

MICROBIAL ECOLOGY

Patterns of eukaryotic diversity from the surface to the deep-ocean sediment

Tristan Cordier^{1,2*}, Inès Barrenechea Angeles^{1,3}, Nicolas Henry^{4,5}, Franck Lejzerowicz^{6,7}, Cédric Berney^{4,5}, Raphaël Morard⁸, Angelika Brandt^{9,10}, Marie-Anne Cambon-Bonavita¹¹, Lionel Guidi¹², Fabien Lombard^{12,13}, Pedro Martinez Arbizu^{14,15}, Ramon Massana¹⁶, Covadonga Orejas¹⁷, Julie Poulain^{5,18}, Craig R. Smith¹⁹, Patrick Wincker^{5,18}, Sophie Arnaud-Haond²⁰, Andrew J. Gooday^{21,22*}, Colombar de Vargas^{4,5*}, Jan Pawlowski^{1,23,24*}

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Remote deep-ocean sediment (DOS) ecosystems are among the least explored biomes on Earth. Genomic assessments of their biodiversity have failed to separate indigenous benthic organisms from sinking plankton. Here, we compare global-scale eukaryotic DNA metabarcoding datasets (18S-V9) from abyssal and lower bathyal surficial sediments and euphotic and aphotic ocean pelagic layers to distinguish plankton from benthic diversity in sediment material. Based on 1685 samples collected throughout the world ocean, we show that DOS diversity is at least threefold that in pelagic realms, with nearly two-thirds represented by abundant yet unknown eukaryotes. These benthic communities are spatially structured by ocean basins and particulate organic carbon (POC) flux from the upper ocean. Plankton DNA reaching the DOS originates from abundant species, with maximal deposition at high latitudes. Its seafloor DNA signature predicts variations in POC export from the surface and reveals previously overlooked taxa that may drive the biological carbon pump.

INTRODUCTION

Deep-ocean sediment (DOS) ecosystems cover more than half of Earth's surface and remain one of the least explored ecosystems on the planet. This vast and heterogeneous environment provides habitats for diverse biological communities that support fundamental ecological processes and services, such as nutrient recycling for the

healthy functioning of ocean ecosystems and carbon sequestration for the regulation of Earth's climate over geological time scales (1). The DOS is exposed to growing anthropogenic pressures, notably from climate change (2, 3), deep-sea mining (4), oil and gas exploitation, and bottom trawling (5), making a scientifically informed protection of its biodiversity a matter of the highest importance (6–8).

For more than 50 years, a considerable effort has been devoted to understanding the diversity and biogeography of benthic organisms thriving in the DOS (9). However, the enormous extent of this habitat and its remote location under several kilometers of water means that only a minute proportion has ever been sampled. Most previous studies have focused on morphological analyses of the macro- and mega-fauna, which typically show high levels of α diversity and small-scale faunal patchiness (9–11), and have recently been proposed as biological indicators for deep-ocean monitoring and conservation (12). Less attention has been paid to the microbial and meiofaunal organisms that numerically dominate DOS communities (13, 14) but can hardly be identified using classical morphotaxonomic approaches. Studying planktonic organisms sinking to DOS is hampered by similar technical limitations related to great depths (resulting in poor spatial coverage of sinking plankton datasets) and limited morphological identification (but for shell-building taxa that can keep distinctive features once in the sediment). Their study is hence often approached indirectly, using sediment traps to capture the sinking flux of taxa over time that contribute most to the biologically driven carbon sequestration in the deep ocean before they reach the sediment (15–17).

The development of high-throughput environmental genomics has begun to fill these gaps in knowledge, revealing substantial unknown diversity among viruses (18) and prokaryotes (19–22) from DOS. Yet, the use of genomics to explore DOS eukaryotes has been limited and focused mostly on particular taxonomic groups (23–25) or geographic regions [(21, 26–28), but see (29)]. One major challenge in interpreting molecular data from DOS is to distinguish DNA reads that belong to indigenous benthic eukaryotes from those originating from pelagic

¹Department of Genetics and Evolution, University of Geneva, Geneva, Switzerland. ²NORCE Climate, NORCE Norwegian Research Centre AS, Bjerknes Centre for Climate Research, Jahnebakken 5, 5007 Bergen, Norway. ³Department of Earth Sciences, University of Geneva, Geneva, Switzerland. ⁴Sorbonne Université, CNRS, Station Biologique de Roscoff, UMR 7144, ECOMAP,, 29680 Roscoff, France. ⁵Research Federation for the study of Global Ocean Systems Ecology and Evolution, FR2022/Tara GOSEE, 75016 Paris, France. ⁶Center for Microbiome Innovation, University of California San Diego, 9500 Gilman Drive, La Jolla, CA 92093, USA. ⁷Department of Pediatrics, School of Medicine, University of California San Diego, 9500 Gilman Drive, La Jolla, CA 92093, USA. ⁸MARUM-Center for Marine Environmental Sciences, University of Bremen, Leobener Strasse 8, 28359 Bremen, Germany. ⁹Department of Marine Zoology, Section Crustacea, Senckenberg Research Institute and Natural History Museum, Senckenberganlage 25, 60325 Frankfurt, Germany. ¹⁰Institute for Ecology, Evolution, and Diversity, Goethe-University of Frankfurt, FB 15, Max-von-Laue-Str. 13, 60439 Frankfurt am Main, Germany. ¹¹Univ Brest, Ifremer, CNRS, Laboratoire de Microbiologie des Environnements Extrêmes, Plouzané, France. ¹²Laboratoire d'océanographie de Villefranche (LOV), Observatoire Océanologique, Sorbonne Universités, UPMC Université Paris 06, CNRS, Villefranche-sur-Mer, 06230 Nice, France. ¹³Institut Universitaire de France (IUF), Paris, France. ¹⁴Senckenberg am Meer, German Centre for Marine Biodiversity Research, Südstrand 44, 26382 Wilhelmshaven, Germany. ¹⁵FK V IBU, AG Marine Biodiversität, Universität Oldenburg, 26129 Oldenburg, Germany. ¹⁶Department of Marine Biology and Oceanography, Institut de Ciències del Mar (CSIC), Barcelona, Spain. ¹⁷Spanish Institute of Oceanography (IEO), Oceanographic Centre of Gijón, Avda Príncipe de Asturias 70 bis, 33212 Gijón, Spain. ¹⁸Génomique Métabolique, Genoscope, Institut François Jacob, CEA, CNRS, University Evry, University Paris-Saclay, 91057 Evry, France. ¹⁹Department of Oceanography, School of Ocean and Earth Science and Technology, University of Hawai'i at Mānoa, Honolulu, HI 96822, USA. ²⁰MARBEC, Université de Montpellier, Ifremer, CNRS, IRD, Sète, France. ²¹National Oceanography Centre, Southampton, European Way, Southampton SO14 3ZH, UK. ²²Life Sciences Department, Natural History Museum, Cromwell Road, London SW7 5BD, UK. ²³ID-Gene ecodiagnosics, Confignon, 1232 Geneva, Switzerland. ²⁴Institute of Oceanology, Polish Academy of Sciences, 81-712 Sopot, Poland.

