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### Article

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# North Atlantic deep-sea benthic biodiversity unveiled through sponge natural sampler DNA

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Ramón Gallego <sup>1,11</sup>, María Belén Arias<sup>2,11</sup>, Andrea Corral-Lou<sup>3,11</sup>, Cristina Díez-Vives <sup>2,4</sup>, Erika F. Neave<sup>5</sup>, Cai Wang<sup>5,6</sup>, Paco Cárdenas <sup>7</sup>, Karin Steffen <sup>8</sup>, Sergio Taboada<sup>3</sup>, Adriana Villamor<sup>9</sup>, Ellen Kenchington <sup>10</sup>, Stefano Mariani <sup>5</sup> & Ana Riesgo <sup>2,3</sup>

The deep-sea remains the biggest challenge to biodiversity exploration, and anthropogenic disturbances extend well into this realm, calling for urgent management strategies. One of the most diverse, productive, and vulnerable ecosystems in the deep sea are sponge grounds. Currently, environmental DNA (eDNA) metabarcoding is revolutionising the field of biodiversity monitoring, yet complex deep-sea benthic ecosystems remain challenging to assess even with these novel technologies. Here, we evaluate the effectiveness of whole-community metabarcoding to characterise metazoan diversity in sponge grounds across the North Atlantic by leveraging the natural eDNA sampling properties of deep-sea sponges themselves. We sampled 97 sponge tissues from four species across four North-Atlantic biogeographic regions in the deep sea and screened them using the universal COI barcode region. We recovered unprecedented levels of taxonomic diversity per unit effort, especially across the phyla Chordata, Cnidaria, Echinodermata and Porifera, with at least 406 metazoan species found in our study area. These assemblages identify strong spatial patterns in relation to both latitude and depth, and detect emblematic species currently employed as indicators for these vulnerable habitats. The remarkable performance of this approach in different species of sponges, in different biogeographic regions and across the whole animal kingdom, illustrates the vast potential of natural samplers as high-resolution biomonitoring solutions for highly diverse and vulnerable deep-sea ecosystems.

The seas beyond the continental shelf (habitats occurring deeper than 200 m, commonly known as the deep sea) are widely recognised as the largest ecosystems on Earth, covering 65% of the planet's surface<sup>1</sup>. Despite this unique ecosystem providing a range of essential ecosystem functions and services (e.g., habitat provisioning, nutrient recycling, chemosynthetic primary production, etc.)<sup>2</sup>, deep-sea benthic communities remain among the least-studied on the planet, mostly due to the technical difficulties of

sampling these environments, compared to shallow-water or terrestrial habitats<sup>3</sup>. Basic ecological information (including species richness, genetic diversity, population connectivity, demographic parameters, and trophic dynamics) is still missing for many regions, hampering the delineation of conservation strategies<sup>4</sup>. This is problematic especially as the deep sea is facing increasing environmental pressures from accelerated anthropogenic disturbance, including trawling, mining, contamination, and climate

<sup>1</sup>Department of Biology, Facultad de Ciencias, Universidad Autónoma de Madrid, Calle Darwin 2, Cantoblanco, 28049 Madrid, Spain. <sup>2</sup>Department of Life Sciences, Natural History Museum, Cromwell Road, South Kensington, London, SW7 5BD, UK. <sup>3</sup>Department of Biodiversity and Evolutionary Biology, Museo Nacional de Ciencias Naturales (CSIC), Calle José Gutiérrez Abascal 2, 28006 Madrid, Spain. <sup>4</sup>Department of Systems Biology, Centro Nacional de Biotecnología (CSIC), Calle Darwin 3, 28049 Madrid, Spain. <sup>5</sup>School of Biological & Environmental Sciences, Liverpool John Moores University, Liverpool, L3 3AF, UK. <sup>6</sup>Key Laboratory of Tropical Forest Ecology, Xishuangbanna Tropical Botanical Garden, Chinese Academy of Sciences, Mengla, 666303, China. <sup>7</sup>Museum of Evolution, Uppsala University, Norbyvägen 16, 752 36 Uppsala, Sweden. <sup>8</sup>Department of Biological Sciences, Vanderbilt University, Nashville, TN, USA. <sup>9</sup>International Council for the Exploration of the Sea (ICES), H. C. Andersens Boulevard 44-46, DK, 1553 Copenhagen V, Denmark. <sup>10</sup>Ocean and Ecosystem Sciences Division, Fisheries and Oceans Canada, Bedford Institute of Oceanography, Dartmouth, NS, B2Y 4A2, Canada. <sup>11</sup>These authors contributed equally: Ramón Gallego, María Belén Arias, Andrea Corral-Lou. e-mail: [anariesgogil@mncn.csic.es](mailto:anariesgogil@mncn.csic.es)

change, causing deoxygenation, warming, acidification, biodiversity loss, and the disruption of ecosystem functions<sup>5</sup>.

North Atlantic deep-sea areas harbour a rich diversity of sponges that can sometimes form dense aggregations of individuals commonly known as sponge grounds that are widely recognised as Vulnerable Marine Ecosystems or VMEs<sup>6,7</sup>. The protection of VMEs was accelerated as a policy requirement on the high seas with the adoption of the United Nations General Assembly Resolution 61/105 in 2006 (A/RES/61/105), which called for their immediate protection from destructive fishing practices. The resolution highlighted that VMEs are important repositories of biodiversity. These unique biogenic habitats provide the three-dimensional structural complexity that can be used by a plethora of organisms, thus substantially increasing biodiversity and abundance of associated fauna<sup>8</sup>, including new recruits of commercial fish species<sup>9,10</sup>. The presence of structure-forming sponges also modifies the availability of organic matter by producing large amounts of detritus and by recycling the dissolved organic carbon through the so-called sponge-loop<sup>11</sup>, thus greatly contributing to benthic-pelagic coupling. Therefore, sponges and their associated grounds are key to ecosystem functioning and offer many ecosystem services and benefits to humans<sup>12,13</sup>.

Unfortunately, many deep-sea seafloors, including those with VMEs such as sponge grounds, are facing perturbations from bottom trawling<sup>13,14</sup>. Likewise, the increase in oil prospecting and deep-sea mining following the discovery of rare metals for green technology<sup>4</sup> has resulted in a significant decrease in both the diversity and abundance of the organisms associated with these vulnerable ecosystems (e.g.,<sup>15,16</sup>). Climate change poses yet another serious threat to these deep-sea communities by altering water temperature, pH, salinity, and oceanographic currents, which might affect the growth rate, distribution, and reproduction of deep-water organisms<sup>17–19</sup>.

Monitoring biodiversity is paramount to understanding the effects of anthropogenic disturbance on the marine realm, given the dramatic scale of ocean biodiversity loss (e.g.,<sup>20,21</sup>). While traditional methodologies remain extremely important for biodiversity discovery in the ocean (e.g.,<sup>22</sup>), the extent, cost, effort, and expertise required to identify animal diversity in a

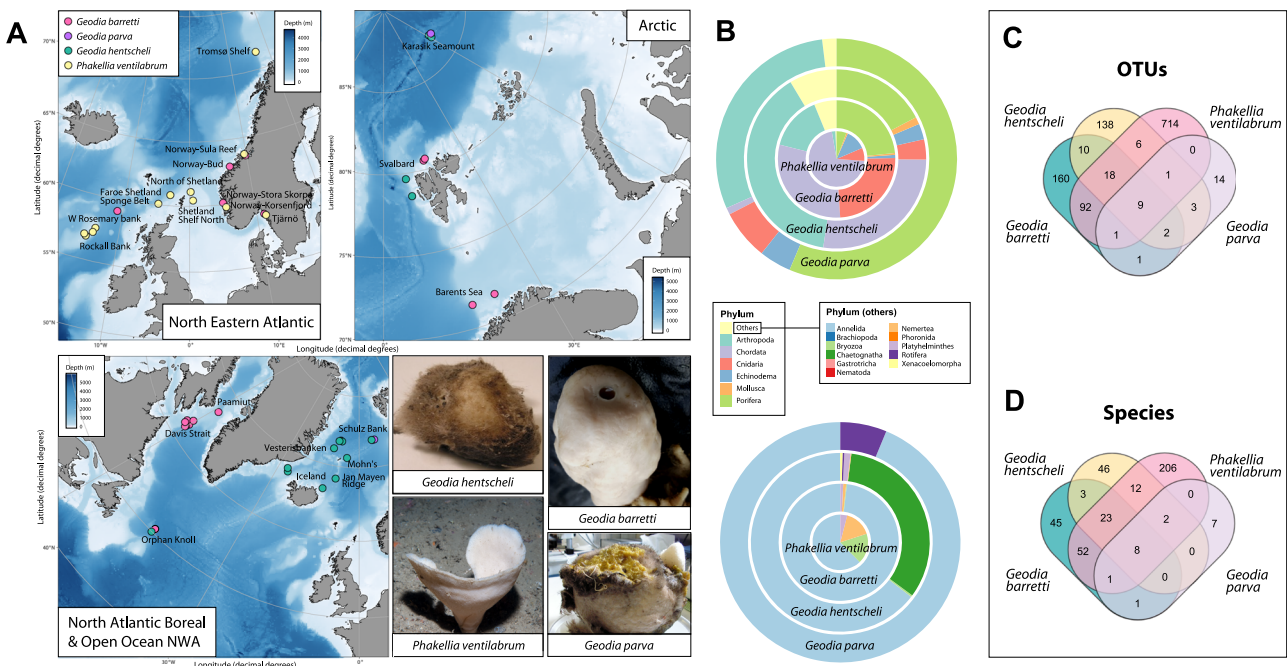
given deep-sea marine ecosystem, limits the application of marine monitoring approaches across the globe<sup>20,21</sup>. Among the latest technologies, metabarcoding of bulk DNA and environmental DNA (eDNA, i.e., the genetic material released by organisms through those cells and tissues in ecosystems<sup>23</sup>) are increasingly and widely adopted by the research community<sup>24–26</sup>. It is known that eDNA effectively recovers the ecological communities trace organismal and extra-organismal DNA in a relatively short temporal window of ~24–72 hours within the shedding<sup>27–29</sup>. Recently, the recovery of eDNA from sponge tissues, also known as sponge ‘natural sampler DNA’ (nsDNA)<sup>30–35</sup> has opened the possibility of monitoring metazoan biodiversity over a longer temporal period and with a greater spatial footprint than taking seawater samples<sup>32</sup>, through the collection of a few individuals of sponges with large capacities for filtering water. In this context, sponges that rely less on the microbial symbiotic consortia inhabiting their tissues—i.e., “low microbial abundance” (LMA) sponges—are generally better at retaining eDNA than high microbial abundance species<sup>32,34</sup>, given that they are more active filterers<sup>36</sup>, and retain eDNA more efficiently and for longer than seawater<sup>32</sup>.

