Figures 15-20 for loading labels. The scales of the
coordinates are shown along the lower and left axes while the scales of the loadings are
shown along the right and top axes. Ecological interpretations of the PCoAs are
provided above the bottom axis for PCo1, to the right of the left axis for PCo2, and
denoted by T arrows.



The functional dendrogram for the NE Pacific shark regional pool from the full trait matrix (A) with the ten functional groups identified by the gap statistic and first standard error max criterion denoted by each color block. The cluster means for each functional

group are shown for each trait (B) with darker colors indicating high trait values. For the
pictograph and photogrammetric silhouettes, the mean silhouette is shown. The Z-score
for phylogenetic distance (PD), mean pairwise distance (MPD), and mean nearest taxon

distance (MNTD) is also shown for each cluster, warmer colors indicate under-

dispersion while cooler colors indicate overdispersion and asterisks indicate significant

values at $\alpha = 0.05$.



Macroecological strata (A-E) and their clustering on the functional dendrogram (F) and the phylogram (G) for the NE Pacific shark regional pool. A species membership to specific (A) latitudinal strata (tropics, subtropics, temperate, and arctic), (B) habitat type

based on ecological marine unit (EMU) classification, or (C) thermal strata based on average sea surface temperature were determined by their distribution defined by a species' 50% probability of presence. Membership to (D) carbon source gradient strata was based on a species' carbon stable isotope signature and to (E) bathymetric strata were based on a species minimum and maximum depth. The standardized effect size (Z-score) of the functional distance (FD), phylogenetic distance (PD), mean pairwise distance (MPD), and mean nearest taxon distance (MNTD) was determined from permutation using a tip-swapping null model using the functional dendrogram (F) or the phylogeny (G). Significant Z-scores were denoted by asterisks ($\alpha = 0.05$). All maps are projected in WGS 84.