*Corresponding author. Email: tristan.cordier@norceresearch.no (T.C.); ang@noc.ac.uk (A.J.G.); vargas@sb-roscoff.fr (C.d.V.); jan.pawlowski@unige.ch (J.P.)

organisms that sink through the water column and leave their DNA traces in the sediments (28, 30–32).

Here, we tackle these problems by comparing a newly generated, global-scale DNA metabarcoding dataset of total eukaryotic diversity from deep oceanic surficial sediments (418 samples collected during 15 oceanographic cruises from 2010 to 2016; table S1) to comparable published datasets from euphotic (1160 samples from the *Tara* Oceans expeditions) (33, 34) and aphotic (138 samples from the *Tara* Oceans and Malaspina expeditions) (35) zones across the world ocean. Together, these represent the first consistent molecular meta-dataset spanning the three main open-ocean realms (pelagic euphotic, pelagic aphotic, DOS) at a global scale across 447 sampling sites (Fig. 1A). We assembled ~2.42 billion DNA reads (table S2), produced by polymerase chain reaction (PCR) amplification of the V9 region of the 18S ribosomal RNA gene, and processed them using the DADA2 workflow to infer amplicon sequence variants (ASVs). On the basis of taxonomic annotations of ASVs using the SILVA and PR² sequence databases and on the occurrence of a highly conserved DNA sequence motif across eukaryotes, we discarded prokaryotic, plastidic, and mitochondrial ASVs, as well as technical artifacts, allowing us to focus on eukaryotic diversity.

RESULTS AND DISCUSSION

Eukaryotic diversity from the ocean surface to the DOS

We obtained a total of 242,465 eukaryotic ASVs represented by ~1.95 billion DNA reads (Fig. 1B). Only 3806 (1.6%) of these ASVs were detected in all three realms, while 6382 pelagic ASVs were detected in DOS. These ASVs were assumed to correspond to sinking pelagic organisms, mainly plankton, although 29 ASVs (representing 1.29% of the reads of these ASVs) could be ascribed to nekton (e.g., dead vertebrates), which also contribute to the downward flux of organic matter. From the metazoan fraction of sinking pelagic organisms, we curated benthic animals with known meroplanktonic larvae (224 ASVs; see Materials and Methods). The number of ASVs found exclusively in DOS, here assumed to correspond to indigenous deep-sea benthic organisms, was comparable to that found in the pelagic realms, although there were 25 times more pelagic DNA reads in our meta-dataset (Fig. 1B). To account for this variation in sequencing effort, we subsampled each aggregated dataset per realm 1000 times at identical sequencing depths (1 Mio reads) and analyzed the diversity of ASV, together with their distribution and abundances within and across the pelagic (euphotic and aphotic zones) and DOS (sinking pelagic and benthic organisms; fig. S1) realms. This indicated that, although nearly half of eukaryotic DNA reads represent sinking planktonic ASVs, the ASV richness in the DOS could be more than three times higher than in pelagic habitats, with more than 60% of ASVs being exclusively benthic.

The unique size fractionation of the pelagic samples from the *Tara* Oceans dataset has a strong effect on α diversity (richness and evenness) and β diversity (compositional variation) measures (fig. S2) (33). The samples from the micro- (20 to 180 μ m) and meso- (180 to 2000 μ m) plankton collected by 20- and 180- μ m net tows concentrate mostly on copepods and colloidarians that lower α diversity and inflate β diversity measures when compared to other pelagic samples. Since these taxa were also detected in the lower plankton size fractions, we confined our analyses to the richest nano- (3 to 20 μ m) and pico- (0.2 to 5 μ m) plankton fractions to compare α and β diversity patterns across *Tara* Oceans, Malaspina, and DOS samples.

Both the ASV accumulation curves as a function of sampling effort and Shannon diversity values confirmed that benthic eukaryotic diversity is much higher than that in the water column (Fig. 1C). The benthic accumulation curve is similar to that obtained for the pelagic aphotic zone, which may indicate that diversity in aphotic waters is also very high and largely undersampled [but see (36)]. Clustering of eukaryotic communities by their compositional similarity revealed a clear separation of the pelagic and DOS realms and changes along a gradient of absolute latitude (Fig. 1D and fig. S3). This was confirmed by permutational multivariate analysis of variance (PERMANOVA), both for type of realm ($R^2 = 0.144$, $P < 0.001$) and for absolute latitude ($R^2 = 0.031$, $P < 0.001$). The degree of eukaryotic community differentiation (β diversity dispersion) within each realm was similar (Wilcoxon test, $P > 0.05$; Fig. 1D). Our results therefore indicate that eukaryotic communities of the DOS are both more diverse and sharply different compared to those of pelagic realms.

The taxonomic compositions of eukaryotic assemblages were clearly different in the pelagic euphotic, pelagic aphotic, and DOS realms (Fig. 2A; see fig. S4 for relative abundances and table S3 for details). While diversity in the euphotic zone is dominated taxonomically by Alveolata (30.8%), notably dinoflagellates (Dinophyceae, 19.4%), the aphotic zone is extremely rich in Diplonemea [46.5%; see (37–39)], mainly heterotrophic nanoflagellates in the family Eupelagonemidae (46.2%). The taxonomic composition of the deep, exclusively benthic, eukaryotic assemblage is very different, comprising various groups that do not occur or rarely occur in the water column (fig. S5 and table S3), e.g., Dactylopodida amoebae (6.5%), Chromadoria nematodes (5.3%), Monothalamid foraminifera (4.4%), and Oligohymenophorea ciliates (3.7%). Nearly two-thirds (60.1%) of the benthic eukaryotic ASVs (representing 47.8% of the reads) could not be taxonomically annotated using current reference taxonomic databases and a similarity cutoff of 85%, and many of them matched a reference sequence with less than 80% similarity (Fig. 2B). By comparison, the proportion of unassigned ASVs in the pelagic samples is 24.7% (2.6% of the reads) in the euphotic zone and 13.9% (4.1% of the reads) in the aphotic zone (Fig. 2C and table S3).