Here, in order to assess the biodiversity of benthic metazoans contained in VMEs, we use tissue from several sponge species that are dominant in the sponge grounds of the northeast Atlantic Ocean, the North Atlantic boreal (NAB) waters, the Arctic and the mid-Atlantic Ocean biogeographic regions, to retrieve eDNA from the metazoan benthic communities that live in association with these sponges at depths between 40 and 2750 m. We unveil unprecedented diversity at high taxonomic resolution for deep-sea ecosystems, placing this approach as a transformative tool for ocean monitoring programmes, which can evaluate biodiversity in VME and other deep-sea habitats over a broader sampling reach than through seawater sampling.

## Results

### Sequence read abundance and ASV/OTU richness

We obtained 14.26 M raw reads that could be assigned to the 97 original samples confidently collected in four biogeographic regions (Fig. 1A, Supplementary Data 1). After filtering, detection of ASVs and clustering, 8,991,467 reads assigned to 11,198 OTUs were retained. A total of 9035



**Fig. 1 | Sampling sites of the host sponges collected and overall metazoan community composition.** A Map of the North Atlantic and Arctic regions with the different sampling sites, and sponge photographs, to illustrate the morphological differences among the species. Pictures of *Geodia* spp. were taken by Paco Cárdenas and that of *Phakellia ventulabrum* was taken by Bernard Picton and reproduced with

his permission. B in the graph above proportion of reads sequenced for each metazoan phyla across the sponges. Reads associated with the host species are not shown. In the graph below the phyla detected with lower read proportions. C Venn diagram to illustrate the shared OTUs across the sponges. D Venn diagram of metazoans assigned at species level and shared across sponges.

operational taxonomic units (OTUs) comprising 1.38 M reads were not assigned to any taxa, either because there was no BLAST hit over 75% for them (1.25 M reads) or the hits that passed the filters did not agree on any of the taxonomic ranks (132k reads). All these low-confidence or “unassigned” reads were removed from further analyses, alongside contamination from humans or pigs (which was minor, with only 465 reads in *G. hentscheli*, 774 in *G. barretti*, 58 in *G. parva* and 830 in *Phakellia ventilabrum*), producing a final dataset of 7.61 M reads from which 5.7 M were assigned to one of the four host sponges: *Geodia barretti* (2,450,992), *G. hentscheli* (2,482,007), *G. parva* (407,387) and *Phakellia ventilabrum* (381,774); leaving 1,888,683 reads linked to the sponge nsDNA community surrounding the sponge hosts (Supplementary Data 2).

The sequences assigned to organisms coming from the sponge nsDNA community yielded a total of 2096 OTUs, identified as 590 different taxa from both Eukaryota and Prokaryota (Supplementary Data 3). Accumulation curves showed both a range of estimated species richness and a depth of sequences obtained among each sample. Most curves were asymptotic, some much more than others, suggesting the samples were adequately sequenced to capture the species richness (Supplementary Fig. 3).

The species *Phakellia ventilabrum* retained a larger proportion of environmental DNA compared to the three *Geodia* species, from which we isolated mostly host DNA (Supplementary Data 2; Supplementary Fig. 1A). In all *Geodia* spp., ~90% of their reads were assigned to the host sponge species, while only ~20% were assigned to the host in all *Phakellia ventilabrum* (Supplementary Data 2; Supplementary Fig. 1A).

Eukaryotes were the best-represented group in the nsDNA, with 1.8 K OTUs and 550 species (here species are considered as taxa identified to species level, including also those identified as genus sp.). Amongst them, metazoans included 406 species (953 OTUs and >1 M reads) (Fig. 1B, Supplementary Data 3). The species *P. ventilabrum* recovered 304 species of metazoans (671 OTUs and almost 1 M reads), followed by *G. barretti* with 133 species (245 OTUs and 38,993 reads), and *G. hentscheli* with 94 species (163 OTUs and 14,592 reads), which retained almost twice the number of prokaryotic reads compared to *G. barretti* (Supplementary Data 3). For *G. parva*, very few OTUs, species and reads were recovered (Supplementary Data 3), given that only four tissue samples were included in the study. The largest number of shared OTUs between sponge species was found between *P. ventilabrum* and *G. barretti* (92 OTUs), given that they are both temperate-boreal dominant species of the sponge grounds in the NE Atlantic, co-occurring in many of our sampling sites (Fig. 1C, D).

### Metazoan diversity

A total of 17 metazoan phyla were detected across the sponge samples (Fig. 1A, B); 13 of those were detected in *P. ventilabrum* samples, followed by 9 in *G. hentscheli*, 9 in *G. barretti*, and 6 in *G. parva* (Fig. 1B, Supplementary Data 3). The dominant phyla based on OTUs and number of species detected across all the sponge samples were Chordata, Arthropoda, Porifera, Cnidaria, and Echinodermata (Fig. 1B). Noteworthy is the prevalence of the phylum Porifera among all *Geodia* spp. while *P. ventilabrum* was dominated by Chordata, Cnidaria and Echinodermata (Fig. 1B, Supplementary Data 3). Annelida, and Mollusca were also detected across the sponges; however, the read number was at least five orders of magnitude higher for *P. ventilabrum* than for any other *Geodia* spp. Rare phyla, like Brachiopoda, Nematoda, and Phoronida, were exclusively detected in *P. ventilabrum* (Fig. 1B, Supplementary Data 3).

Since Chordata, Cnidaria, Echinodermata and Porifera were the most represented phyla across the four sponge species, based on reads, OTUs, and a number of unique species, further detailed analyses were performed for these groups. Within Chordata, 73 fish species (including Osteichthyes, Chondrichthyes and Myxini) were detected from 49 sponge samples. The most speciose order was Gadiformes, with 19 species mostly from the NE Atlantic, followed by Perciformes and Pleuronectiformes (Fig. 2A, Supplementary Data 4). Most of the fish species were present in the NE Atlantic samples, followed by the NAB, the Arctic, and finally the Open North Western Atlantic samples (Fig. 2B). In the NE Atlantic region, 38 species

were exclusively found, while 16 were exclusively detected in the NAB, and none were exclusive to the Arctic or the Open North Western Atlantic samples (Fig. 2B). Only one fish species, *Eutrigla gurnardus*, was detected across all biogeographic regions, and four were common to NE Atlantic and NAB (Fig. 2B). *Phakellia ventilabrum* was the host collecting the greatest diversity of chordates (56) followed by *Geodia barretti* with 32 species (Fig. 2C).

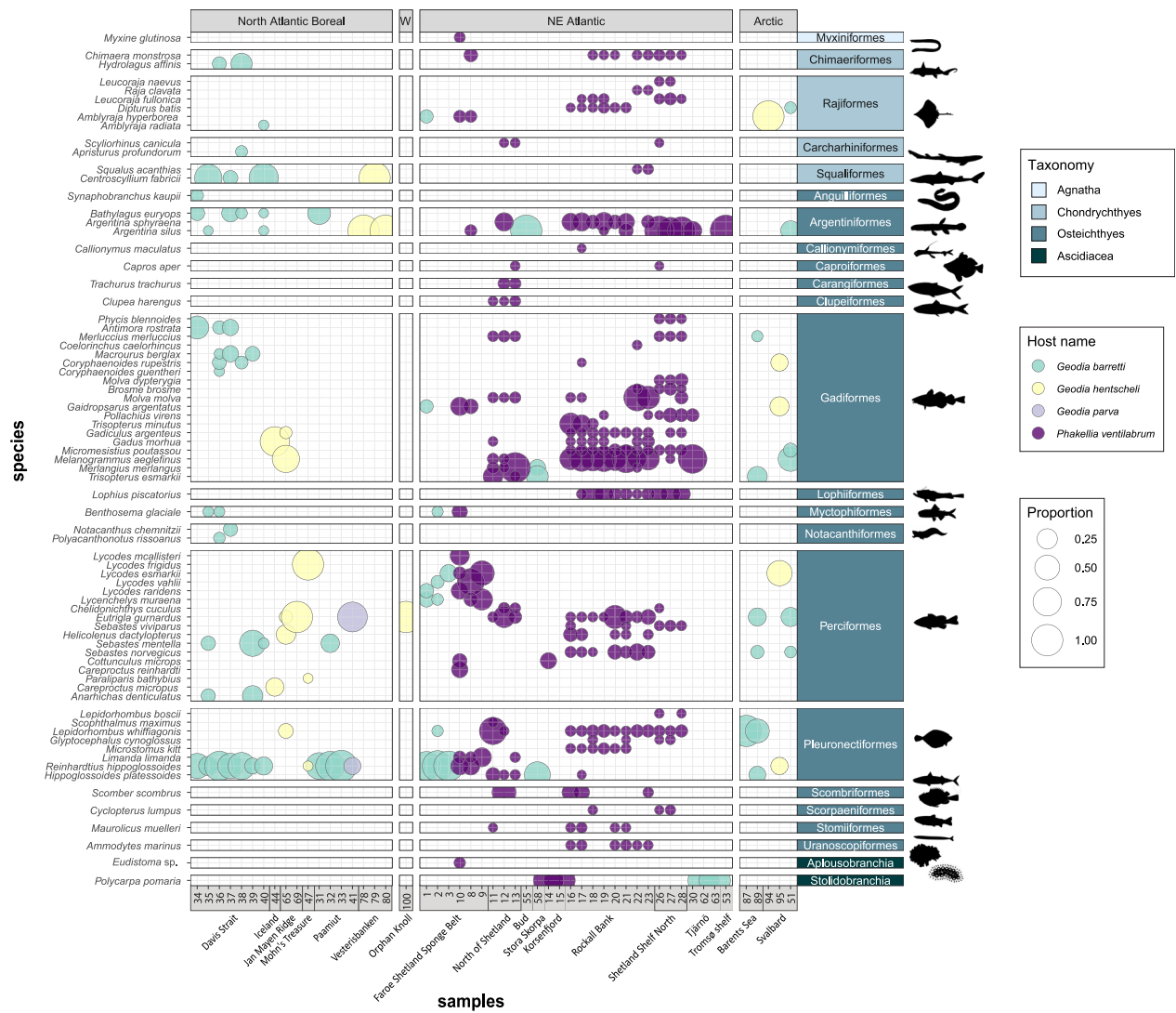
Among the cnidarians, 86 species were detected from 75 sponge samples across the biogeographic regions, many of them exclusive for the NE Atlantic (Fig. 3A–C, Supplementary Data 4). Across the four biogeographic regions, only one unidentified hydrozoan species of the family Sphaerocorynidae was detected, but five species were present in both NAB and NA Atlantic (Fig. 3A–C). The deep-water cosmopolitan jellyfish *Periphylla periphylla*, the hydrozoans *Lafoea dumosa*, *Orthopyxis calculata* and *Nemopsis bachei* and the scyphozoans *Phacellophora camtschatica* and *Cyanea lamarckii* were frequently identified in the NAB samples and around the British Isles (Fig. 3A). Several anthozoans were detected, *Gersemia rubiformis* and *Leptogorgia virgulata* were very abundant in the Arctic, *Paragorgia arborea* in the NAB, and *Paramuricea* sp. across the North Eastern Atlantic (Fig. 3A). The indicator species of Vulnerable Marine Ecosystems (VMEs), as defined by ICES (2020)<sup>37</sup>, *Lateothela grandiflora* and *Drifa glomerata*, were detected in the NE Atlantic region and the Arctic Karasik seamount (Fig. 3A, Supplementary Data 1, 4). The anthozoan *Caryophyllia smithii*, also considered an indicator species of VMEs, was exclusively detected in the North of Shetland area (Fig. 3A), and the black coral *Bathypathes* sp. was only detected in Greenland (Fig. 4A). As in all previous cases, *Phakellia ventilabrum* was the host collecting the greatest diversity of nsDNA coming from cnidarian species (65) of all sponges (Fig. 3C).

Another diverse and abundant phylum detected was Echinodermata, with 43 species identified from 49 sponge samples across the biogeographic regions, again highlighting *Phakellia ventilabrum* as the best natural sampler for them (Fig. 4A–C). In the NE Atlantic, a total of 28 unique echinoderm species were detected, followed by six and two unique species in the NAB and Arctic, respectively (Fig. 4B, Supplementary Data 4). Although asteroids, echinoids, holothuroids, crinoids, and ophiuroids were all recovered from the sponge samples, the echinoid *Gracilechinus acutus* was dominant across areas (Fig. 4). Another frequently encountered species was the holothuroid *Parastichopus tremulus*, primarily found in the NE Atlantic and the Arctic (Fig. 4A). Interestingly, the ophiuroid *Ophiactis abyssicola* widely distributed in the North Atlantic deep-sea was only detected in the NAB and one Arctic sample (Fig. 4A).

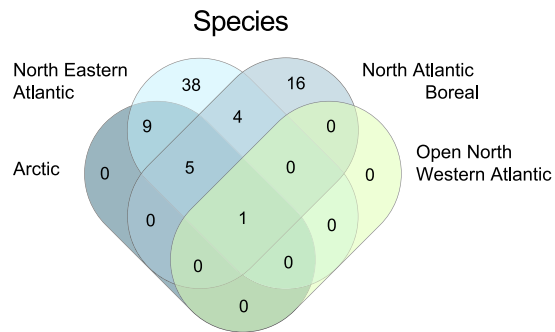
With sponges being the most abundant organisms in the deep-sea sponge grounds sampled, the diversity of Porifera recovered was very high, with 87 species, most of them demosponges (Fig. 5A, Supplementary Data 3–4). It is important to note here that we removed the *Phakellia ventilabrum* sequences recovered in all sites where the host was *P. ventilabrum*, and the same for *Geodia barretti* and *G. hentscheli*, and many of those sequences could have been neighbouring sponges instead of the host itself, masking the true presence of this species in the different regions. The most abundant species in all regions were *Hexadella dedritifera*, *Petrosia crassa*, *Geodia* spp., *Phakellia ventilabrum*, *A. infundibuliformis*, but also, in the NE Atlantic *Biemnia variantia* and *Lissodendoryx* sp. (Fig. 5A, Supplementary Data 4). The sponge fauna from the different biogeographic regions was quite distinct, with only five species in common across all of them, 38 unique for NE Atlantic, 12 for the NAB and two species unique to the Arctic (Fig. 5B–D). Again, for poriferans, the best sampler was *P. ventilabrum* (Fig. 5E).

Finally, although the arthropod species accounted for many reads, their biodiversity in deep-sea waters is relatively poorly sequenced and hampered the taxon assignments (Supplementary Fig. 2). Among those that had reliable species assignments, decapods, calanoids and amphipods were found to be dominant in the NE Atlantic region, while they were mostly absent from the NAB and the Arctic (Supplementary Fig. 2). Interestingly, we found reads assigned to the North American horseshoe crab, *Limulus*

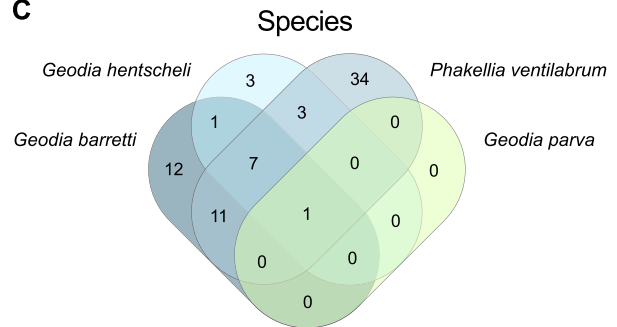
A



B



C



**Fig. 2 | Chordates detected using sponge nsDNA across biogeographic regions.** A Bubble plot depicting all Chordata detected at the species level. Circle size indicates read proportions of detected species in a sponge sample. Colours represent the host species. Samples are listed at the bottom (ID details in Supplementary Data 1).