To better characterize the taxonomic breadth of the unknown eukaryotic diversity in the ocean, we clustered all unassigned eukaryotic ASVs into operational taxonomic units (OTUs) at decreasing similarity thresholds (fig. S6). This revealed that more than 10,000 benthic OTUs are formed with a 90% similarity cutoff, well below the species/genus threshold levels (40). These results indicate that previously unknown high-rank eukaryotic groups with diverse and abundant sublineages likely make up most of the diversity thriving in DOS. A similar number of 90% cutoff OTUs is formed in the pelagic euphotic zone, but their relative abundance (2.6% of the reads) is much lower than for benthic diversity (47.8% of the reads). Many of these unassigned pelagic ASVs may thus correspond to rare unknown eukaryotes or rare intraspecific/intragenomic variants of known eukaryotes with unusually high polymorphism (41). Among the known taxa (39.9% of benthic ASVs and 52.2% of benthic reads), our data for selected typical deep benthic macrofaunal and meiofaunal groups show that some are relatively well represented in the current databases (e.g., polychaetes and nemertean; fig. S7), while others remain poorly represented (e.g., foraminifera and nematodes).

Biogeography of deep-ocean benthic eukaryotes

Analysis of the strictly benthic eukaryotic diversity revealed global biogeographic patterns among DOS communities. The overall richness

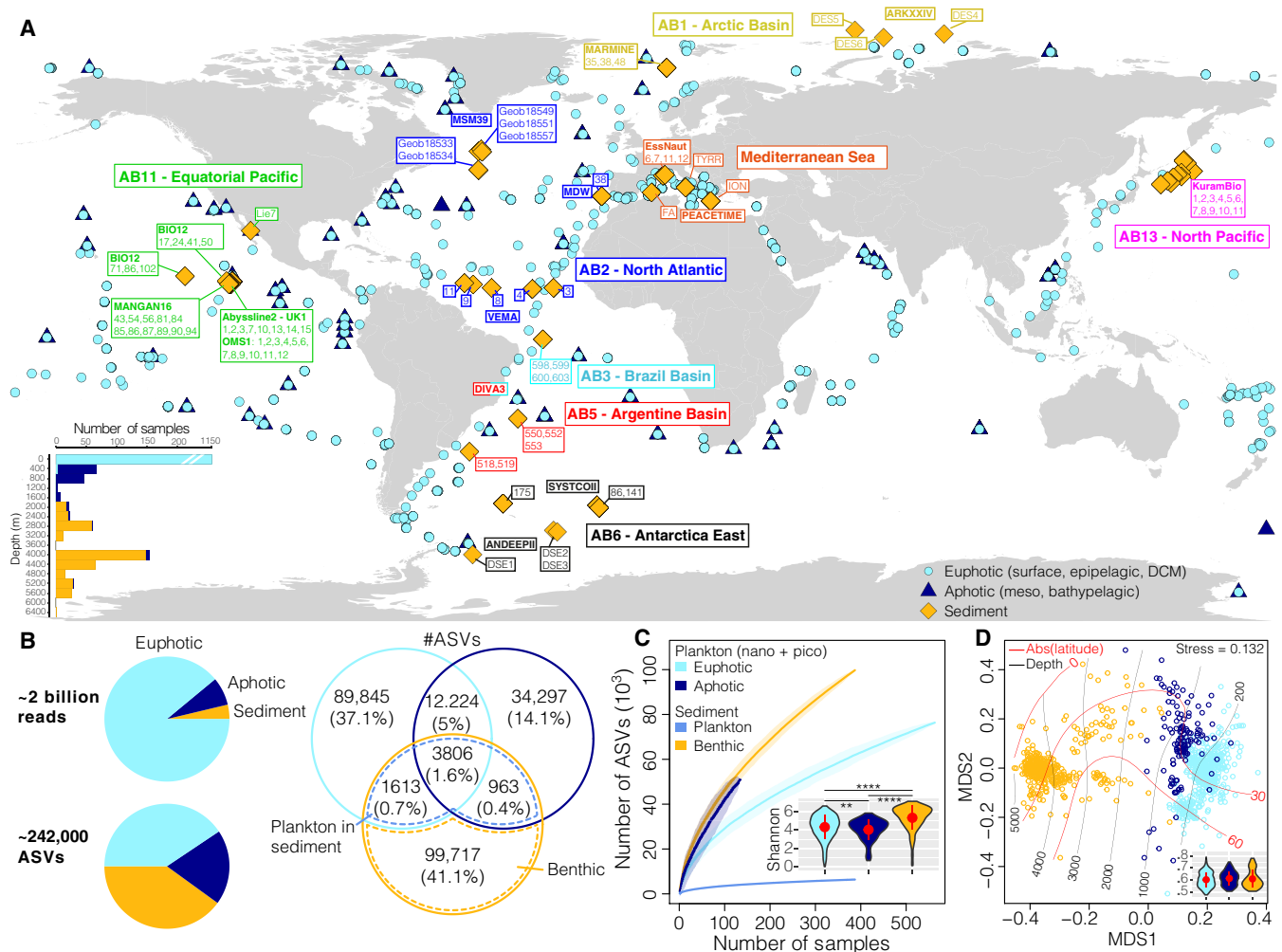


Fig. 1. Eukaryotic ribosomal DNA diversity in the pelagic euphotic and aphotic zones and in the deep-ocean surficial sediment. (A) Location of the stations ($n = 447$) from which the samples ($n = 1685$) analyzed in this study were collected. The color of the sediment sampling station tags indicates approximate correspondence with abyssal provinces (42), and the names of deep-sea cruises are indicated in bold or within text boxes. The bottom left inset represents the depth distribution (in meters) of the samples. (B) Number of eukaryotic 18S V9 rDNA reads and of amplicon sequence variants (ASVs). A Venn diagram represents the distribution of ASV richness and their proportions within and across realms. The intersection of the pelagic and sediment datasets is used here to separate the indigenous benthic organisms from the sinking plankton (see Materials and Methods). (C) ASV accumulation curves as a function of sampling effort. For pelagic realms, we calculated the curves by focusing only on the nano- and picoplanktonic size fractions (see Materials and Methods). The inset displays the distribution of Shannon diversity for pelagic and benthic communities. The red dots and bars within violin plots represent means and SDs, and horizontal bars indicate significant differences (Wilcoxon tests, $**P < 0.01$ and $****P < 0.0001$). (D) Nonmetric multidimensional scaling (NMDS) analysis of the Bray-Curtis dissimilarity matrix computed from the pelagic (only the nano- and pico-fractions) and sediment datasets. The red and black lines on the ordination represent, respectively, the absolute latitude and depth as fitted surfaces to the ordination. The inset represents the community dispersion within each realm (i.e., Bray-Curtis distances to the group centroid, higher values indicate more compositional variation). The red dots and bars within violin plots represent means and SDs, respectively, and no significant differences between realms were detected (Wilcoxon tests, $P > 0.05$).

of benthic ASVs tends to decrease with increasing latitude (fig. S8). Benthic richness follows a bell-shaped trend with increasing export flux of particulate organic carbon (POC) from the surface and particularly with increasing POC reaching the seafloor (the latter explaining up to 10.7% of the variation in overall benthic richness). This pattern is not consistent across benthic groups, with nematodes, foraminifera, and molluscs being notably more diverse at higher latitudes and at sites with higher POC flux reaching the seafloor (fig. S8). The compositional structure of deep benthic communities is in broad agreement with abyssal biogeographic provinces (42) (PERMANOVA $R^2 = 0.136$, $P < 0.001$) and somewhat structured

along a gradient of absolute latitude at a global scale ($R^2 = 0.051$, $P < 0.001$), although polar regions are separated on the ordination (Fig. 3A). We used a selection of environmental parameters (see Materials and Methods) in a stepwise model building for constrained ordination to explain the observed pattern. The model explained up to 15.1% of the benthic compositional variation, with seabed nitrate, POC export from the surface, and POC reaching the seafloor together explaining 11.2% (table S4), in line with previous findings on the role of POC export in shaping benthic prokaryotic communities (19).

The average proportion of shared ASVs between pairs of samples as a function of their geographical distance was relatively stable

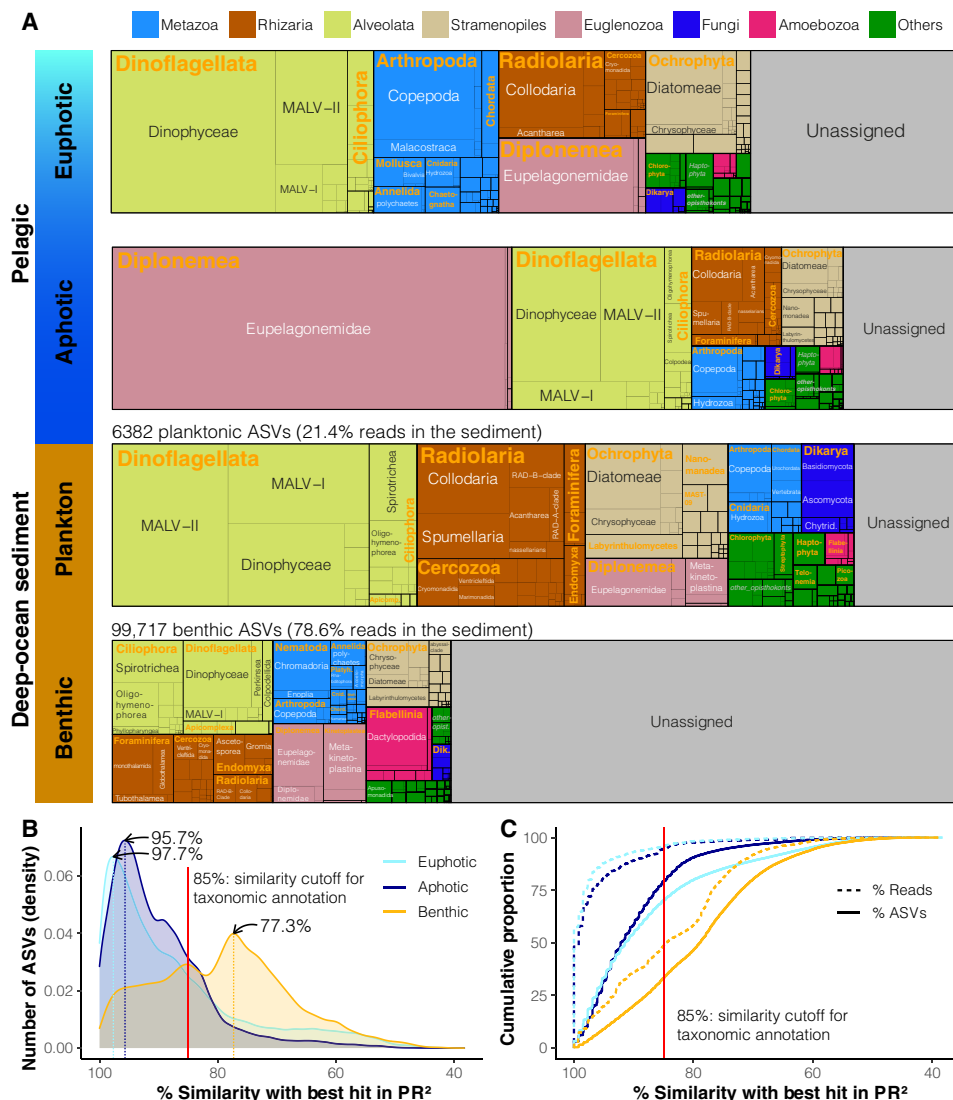


Fig. 2. Taxonomic composition of eukaryotes (ASV richness) in the pelagic euphotic, pelagic aphotic, and DOS (sinking plankton and benthic communities) realms. (A) ASV richness of eukaryotic groups (see fig. S4 for relative abundances and table S3 for details). The number of ASVs and their relative abundance in the sediment are shown for ASVs of pelagic origin, as well as those derived from indigenous benthic taxa. **(B)** Number of ASVs (represented as density) as a function of their similarity with the best hit with a reference sequence in the PR² database. The peaks in density for each realm are highlighted on the plot, and the corresponding similarity level with reference sequences is indicated. **(C)** Cumulative proportion of ASVs and read abundance as a function of their similarity with the best hit with a reference sequence in PR². The red vertical lines indicate the similarity cutoff (85%) for taxonomic annotation used in this study.

up to 10 km, after which it decreased steadily (fig. 3B), possibly indicating dispersal limitation among benthic taxa or shifts in environmental drivers. We calculated key distance-decay parameters for selected benthic groups (table S5), i.e., the rate of decrease in their community similarity with increasing spatial separation. The initial similarities (i.e., similarity at 1 km distance that provides a measure of the local presence/absence patchiness) indicate that benthic macrofaunal groups (molluscs and polychaetes) tend to have a stronger local turnover than meiofaunal or protistan groups (nematodes, foraminifera, and amoebae). The former also generally have a steeper distance-decay, as indicated by the greater slope of linear models and lower halving distances, i.e., the distance after which the initial similarity is halved (table S5). These results indicate that dispersal limitation or environmental filtering (or a combination

of both) may be stronger for macrofaunal benthic organisms than for meiofaunal or microbial eukaryotes, although macrofaunal taxa are usually thought not to be limited in their dispersion, owing to their common planktonic larval phases (43).