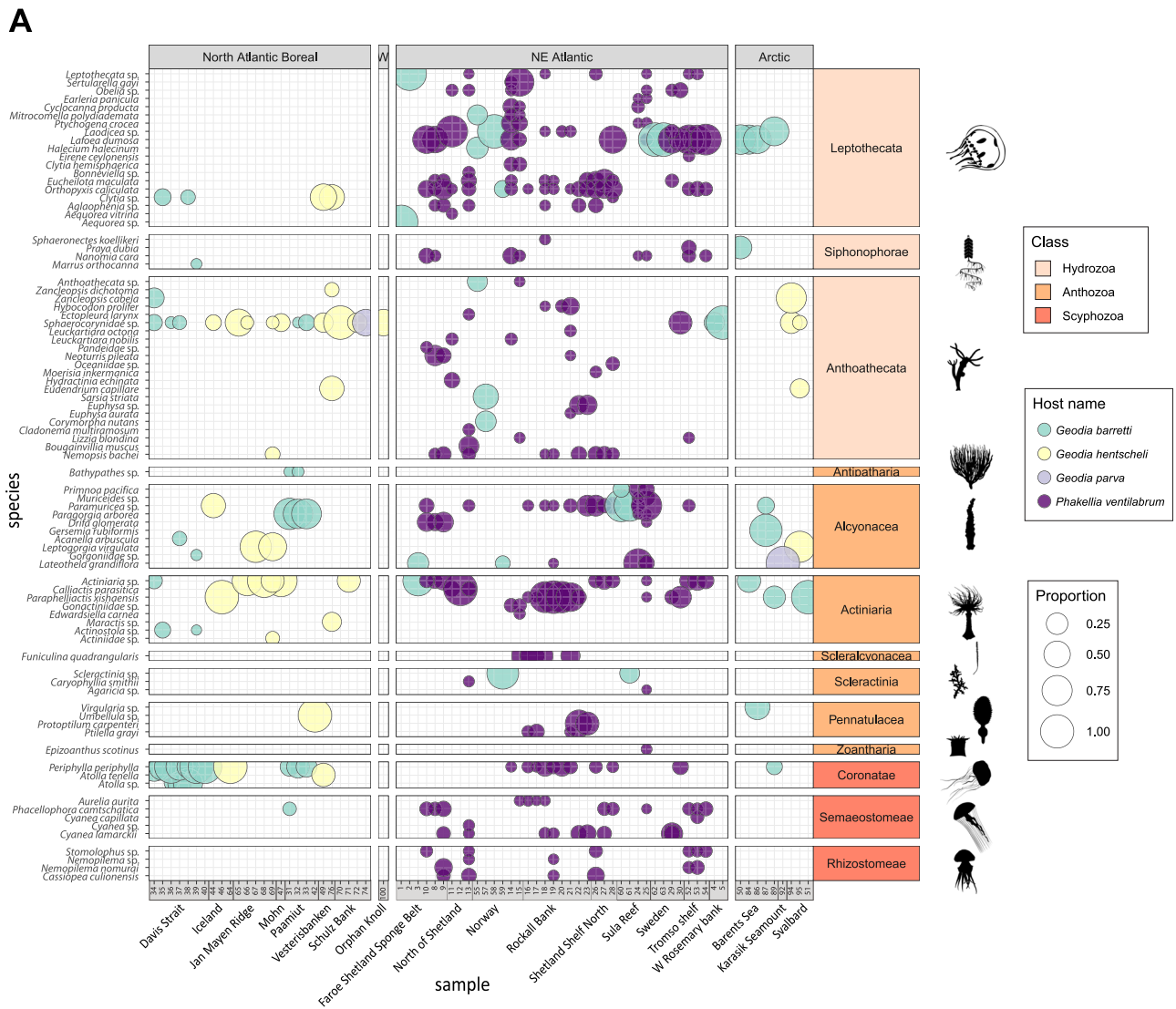
**B** Venn diagram with a number of fish species shared by biogeographic regions. **C** Venn diagram with a number of fish species shared across sponge species. All animal icons were obtained from phylopic.org.

*polyphemus* in several samples collected in the Northern British Isles (Supplementary Fig. 2).

**Community structure**

The biogeographic region showing the highest diversity (Shannon index values) was the northeast (NE) Atlantic, while the Arctic showed the lowest diversity (Fig. 6A). The most diverse NE Atlantic sites were those in the

Norwegian Seas (Tromsø Shelf and Sweden) and the Faroe-Shetland Sponge belt. In contrast, the lowest alpha diversity was found in Jan Mayen Ridge from the NAB region (Fig. 6B). This alpha diversity was significantly different across the biogeographic regions (ANOVA,  $p = 0.0032$ ,  $F = 4.92$ ) specifically NE Atlantic against NAB and Arctic, but not depth ( $p = 0.095$ ,  $F = 2.41$ ) (Supplementary Data 5A). The shallowest waters were slightly more diverse than the mesophotic layer and the deepest waters (although



**Fig. 3 | Cnidarians detected using sponge nsDNA across biogeographic regions.** **A** Bubble plot depicting all cnidarians detected at the species level. Circle size indicates read proportions of detected species in a sponge sample. Colours represent the host species. Samples are listed at the bottom (ID details in Supplementary

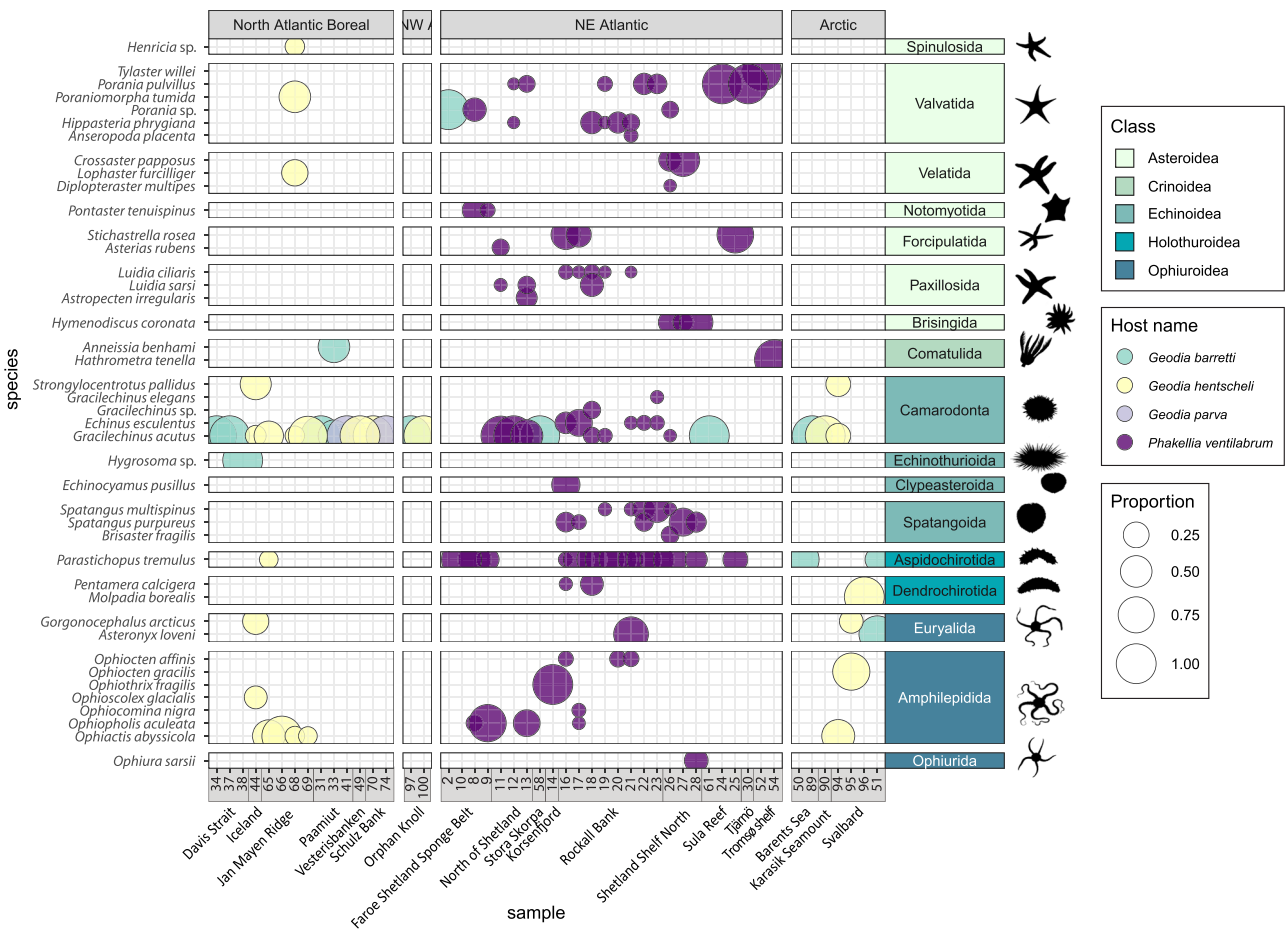
Data 1). **B** Venn diagram with the number of cnidarians species shared by biogeographic regions. **C** Venn diagram with the number of cnidarians species shared across sponge species. All animal icons were obtained from phylopic.org.

not significantly), which showed similar levels of alpha diversity (Fig. 6C, Supplementary Data 5A).

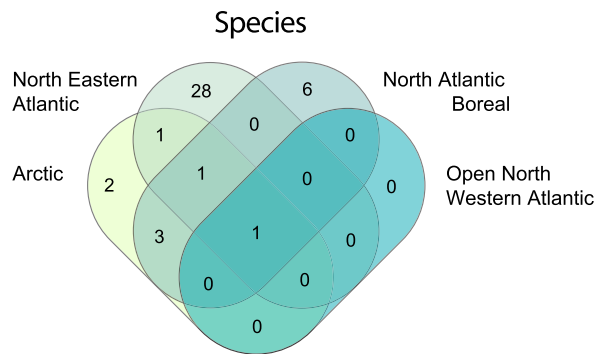
Ordination analysis organised samples by their geographic region. We also plotted depth as contour lines on the principal coordinates analysis (PCoA) plots (Fig. 6F, G). While the shallower NE Atlantic sites were generally richer and separated from the other regions, the NAB and the Arctic sites exhibited greater overlap (Fig. 6F, G). PERMANOVA analyses

confirmed that the metazoan communities of the three main biogeographic regions (i.e. NAB, NE Atlantic, and Arctic) were significantly different, however this factor only explained 8% of the variation in distances between OTUs (Supplementary Data 5B). Depth was also an important factor driving the differences in beta diversity across metazoan communities (Supplementary Data 5B), with PERMANOVA only explaining 7.4% of the variance.