We lastly compared spatial structures and distance-decay parameters for whole benthic eukaryotic communities with those for water column communities (table S5). Overall, benthic communities are more spatially structured (mantel: $r = 0.454$, $P < 0.001$) than pelagic communities (euphotic: $r = 0.147$, $P < 0.001$; aphotic: $r = 0.228$, $P < 0.001$) and have lower initial similarity, steeper distance-decay, and smaller halving distances (table S5 and fig. S9), consistent with previous findings for benthic compared to pelagic communities of bacteria in the world ocean (44). This was also shown by fitting neutral community assembly models to each realm dataset, indicating that

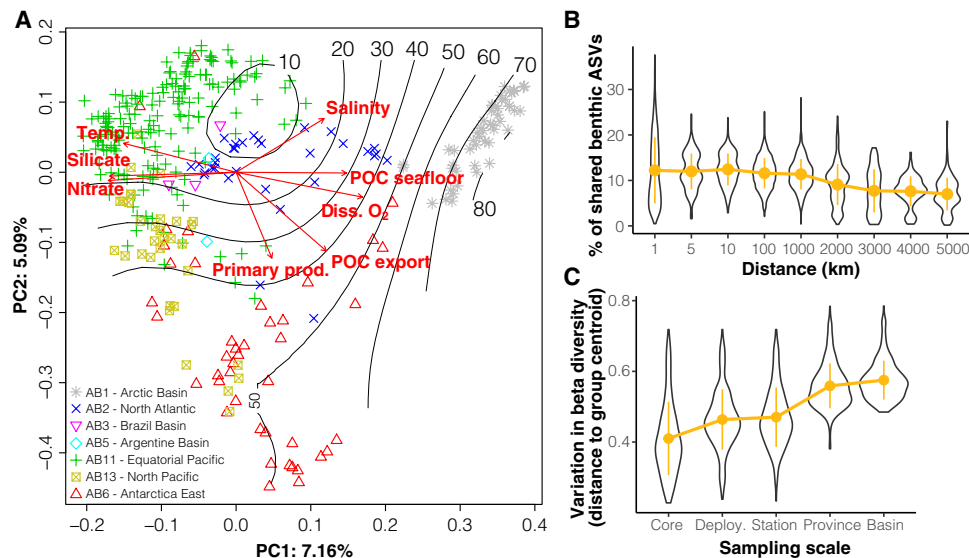


Fig. 3. Biogeography of the deep-ocean benthic eukaryotic communities. (A) Principal coordinates analysis of the Bray-Curtis dissimilarity matrix computed from the normalized read counts of indigenous benthic ASVs using the cumulative sum scaling (CSS) method. The proportion of variance explained by the first two axes is indicated on the plot. The gray lines and numbers indicate the absolute latitude as a fitted smooth surface on the ordination, and the red arrows are fitted sea floor (temp.: temperature; diss. O₂: dissolved oxygen; seabed salinity, silicate and nitrate concentrations, and POC reaching the seafloor) or surface water (primary prod.: primary productivity, POC export from the surface) environmental parameters to the ordination. Colors and symbols indicate location of sampling sites in the abyssal biogeographic provinces (AB1 to AB13) postulated by (42). (B) Proportion of shared benthic ASVs as a function of increasing distance between pairs of samples. The proportion of shared ASVs was computed only within the same oceanic basins. (C) Variation in β diversity, i.e., distribution of sample distances to group centroids, as a function of increasing spatial sampling scale. Higher values indicate higher compositional variation. Orange dots and bars represent means and standard deviations (SDs), respectively.

taxonomic groups of the pelagic euphotic zone tend to be more geographically widespread, while benthic groups tend to be less widespread than expected by neutral models (fig. S10). The importance of benthic community patchiness at local scales is reinforced by the variation of β diversity as a function of increasing sampling scale (Fig. 3C). The compositional variations within single sediment cores (8 to 10 cm in diameter) and between sediment cores collected from the same multicorer deployment (30 cm to 1 m apart) were comparable to that between deployments at a single station. This confirms the high degree of deep benthic community variation at local scales observed before in the case of selected groups of macro- and meiofauna by both morphological (45) and DNA-based (24) studies.

Eukaryotic plankton DNA signature on the DOS

Our study provides the first DNA-based insight into the qualitative and semiquantitative importance of the eukaryotic plankton diversity reaching the DOS at a global scale and thus driving the biological transfer of atmospheric carbon to the seafloor. The taxonomic composition of the 6382 planktonic eukaryotes in the DOS is roughly similar to that in the pelagic euphotic and aphotic zones (Fig. 2). In terms of relative abundance, however, planktonic DNA reads from sediment samples are mainly distributed among diatoms (15.4%) and various groups of rhizarians (26.9%) but include relatively few copepods (1.3%) and dinoflagellates (4.7%), which numerically dominate the plankton in upper ocean layers (fig. S4 and table S3). Plankton DNA on the DOS also include abundant ASVs assigned to the diplomonads (2.3%) and fungi (4.2%) that are common in the aphotic zone, supporting previous findings that the DOS accumulates DNA from organisms occurring throughout the entire water column (28).

The pelagic ASVs reaching the DOS are generally among the most abundant planktonic eukaryotes in the water column (together representing 75.8% of the reads in the euphotic and 79.3% of the reads in the aphotic), although not all abundant pelagic ASVs are present in the DOS (Fig. 4A). We explored whether their occurrence in the DOS could be explained by their size distribution and by their trophic modes. We found no evidence that larger planktonic taxa are more likely to reach the DOS than smaller taxa (Fig. 4C), reinforcing the idea that most sinking plankton is transferred to the sediment through organic aggregates and not as individual organisms. However, the relative abundance of large planktonic taxa was higher in high-latitude sediments, especially in the Arctic (Fig. 4D), consistent with the trend of increasing sea-surface plankton size with increasing latitude and nutrient content (46, 47). Notably, the proportion of parasitic protists among sinking pelagic ASVs (13.7%) is greater than among nonsinking pelagic ASVs (2.9%; Fig. 4E), indicating that pelagic parasites are more likely to reach the DOS. Their relatively higher abundance in temperate and tropical latitude sediments suggests their ecological importance at these latitudes (Fig. 4F). Greater transfer of parasites to the DOS could reflect their ability to infect and kill larger hosts and/or the massive amounts of resistant and relatively dense propagules that they typically release after host infection and that could persist in sinking aggregates (48–51).

We aggregated our data for each entire realm to investigate whether the most abundant sinking pelagic ASVs in the water column are also the most abundant among sinking pelagic ASVs detected in the sediment, providing insight into their overall taphonomy (fig. S11). Similar abundance profiles would indicate that the structure of sinking plankton assemblages is overall preserved in surface sediment, whereas dissimilar profiles would indicate that sinking assemblages are consumed or repackaged during their downward transfer in a