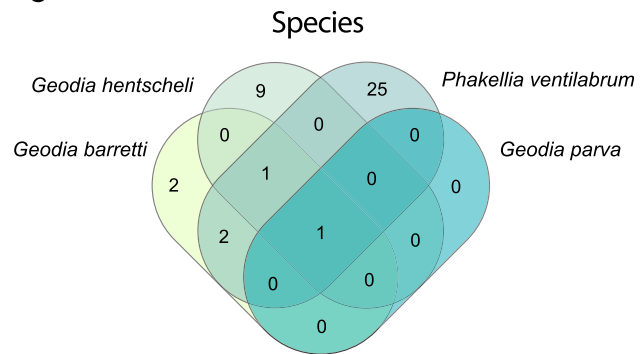
A



B



C



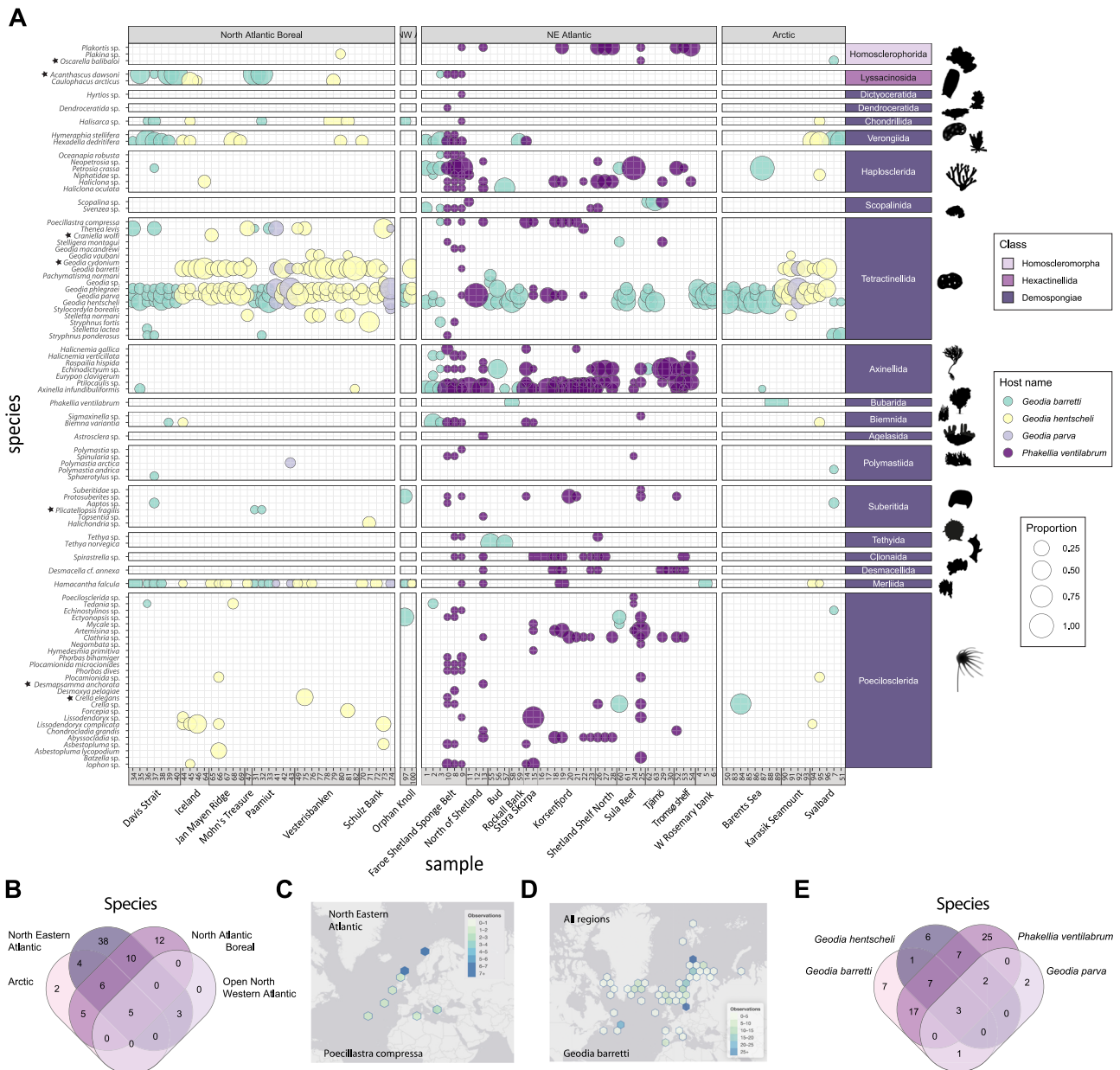
**Fig. 4 | Echinoderms detected using sponge nsDNA across biogeographic regions. A** Bubble plot depicting echinoderms detected at the species level. Circle size indicates read proportions of detected species in a sponge sample. Colours represent the host species. Samples are listed at the bottom (ID details in

Supplementary Data 1). **B** Venn diagram with the number of echinoderm species shared by biogeographic regions. **C** Venn diagram with the number of echinoderm species shared across sponge species. All animal icons were obtained from phylopic.org.

Since the differences in filtration rates by the predominant sponges in the different regions could play a role in the global differentiation of the communities, we also tested the differences using exclusively *Geodia barretti*, which was collected in all regions (although with only one sample in the Open Atlantic northwest Atlantic, which was excluded from the analysis). Using only the metazoan species collected by *G. barretti*, the tests showed global differentiation across biogeographic regions, but further pairwise tests demonstrated no significant differences between NE Atlantic and the Arctic (Supplementary Data 5B). In fact, the Arctic and the NE Atlantic sites shared more OTUs and species than the NAB (Fig. 6D, E). The indicator species analyses only identified six species for the NE Atlantic, with *Axinella*

*infundibuliformis* and *Lepidorhombus whiffiagonis* as the most important two for the northwest Atlantic (Supplementary Data 6, Supplementary Fig. 4). A total of 47 species were identified as indicators for shallower waters. Among these were prominent fish species such as *Argentina sphyraena*, *Melanogrammus aeglefinus*, *Scomber scombrus* and *Trisopterus minutus*. Additionally, notable representatives included the cephalopod *Loligo forbesii* and the brittle star *Ophiocten affinis*. Three species were identified as indicators for the mesophotic area. Furthermore, 11 species were high-lighted as indicators for the deepest sites, encompassing fishes such as *Antimora rostrata*, *Coryphaenoides rupestris*, *Bathylagus euryops* and *Hydrolagus affinis*. Among other deep-sea species were the hydrozoans





**Fig. 5 | Poriferans detected using sponge nsDNA across biogeographic regions.** **A** Bubble plot depicting Porifera detected at the species level. Circle size indicates read proportions of detected species in a sponge sample. Colours represent the host species. Samples are listed at the bottom (ID details in Supplementary Data 1). Black stars indicate shallow-water species commonly known from other areas, whose identification is improbable and potentially indicate the presence of closely related

species in our sampling regions. **B** Venn diagram with the number of poriferan species shared by biogeographic regions. **C, D** Distribution range and abundance for two indicator sponge species of VMEs with restricted (**C**) and wide (**D**) distributions. **E** Venn diagram with the number of poriferan species shared across sponge species. All animal icons were obtained from phylopic.org.

*Zancleopsis cabela* and *Eudendrium capillare* and the ophiuroid *Ophiactis abyssicola* (Supplementary Data 6, Supplementary Fig. 4).