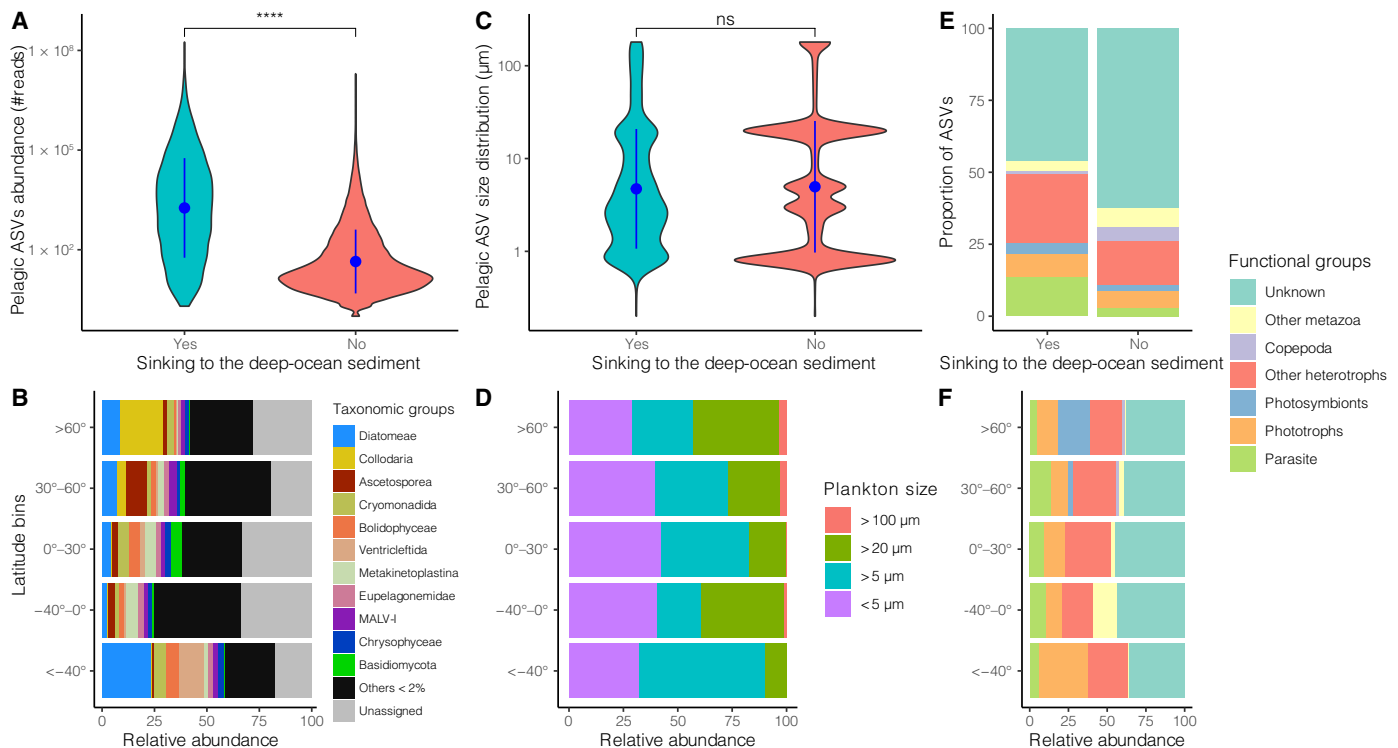


Fig. 4. Abundance and functional attributes of the sinking plankton compared to their nonsinking counterparts and the taxonomic and functional abundance breakdown of plankton DNA in DOSs. Comparison of the DNA-based log-transformed read abundance (A), the inferred size distribution (C), and the functional breakdown (E) of pelagic ASV sinking to the DOS with their nonsinking counterparts in pelagic realms (euphotic and aphotic datasets have been combined). Results of Wilcoxon tests in (A) and (C) are indicated as follows: **** $P < 0.0001$; not significant (ns), $P > 0.05$. Breakdown of taxonomic (B), inferred size classes (D), and functional (F) relative abundances of plankton DNA in DOS as a function of latitudinal bins.

nonrandom manner. For instance, the abundance profiles of sinking pelagic ASVs of copepods, dinoflagellates, diatoms, acanthareans, eupelagonemids, hydrozoans, and spumellarians in both the euphotic and aphotic zones are similar to their abundance profiles in the DOS (fig. S11), suggesting that their structure in pelagic ecosystems is preserved on the seafloor. Their profiles in the DOS better mirrored those in the aphotic zone (higher R^2 of linear models), suggesting that the transformation of sinking material occurs mostly in the upper oceanic layer. However, this was not the case for diatoms and collodarians, for which the abundance profiles in the euphotic and aphotic layer were similarly preserved in the DOS, likely because of their higher propensity to sink and form aggregates (52, 53). Although plankton DNA transfer to sediment has yet to be investigated [but see (54–56)], notably by accounting for physical processes (e.g., deep waters currents and vertical mixing) that interact with biological and ecological processes in the deposition of sinking material, our study reinforces the significance of the DOS as a DNA archive of upper-ocean biodiversity and ecology and a source of potential new proxies to document past environmental changes (57).

Last, we attempted to correlate our global DOS plankton biodiversity dataset to yearly average POC export from the surface and the fraction of it reaching the DOS, as estimated, respectively, by thorium-derived export measurements, modeled at a global scale (58), and by evaluating the efficiency of POC transfer through the water column based on sediment trap POC flux data, net primary production estimates, and sea surface temperatures (59). Overall, the pelagic ASVs detected in the DOS represent 21.4% of the DNA reads obtained

from sediment samples. The proportion of DNA reads of pelagic origin in the sediment follows an increasing trend from low to high latitudes (Fig. 5A). This proportion also broadly approximates POC export from the surface ($R^2 = 0.23$, $P < 0.001$), despite the higher remineralization rates at productive high latitudes (60). Furthermore, the composition of plankton DNA in the DOS can predict up to 58% of the variation in POC export from the surface and 57% of the POC reaching the seafloor using cross-validated random forest regressions (Fig. 5B). We used a multivariate regression method to identify the sinking pelagic ASVs that best explain the variation of POC export and POC reaching the seafloor (Fig. 5C). Not unexpectedly, diatoms and dinoflagellates (52, 61) were important contributors, but we also identified some previously overlooked taxa that are not usually considered to contribute to POC export, such as alveolate parasites (MALV-II), cercozoans, chrysophytes, and several unknown eukaryotes [see also (51)]. Our time-integrated data from the DOS therefore highlight previously underappreciated taxa that may be keystone drivers of the biological carbon pump.