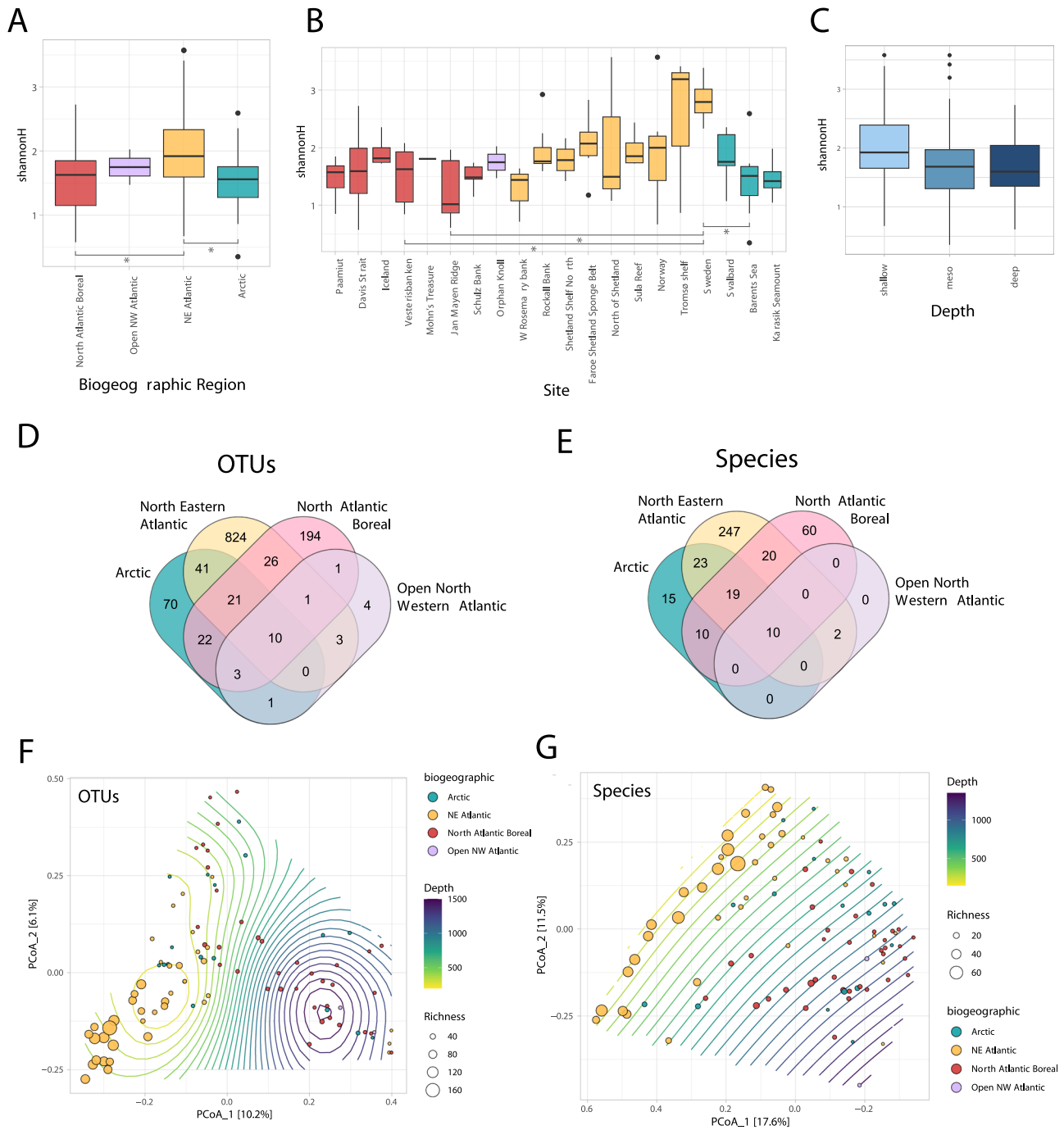
**Discussion**

We assessed diverse metazoan communities, mostly benthic, but some pelagic organisms were also detected, providing evidence to support sponge nsDNA as a high-resolution method to assess the biodiversity of deep-sea communities. Our results show the effectiveness of sponge nsDNA as a tool to evaluate community shifts across latitudinal and bathymetric ranges in the North Atlantic deep-sea compared with seawater sampling. This approach using a 313 bp marker reveals species-level resolution in metazoans, remarkably accurate for Chordata, Cnidaria, Echinodermata and Porifera, although in general, a substantial proportion of sequence reads remained unassigned, echoing a plethora of studies that call for the

expansion of public DNA sequence repositories along with an increment of taxonomic identification efforts.

**Biodiversity of sponge VMEs estimated through sponge nsDNA**

Fragments of environmental DNA accumulated in the powerful sponge filtration systems portrayed much of the biodiversity of the North Atlantic deep-sea ecosystems to an unprecedented resolution. In total, 550 taxa at the species level were detected for eukaryotes, more than 70% of them being metazoans. We also detected non-target taxa in our results, such as prokaryotic and non-target eukaryotic DNAs, which is typically related to the degeneracy of the primers leading to amplification of non-target DNA sequences<sup>38</sup>. In comparison, the detailed assessment of such biodiversity from sponge grounds in deep-sea areas would have meant an investment of several years and millions of euros if traditional monitoring methods (e.g.,



**Fig. 6 | Diversity patterns and shared members across regions. A** Shannon diversity value was analysed by biogeographic region. Horizontal lines indicate significantly different groups (TukeyHSD:  $p < 0.05$ ). **B** sampling site, coloured according to their corresponding biogeographic region, and **C** depth. **D**, **E** Venn

diagrams of the number of OTUs and species shared by biogeographic regions. **F**, **G** PCoA plots for the beta diversity of OTUs and species, respectively. Circle size indicates species richness, and circle colour indicates biogeographic region. Depth is plotted as an additional layer.

trawling, photogrammetry surveys, taxonomic identification by experts, etc.) were used, highlighting the staggering potential of the nsDNA method towards an efficient and cost-effective biodiversity monitoring tool for deep-sea environments and analyse regional trends.

Given that the molecular assessment of benthic metazoan faunal community patterns is usually done through eDNA collected from near-bottom seawater, sediments, or bulk community DNA, comparisons of sponge nsDNA to different studies are challenging. Yet, despite the factors contributing to differences in molecular biodiversity assessments, the exceptional diversity of metazoans identified at the species level in our study has not been recovered before from environmental DNA surveys of benthic

and demersal ecosystems. Similar numbers of taxa have been found in shallow-water biodiversity hotspots<sup>39–41</sup>, where the metazoan communities are relatively well represented in public databases. For deep-sea ecosystems, most studies focus on sedimentary habitats<sup>42–46</sup>, where mostly active meiofauna was recovered, while our approach recovered both benthonic and epi-benthonic fauna. For deep-sea waters (i.e., using seawater to collect eDNA), the diversity found was lower than in our study<sup>47–52</sup>. Recently, two studies assessed the biodiversity contained in similar deep-sea habitats<sup>35,53</sup>. While Brodnicke and collaborators<sup>35</sup> used sponges to capture eDNA from the boreal site of Schulz Bank, collecting 16 different species of sponges<sup>35</sup>, this was done only to assess fish diversity in the area. The other study was

performed on the Canadian shelf, and they used seawater to convey a multi-marker (12 S, 16 S, and COI primers) analysis of the biodiversity<sup>53</sup>. While we found twice as many metazoan species with COI, this larger diversity may be due to larger potential species pools in VMEs and larger biogeographic ranges.

The overall community structure across the sponge grounds surveyed here was dominated by Chordata, Cnidaria, Echinodermata and Porifera, mirroring the data previously published using either trawling or image surveys (e.g.,<sup>54–56</sup>). Interestingly, this megafaunal community structure resembles more that obtained with bulk community DNA from coral reefs<sup>57</sup>, than coastal benthic ecosystems<sup>40,58</sup>. In deep-sea sediments, significantly less diversity (around dozens of species) could be obtained from the South Atlantic<sup>46</sup>, the abyssal Pacific<sup>44</sup>, and the Mediterranean<sup>42,43,45</sup>, where nematodes and arthropods, were more abundant than any other group given that it was designed for capturing meiofaunal eDNA. While the low diversity of deep-sea sedimentary infauna recovered in the studies could be attributed to the peculiarities of the ecosystem, the methodology, and the sensitivity of the marker employed, it can also be due to the poor representation of deep-sea meiofaunal metazoans in the sequence repositories.

In the last year, Neave and collaborators<sup>34</sup> published a study conducted in the same areas (using the same sponge samples) that we present here, but focused on fish diversity sampled through the use of a 12 S teleost-specific marker. They detected 119 fish taxa, of which 65 identified to the species level, that differed between the biogeographic regions, with depth being the factor most likely driving differences across the distribution range<sup>34</sup>. Approximately 50% of the fish species were detected in both studies, with some orders of fish more easily detected with COI primers, such as Myxiniiformes, Carcharhiniiformes, Sygnathiiformes, Rajiformes and Uranoscofiformes, while others were consistently detected by 12S-MiFish primers but not COI (Aulopiformes, Beloniformes, Mulliformes, and Zeiformes). This astounding performance of COI as a marker for marine fishes contrasts with its known inefficiency in traditional aqueous eDNA studies<sup>38</sup> and it is more akin to scenarios where fish biomass is at high density, such as trawl nets (e.g.,<sup>59</sup>), which highlights an additional unique feature of sponges as powerful biodiversity sentinels.

### Composition and structure of sponge VMEs across marine biogeographic regions

VMEs are currently identified and further characterised based on the presence and abundance of indicator species matching the list of criteria outlined by FAO<sup>60</sup>, which include indicator species of sponges, corals, xenophyophores and some other groups (ICES 2020)<sup>37</sup>. For the designation of a VMEs, it is essential to identify a significant concentration of the VMEs indicator species; which is a requirement to recommend stricter regulations of fishing and mining activity (FAO 2009)<sup>60</sup>, and although eDNA reads cannot currently be used to estimate species abundances, our approach can help guide and focus monitoring efforts in VMEs. All of the sponge nsDNA samplers in this study are VMEs Indicators, therefore the sponge sampling sites themselves have potential to be VMEs, although not all are currently considered VMEs. For instance, the Swedish sites are not considered VMEs, and therefore, work that enables the identification of VMEs and the characterisation of VMEs communities could be essential to progress in their conservation planning. Here, we successfully detected a high number of VMEs indicator species, in addition to the sponge nsDNA samples, in all biogeographic regions surveyed. This helps to identify where more targeted research can be undertaken to locate VME habitats. We detected several indicator species for deep-sea sponge aggregations from the Arctic region (*Geodia hentscheli* and *Geodia parva*) as well as indicators for boreal sponge aggregations (*Stryphnus fortis*, *Stelletta normani*, *Axinella infundibuliformis*, *Phakellia ventilabrum*, *Craniella* sp. and *Mycale lingua*). These two types of aggregations showed clearly different metazoan assemblages, with the Arctic aggregations dominated by *Reinhardtius hippoglossoides* (see<sup>54,56</sup>), and the boreal grounds accompanied by a much richer fish and echinoderm fauna<sup>16,54</sup>. Deep Arctic sponge aggregations flourish with large aggregations of Hexactinellida, which could not be identified in our study because of the

paucity of COI sequences for them in the databases, but were identified by the abundance of Cladorhizidae.

In addition to important sponge species, coral VMEs indicator species of soft and hard bottom coral gardens (ICES 2020)<sup>37</sup> were also detected. For instance, cup coral (*Caryophyllia smithii*) were identified in the north of Shetland, where they are known to occur<sup>61</sup>. Other detected coral VME indicator species suggested the presence of coral gardens, characterised by large gorgonian species (*Paramuricea* spp.). This species has been validated as occurring in Iceland, the northern area of the Shetland Isles, the Norwegian deep-water coral reefs of Sula Reef, and the Barents Sea in the Arctic<sup>62,63</sup>, while the Canadian shelf had abundant communities of *Paragorgia arborea*<sup>64,65</sup>. Species of sea pen were identified in our study and concurred with the presence of sea pen fields dominated by *Umbellula* sp. in the Canadian deep shelf<sup>62,64,65</sup>, *Protoptilum carpenteri* and *Ptillella grayi* in the Rockall Bank, and *Virgularia* sp. in the Barents Sea, which are characteristic of soft bottoms. It is important to note that the reef-building deep-water coral species *Desmophyllum pertusum* (formerly *Lophelia pertusa*), indicator of cold-water coral reefs, was not detected in our study, despite its presence across the study area<sup>16,54</sup>. This could be due to the poor recovery of the species using universal COI primers<sup>66</sup> or the low amounts of eDNA shed by these species.

Characterisation of deep-sea fauna often entails intensive laboratory work performed by taxonomic experts to identify the species, and/or creation of predicted occurrences based on habitat suitability models to assess biogeographic patterns with relevance for conservation. Typically, different sampling tools are required to collect data on fish and invertebrate biodiversity, and on pelagic and benthic species. Here, we were able to determine the community composition and structure of the benthic and pelagic waters surrounding the targeted sponge grounds, allowing for differentiation across the biogeographic regions included in our study. This was also one of the main results of the assessment of fish biodiversity patterns in the area through sponge nsDNA conducted by Neave et al.<sup>34</sup>, which highlights the feasibility of our approach to understand large-scale biogeographic patterns in the deep ocean. Particularly, we obtained higher diversity values for metazoan species in the NE Atlantic region compared to the Arctic and the NAB, which correlate with the richer faunas that are endemic to the NE Atlantic oceanographic region<sup>67</sup>. Interestingly, we found strong similarities across the NE Atlantic and the Arctic metazoan assemblages, which have been previously shown for sponge communities<sup>68</sup>. Fifteen species were only found in the Arctic, including the echinoderm *Molpadia borealis*, the copepod *Temorites brevis*, and the sponge *Polymastia andrica*, which are exclusive from the Arctic region<sup>69</sup>. Interestingly, although the genus *Lycodes* is particularly abundant in the Arctic, albeit with an evident decline in Greenland<sup>70</sup>, we only found the greater eelpout, *Lycodes esmarkii*, in an Arctic location (Svalbard), while the rest were present in the NE Atlantic and NAB. This similarity across regions could be as a result of the rapidly increasing Atlantic influence in the Arctic region, known as “atlantification”, which is fuelled by global climate change<sup>71</sup>. This atlantification was previously noticed in the sponge, fish, and cnidarian faunas from these areas, which were strikingly similar<sup>69,70,72</sup>. Besides the effects of global change on the distribution patterns of the deep-sea fauna<sup>73</sup>, the fact that several sites coded as NAB fall in boundary areas with the Arctic with strong influence from its waters (Mohn’s Treasure, Jan Mayen Ridge, or the Schulz Bank), might also explain the mix of temperate, boreal and Arctic species gathered by the sponges.

In addition to the latitudinal regionalisation of deep-sea fauna, there is a strong vertical component in the open ocean that is driven by differences in light penetration, temperature, hydrostatic pressure and current regimes, which produces a strong biogeographic pattern for the benthic ocean with enormous importance for its conservation<sup>74</sup>. Such depth regionalisation was also fundamental in the differences across metazoan assemblages in our study and many indicator species were significantly correlated to the three depth ranges analysed here. Also, remarkably, fish species that are restricted to certain depths were accurately detected in our study exclusively at their depth range, similar to what Canals and collaborators<sup>75</sup> retrieved. For

instance, the deep-sea shark *Centroscyllium fabricii*, which is most abundant between 435 and 1650 m<sup>76</sup>, was only detected in depths between 550 and 1440 m in our study (Fig. 2A, Supplementary Data 2, 3), mostly in Canadian waters, where it is a very abundant species<sup>77</sup>.

### Caveats and opportunities of sponge nsDNA

Among the main caveats of using eDNA collected from seawater is the dominance of unicellular eukaryotes among taxon assignments, with benthic macro- and megafaunal assemblages representing a very small percentage of the recovered reads (e.g.,<sup>39,40,78–80</sup>). In contrast, we show here that sponge nsDNA is a powerful tool to assess benthic metazoans, in highly inaccessible and vulnerable ecosystems, such as deep-sea sponge grounds. However, one of the fundamental aspects of our approach is the selection of the best sponge species to understand the biodiversity patterns through its filtration and DNA storage efficiency, which was recently tested in controlled tank conditions<sup>32</sup>. LMA sponges represent the best option for nsDNA-based biodiversity assessment, while also retrieving far fewer reads originating from the sponge host (Fig. 1B, Supplementary Fig. 3). Similar to the study of Neave et al.<sup>34</sup>, the best sampler here was definitely *Phakellia ventilabrum*, because as an LMA species, it contains the least number of microbial symbionts within their biomass, and probably possesses the highest filtration rates of all the studied species<sup>36</sup>. Recently, another study using sponges to capture eDNA from the boreal site of Schulz Bank used 16 different species of sponges<sup>35</sup>, and found that the LMA sponges detected most of the fish species, while most of their *Geodia* spp. samples barely contained one species<sup>35</sup>.

One of the most interesting aspects of our results is the accuracy in the detection of species with well-known distribution ranges. For example, the rabbit fish *Chimaera monstrosa*, which is typical of the NE Atlantic and Mediterranean, was indeed exclusively found in NE Atlantic sites; the snailfish *Careproctus microtus*, which is known from Greenland, Iceland and the Faroe Shetlands, was only found in Iceland and the Faroe-Shetland Sponge Belt. Similarly, our results highlight the detection of unexpected species, such as the horseshoe crab, *Limulus polyphemus* (Supplementary Fig. 2), whose appearance on the coasts of Europe is an extremely rare event<sup>81</sup>. Its presence may be due to distributional range shifts or human-mediated transport, confirming the usefulness of nsDNA analysis for the monitoring of the spread of alien and potentially invasive species.

### Conclusion

In recent years, evidence has amassed on the potential and effectiveness of eDNA retrieved from the tissues of ‘natural samplers’ (i.e., nsDNA, primarily isolated from sea sponges) to detect marine organisms (mostly fishes) from their surrounding habitat. Here we offered an unprecedented demonstration of the power of this approach, characterising entire deep-sea benthic communities with great accuracy and granularity. The depth of insights gathered through this sampling effort is even more remarkable if contrasted to the vast financial and technological investment that would be required to approach this species inventory using traditional visual and capture-based methods. Indeed, the success of the ‘sponge DNA’ approach will depend on the choice of the most appropriate ‘natural sampler’, which currently seems to reside in LMA sponges with high filtration capacities. Future advances will encompass the development of markers and tools to examine other parameters beyond species diversity, and a better understanding of the mechanisms underlying the accumulation of different DNA particles in sponge tissues. Even at this early stage of development, it is difficult to imagine a future where nsDNA is not central to understanding the composition, structure and function of ocean benthic ecosystems.

### Methods

To retrieve trapped DNA in the sponge tissue that was representative of the surrounding environment, we processed small (~1 cm<sup>3</sup>) tissue samples from four different demosponge species, all keystone species of boreo-arctic sponge grounds: the arctic *Geodia hentscheli* Cárdenas, Rapp, Schander & Tendal, 2010 and *Geodia parva* Hansen, 1885, and the boreal *Geodia*

*barretti* Bowerbank, 1858 and *Phakellia ventilabrum* (Linnaeus, 1767). We selected these species based on their abundance in deep-water ecosystems in the North Atlantic Ocean (NE and Open NW), the NAB region, and the Arctic, allowing replication tests across biogeographical regions.

### Sampling locations and methods

We collected ninety-seven sponge samples from 15 collection sites on several oceanographic cruises from 2011 to 2019. These sites were distributed across four marine biogeographic regions established by Costello et al.<sup>67</sup>: the North Eastern Atlantic (NE), NAB, Open North West Atlantic Ocean (NWA), and the Arctic Seas (Fig. 1A; Supplementary Data 1). At each station, we either performed scientific sampling using a beam trawl or an otter trawl for a short period of time, or individually collected sponge samples with an ROV. From each specimen, sponge tissue samples were dissected with sterile instruments and kept in ethanol 97–99% (with replacement after 12 or 24 h of first preservation to maintain a correct EtOH concentration) until laboratory processing, disinfecting equipment between samples. We used samples that were not collected nor stored properly for eDNA purposes, to test efficiency in DNA recovery of the methodology, opening up avenues of biomonitoring in existing collections globally across institutions from not-ideally collected samples.