Toward a holistic view of ocean biodiversity and ecosystem processes

Our global molecular meta-dataset from the ocean surface to the DOS provides the first unified vision of eukaryotic biodiversity patterns across the three dimensions of the world ocean (Fig. 1). It shows that the DOS is an extremely rich and unique realm with a strong connection to the water masses above that is reflected in the pelagic DNA signature (Figs. 1, 4, and 5 and fig. S11). Although focused on

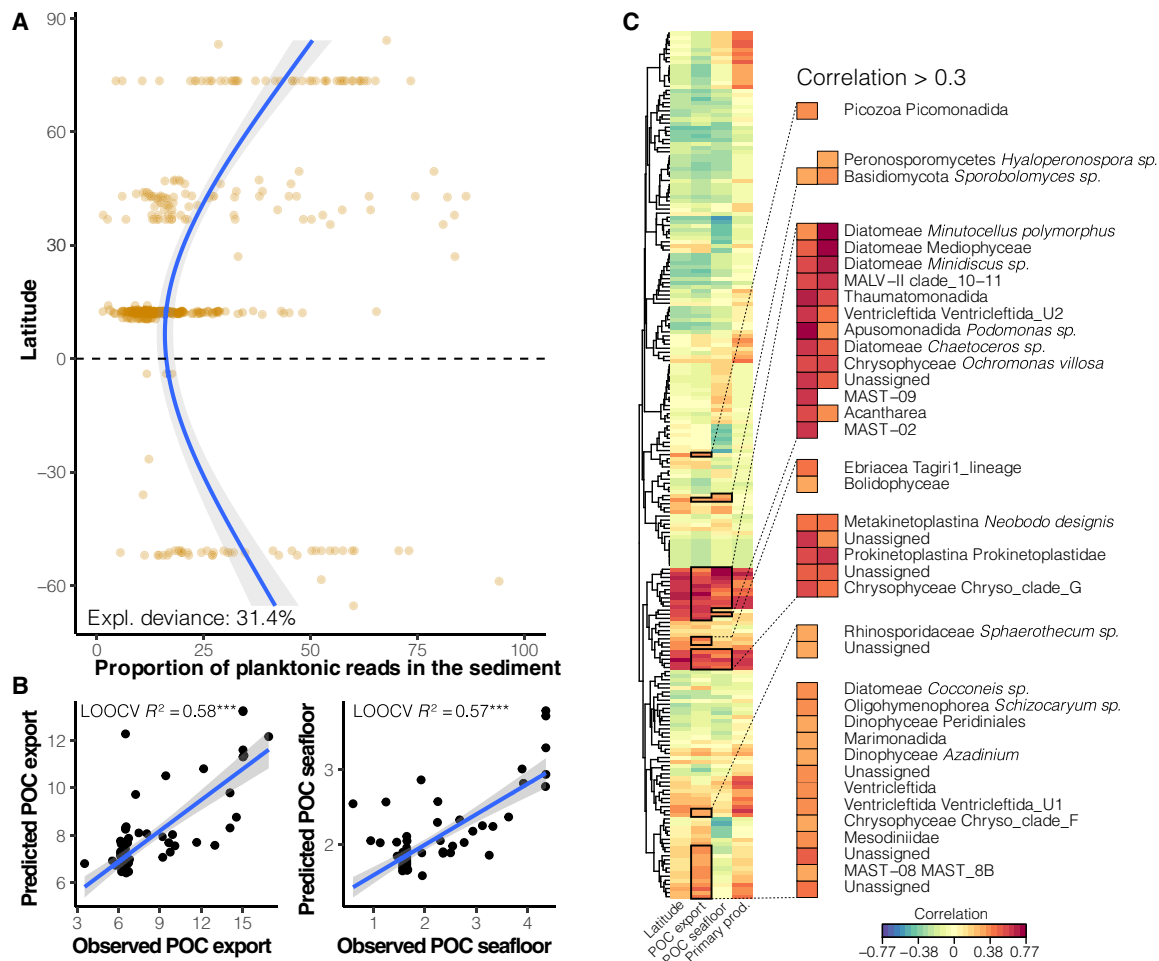


Fig. 5. Plankton DNA proportion in the DOS as a function of latitude and planktonic taxa in sediment associated with POC export from the surface and its fraction reaching the seafloor. (A) Proportion of DNA reads in DOSs representing sinking planktonic taxa as a function of latitude. The blue solid line represents a fitted generalized additive model ($\epsilon = 3$); the shades are displaying 95% confidence intervals. The explained variation of plankton DNA proportion in sediment is indicated on the plot. (B) Prediction of POC export and POC reaching the seafloor from the composition of plankton DNA in the DOS (POC export and POC seafloor are expressed in $\text{g C}_{\text{org}}/\text{m}^2$ per year). Random forest regressions were used in a leave-one-out cross validation (LOOCV) approach at the station scale. Correlation coefficients of linear models are reported on the plots. Blue lines represent linear models (both with $P < 0.001$), and shades represent 95% confidence intervals. (C) Planktonic ASVs in sediment associated with the POC export and POC reaching the seafloor were identified with a sparse partial least square regression. Planktonic ASVs strongly associated (correlation > 0.3) with POC export and POC reaching the seafloor are detailed on the clustered heatmap (details in table S6).

smaller-sized organisms (eukaryotic microbes and meiofauna), these DNA-based results are broadly consistent with morphological evidence from larger animals for high deep-sea benthic α diversities and small-scale patchiness (high local species turnover) (9–11).

The DOS appears to be much more diverse than oceanic waters (Fig. 1 and fig. S1) and is composed of communities of mostly unknown eukaryotes (Fig. 2) that display clear biogeographic patterns at global scales and considerable patchiness at local scales (Fig. 3). These patterns are likely driven by the flux of sinking organic aggregates and fecal pellets (Fig. 3, table S4, and fig. S8) (62, 63). Our data also show that the DNA-based plankton abundance profiles are broadly preserved in the DOS and that the transformation of sinking material appears to occur mostly between the euphotic and aphotic layers (fig. S11). The deposition of eukaryotic plankton is maximal at productive high latitudes (Fig. 5), and the plankton contribution to time-integrated sedimentary DNA broadly approximates the yearly average POC export from the surface. Moreover, the taxonomic

composition of planktonic assemblages in the DOS is an even better predictor of the variation of POC export from the surface and the fraction of it reaching the seafloor (Fig. 5), indicating that biodiversity is key for ocean carbon export and burial. These DOS assemblages comprise not only taxa that are known to be important drivers of the biological carbon pump but also several taxonomic and functional groups that have been overlooked in what is arguably one of the most fundamental ecological processes of the world ocean.

Together, our results highlight the DOS as one of Earth's richest modern ecosystems and fossil archives. They underline the need for concerted international efforts to further understand DOS biodiversity and its ecological role in planetary biogeochemical cycles. Our study, together with recent evidence that plankton DNA signal can be preserved in subseafloor sediments (54–57), paves the way for using sedimentary planktonic DNA to complement the microfossil-based proxies currently used to reconstruct ancient oceans, including their biological carbon sequestration processes. We hope it will also

provide the basis for a more informed and effective stewardship strategy for protecting unique and relatively pristine deep-ocean ecosystems as the exploitation of seabed resources gathers pace.