### DNA isolation, amplification, and sequencing

The process to extract DNA from tissue samples included DNA extraction with DNeasy Blood and Tissue DNA extraction kit (Qiagen) after ethanol removal, with overnight incubation with proteinase K and double elution in 75 µl of elution buffer to maximise the DNA yield. Metazoan organisms were targeted by amplifying the mitochondrial *cytochrome c oxidase subunit I* gene (COI), using the primers mlCOIintF-XT: 5'-GGW ACW RGW TGR ACW ITI TAY CCY CCG GWA CWR GWT GRA CWI TIT AYC CYCC-3'<sup>82,83</sup> and jgHCOI1298: 5'-TAIACY TCI GGR TGI CCR AAR AAY CA-3'<sup>84,85</sup> from Leray et al.<sup>82</sup>, which returns, for most metazoan species, a 313 bp fragment providing wide phyla taxonomic information across eukaryotes<sup>82,86</sup>. It's noteworthy that ‘mlCOIintF-XT’ and ‘jgHCOI1298’ were chosen as primers, specifying the use of an insole and not wobbles for the primer. This fragment represents the 3' half of the well-known Folmer fragment (658 bp)<sup>84</sup>. PCR reactions were performed in three technical replicates, including ~40 ng of DNA per reaction using tags for the mentioned Leray primer to incorporate sample-specific barcodes (unique 8 bp length) on both ends of the amplicon; thus, we could pool equimolar, purified PCR products into two library pools. The three PCR replicates were pooled before sequencing and using the same barcodes for each replicate. All DNA concentration measurements were made using the Quant-iT dsDNA HS assay kit with a Qubit® 2.0 Fluorometer (Life Technologies). To improve sequence diversity for Illumina processing, two, three, or four random nucleotides at the beginning of the primers were included, ensuring optimal nucleotide diversity at each sequencing cycle<sup>40,58,87</sup>, a technique widely employed. PCRs were performed using 20 µl volumes containing 10 µl MyFix (Meridian Bioscience), 0.16 µl BSA (Thermo Fisher Scientific), 1 µl of each primer (at a concentration of 10 µM) (Thermo Fisher Scientific), 2 µl of DNA template (20 ng/ul) and molecular grade water. PCR protocol started with initial denaturation for 10 min at 94 °C followed by 35 cycles at 94 °C for 1 min, 45 °C for 1 min and 72 °C for 1 min, and a final extension at 72 °C for 5 min. Along with the samples, six negative and six positive controls, including DNA of *Pangasionodon hypophthalmus*, a freshwater fish not present in the North Atlantic, were included. PCR products were imaged using a 2% agarose gel stained with SYBRsafe (Invitrogen). The concentrations of the purified PCR products were measured using a Qubit dsDNA HS Assay kit (Invitrogen) and pooled in two equimolar libraries. Subsequently, they were size selected by using Omega Bio-Tek magnetic beads at 0.5× to remove larger fragments and the supernatant was then purified with 0.8× to remove the smaller fragments, i.e., primer dimer. Then the DNA was resuspended in 20 µl of water. The libraries were imaged on a Tape Station 4200 (Agilent) using Agilent high-sensitivity D1000 tape station kit to check the purity and average base-pair length. Each library was

then ligated using unique adapters, including the i7 and i5 library barcodes of NEXTFLEX® Rapid DNA-Seq Kit for Illumina (PerkinElmer), following manufacturer's instructions, and imaged again on the TapeStation to check for an increase in average base-pair length. Libraries were quantified by qPCR using the NEBNext Library Quant Kit for Illumina (New England Biolabs) and pooled equimolar into a final, single library which was paired-end sequenced on an Illumina MiSeq using a V3-600 sequencing kit at the Natural History Museum of London, producing 300 bp pair-end reads.

### Sequence data processing

The Illumina software returned two FASTQ files per Library. Sample demultiplexing was performed using *cutadapt* v4.2<sup>88</sup> and a series of Unix commands that were combined in a reproducible set of scripts and uploaded to GitHub: [https://github.com/ramongallego/ns\\_DNA\\_ms](https://github.com/ramongallego/ns_DNA_ms)<sup>89</sup>. These scripts considered that the sequences could present themselves in either direction and that sample identification might be achieved through one or two matching barcodes, to account for cases in which primer slippage has happened and there was one missing barcode. We used these demultiplexed files as the input for DADA2<sup>90</sup> to infer the amplicon sequence variants (ASV) detected in each sample. We used DADA2's functions for quality control (`truncLen = c(220,160)`, `maxN = 0`, `maxEE = c(2,2)`), merging of R1 and R2 reads; and chimera filtering (method "consensus"). Another quality control consisted of discarding samples with a low number of reads and estimating the level of tag-jumping in our dataset. Finally, to account for PCR mistakes, the ASVs were clustered into OTUs using *swarm* v3<sup>91</sup> with a distance of 2 within each sample. Thus, the spurious ASVs generated during PCR were merged while we avoided collapsing ASVs from closely related species. Community sampling efficiency was examined using accumulation curves generated using the *vegan* package in R.

### Taxonomic assignment

All OTUs were identified at the lowest possible taxonomic level using BLAST searches<sup>92</sup> against the *nr* database (v 2.10, accessed Nov 2022) with the following parameters: `-perc_identity 75 -word_size 30 -evaluate 1e-30 -max-target-seqs 50 -culling_limit 5`. We specified a tabulated output format, so the results of each BLAST search could be processed in R v4.1.33 with the package *taxonomizr*. Our BLAST processing custom script first looks for matches with 100% similarity. If it finds such matches, it retrieves the corresponding agreed taxonomy. If none are found, it moves on to our secondary threshold of 95% similarity and computes the agreed taxonomy for those records. Only matches above that threshold were kept, and the Last Common Ancestor of the taxID associated with those matches was the resulting ID for that query sequence.

Taxonomic assignments using public databases can be affected by various shortcomings, the most obvious being a misidentification and gaps in taxonomic coverage, especially in deep waters where the majority of the biodiversity has not been sequenced. From our BLAST results, we removed matches with "environmental sample" or "[Family name] sp.", as they would hamper the resolution of the final identification. Also, sequences not aligned to any sequence in the NCBI reference database were aligned to sequences from the Barcode of Life database identification engine ([https://boldsystems.org/index.php/IDS\\_OpenIdEngine](https://boldsystems.org/index.php/IDS_OpenIdEngine)).

### Data transformations and statistical analysis

The complexity of our metabarcoding dataset required further careful examination, mostly related to the sample source, because all the eDNA detected came from sponge tissue (referred to as sponge nsDNA). Although the initial amount of host DNA and the efficiency of the primers on that host species compared to the rest of the nsDNA present in that sample can affect read number distribution among taxa, we refrained from using blocking primers for sponge COI fragments, as this would risk losing important information on habitat-forming and abundant sponge species that are crucial indicators of VMEs. This biased library preparation from the beginning, since the sample's proportion of sponge (host) DNA versus

nsDNA was impossible to determine, and the efficiency of host COI amplification would vary and would define the quantity of nsDNA amplified and sequenced.

This peculiarity of the sponge nsDNA approach was resolved by including several data transformations to better capture the sponge nsDNA per each sample. Relative abundance of reads was calculated across the four sponges to identify the proportion of reads assigned to non-sponge origin, and thereby estimate their performance as nsDNA sampler. Reads assigned to the sponge host species were removed, recalculating the proportion of reads assigned to every detected taxon in each sample. Only reads associated with metazoan taxa were kept.

Community structure analyses were performed using relative abundances instead of read counts, that is, the proportion of the number of reads obtained for a species to the total number of reads obtained for all species at a site. The analyses were performed using the OTU classification at OTU level and species level to keep a meaningful comparison of samples separated by thousands of kilometres (which may have diverging sequences assigned to different OTUs), which also allowed for tight clustering of highly similar samples. We also calculated alpha diversity using the Shannon index on the biogeographic regions and sites. These metrics were compared among defined groups using analyses of variance (ANOVA). Pairwise comparisons were conducted using Tukey's HSD (TukeyHSD function in *stats* package implemented in R v4.1.33<sup>93</sup>). The different OTUs taxonomically assigned to the same taxa were grouped together, and then beta diversity through Bray–Curtis dissimilarity coefficient was calculated based on the log2-transformed proportions of the taxa, which helped mitigate the influence of highly abundant species, potentially impacting the analysis<sup>94</sup>. The dissimilarity matrices were visualised with PCoA using "cmdscale" in *vegan* v. 2.6-4<sup>95</sup>. We tested for the influence of biogeographical regions, sites and depth by permutational multivariate analyses of variance (PERMANOVA) using "adonis" in *vegan*, and pairwise analyses. Depth was transformed into three different categories (shallow: <200 m, meso: 201–999 m, and deep: >1000 m). Furthermore, using the R package "indicpecies"<sup>96</sup> we performed an indicator value species analysis using the function *multipatt* with *IndVal.g* method at species level for the three sampling depth ranges and four biogeographic regions. All graphs were obtained using the R package "ggplot2"<sup>97</sup>.

### Data availability

The sponge nsDNA data for the COI marker are available through the NCBI Short Read Archive under BioProject ID PRJNA1014104.

### Code availability

The complete bioinformatic pipeline is available through the GitHub repository at [https://github.com/ramongallego/ns\\_DNA\\_ms](https://github.com/ramongallego/ns_DNA_ms) and <https://doi.org/10.5281/zenodo.13119040>.

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## Author contributions

A.R. and S.M. designed the study and R.G., M.B.A., E.F.N., C.W., and C.D.V. designed the analytical pipeline. P.C., S.T., K.S., E.K., and A.R. obtained the samples and A.V. provided data. M.B.A. performed the laboratory procedures with help from E.F.N. R.G., C.D.V., A.C.L., M.B.A., and A.R. analysed the sequences. A.R. wrote the manuscript with contributions by M.B.A., R.G., S.M., A.V., and A.C.L., and all authors reviewed, edited, and approved the manuscript. A.R., S.T., P.C., and S.M. provided the funding.

## Competing interests

The authors declare no competing interests.

## Additional information

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**Correspondence** and requests for materials should be addressed to Ana Riesgo.

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