MATERIALS AND METHODS

DOS sample collection

DOSs have been collected during two main projects (deep_sea and eDNAbyss). For the deep_sea project, sediment samples were collected at abyssal depths during eight expeditions to the Arctic, Atlantic, Southern, and Pacific Oceans (table S1). We used disposable sterile spoons to subsample the top surface sediment centimeter (c.a. 2 g from 0 to 1 cm) following a nested sampling design: up to three pseudo-replicates per core, up to two cores per deployment (multicorer), and up to three deployments per station (detailed list in table S7). Sediment samples were placed in sterile falcon tubes with (VEMA, SYSTCOII, KuramBio I, MANGAN¹⁶, ABYSSLINE) and without (MSM39, DIVA3, and BIONOD) 6 ml of Lifeguard Preservation Solution (QIAGEN) before being frozen onboard at -20°C . The samples were shipped within -20°C containers to the University of Geneva (Switzerland). Upon arrival, sediment samples were stored at -80°C until extraction of nucleic acids.

For the eDNAbyss project, lower bathyal and abyssal sediments were collected in the Mediterranean Sea, North Atlantic, and Arctic Oceans during five cruises (Arctic: MarMine; North Atlantic: MEDWAVES; Mediterranean: PEACETIME, CANHROV, and ESSNAUT; table S1). For each station, triplicate cores (10 cm in diameter) were collected with a multicorer or with a remotely operated vehicle. Surface sediment (0 to 1 cm) was collected using metallic spatulas previously sterilized with bleach or DNA Exitus, rinsed with ethanol 96° and then nanopure water, and transferred into sterile zip-locked bags, homogenized by mixing and flattened to be stored at -80°C until DNA extraction. When possible, other layers (1 to 3, 3 to 5, 5 to 10, and 10 to 15 cm) were also collected from sediment cores. An empty zip lock bag from the stock used served as a blank sampling and extraction control in several stations along each cruise.

Nucleic acid extractions, PCR amplification, and illumina sequencing

For each of the 320 surface sediment samples collected in abyssal plains of the deep_sea project, we extracted the total RNA and DNA contents of c.a. 2 g of material as in (64), and we generated cDNA from deoxyribonuclease-treated RNA as in (65). We controlled that no carried-over DNA molecules remained in the RNA extracts based on the absence of PCR products after 60 cycles. We amplified by PCR the V9 hypervariable region of the ribosomal 18S gene with the following primer pair: the forward 1389F (5'-TTGTACACACCG-CCC-3') and the reverse 1510R (5'-CCTTCYGCAGGTTACCTAC-3') as designed in (66). Tag-encoded versions of the primers (a unique 8-nt sequence was added in the 5' end of each primer) were used to multiplex up to 40 samples per sequencing library. Each sample was amplified in duplicate PCR reactions, and each PCR was performed in a total volume of 25 μl as follows: 19.4 μl of H_2O , 2.5 μl buffer (FastStart, Roche), 0.5 μl of bovine serum albumin (20 mg/ml; Invitrogen Ultrapure), 0.5 μl of 10 mM dNTPs (deoxyribonucleotide triphosphate) (Roche), 0.1 μl of FastStart DNA Polymerase (5 U/ μl ; FastStart, Roche), 0.5 μl of forward and reverse primers at 10 mM, and lastly, 1 μl of DNA or RNA template (or 1.5 μl for some samples that did not amplify with 1 μl). All DNA and RNA samples were measured

using the double-stranded DNA (dsDNA) High-Sensitivity Assay Kit and the RNA High-Sensitivity Assay Kit on the Qubit 4 fluorometer (Thermo Fisher Scientific) and diluted at 7 ng/ μl prior PCR amplification. The PCR reaction conditions were as follows: predenaturation step at 94°C for 3 min, followed by 35 cycles of denaturation at 94°C for 30 s, annealing at 57°C for 1 min, extension at 72°C for 1.5 min, and a final extension at 72°C for 2 min. A PCR-negative control for each unique combination of tag-encoded primers was verified by agarose gel electrophoresis. The two PCR replicates for each sample were combined and quantified using high-resolution capillary electrophoresis (QIAXcel System, QIAGEN). The PCR products were pooled in equimolar concentration within each multiplexed library. Each pool of PCR products was purified using a High Pure PCR Product Purification kit (Roche), following the manufacturer's instructions. The sequencing libraries were prepared using the TruSeq DNA PCR-Free Library Preparation Kit (Illumina), following the manufacturer's instructions. The libraries were quantified by quantitative PCR (qPCR) using the Kapa Library Quantification Kit for Illumina Platforms (Kapa Biosystems) and sequenced on a MiSeq instrument (Illumina) using paired-end sequencing for 300 cycles with kit v2.

Within the project eDNAbyss, DNA extractions were performed on about 10 g of sediment using the PowerMax Soil DNA Isolation Kit (QIAGEN, Hilden, Germany), following the manufacturer protocol, except for the last step where incubation of the elution buffer was prolonged 10 min on the spin filter membrane to increase the DNA yield. The first solution of the kit was poured into empty field control ziplock bags, before being extracted along with sediment samples, following the exact same protocol. All DNA extracts were then stored at -80°C (and transported to Genoscope on dry ice) until PCR amplifications. The V9 hypervariable region of the 18S ribosomal RNA (rRNA) gene was amplified by PCR using the same primer pair (1389F and 1510R). Each sample was amplified in triplicates, and each PCR reaction was performed in a total volume of 25 μl with the Phusion High-Fidelity PCR Master Mix with GC buffer (Thermo Fisher Scientific), 0.4 μM final concentration of each primer, 3% of dimethyl sulfoxide, 1 \times Phusion Master Mix, and 2.5 ng of template DNA (less for few extracts with very low DNA concentration). The PCR reaction conditions were as follows: predenaturation step at 98°C for 30 s, followed by 25 cycles of denaturation at 98°C for 10 s, annealing at 57°C for 30 s, extension at 72°C for 30 s, and a final extension at 72°C for 10 min. PCR products were purified using 1.8 \times AMPure XP beads cleanup (Beckmann Coulter Genomics). Aliquots of purified amplicons were then run on an Agilent Bioanalyzer using the DNA High Sensitivity LabChip kit to check their lengths and quantified with a Qubit Fluorometer to check their quality and concentration. Amplicons generated were then used for preparation of sequencing libraries. Amplicons (100 ng) were directly end-repaired, A-tailed, and ligated to Illumina adapters on a Biomek FX Laboratory Automation Workstation. Library amplification was then performed using a Kapa Hifi HotStart NGS library Amplification kit with the same cycling conditions applied for previous steps and cleaned up by AMPure XP purification (1 to 1 volume). All libraries were then quantified first by Quant-it dsDNA HS (high-sensitivity) assay using a Fluoroskan Ascent instrument (Thermo Fisher Scientific) and then by qPCR with the KAPA Library Quantification Kit for Illumina Libraries (Kapa Biosystems) on an MXPro instrument (Agilent Technologies). Library profiles were checked using high-throughput microfluidic capillary electrophoresis system (LabChip GX, PerkinElmer, Waltham, MA). Libraries were then normalized to 10 nM by addition of 10 mM

tris-Cl (pH 8.5) and applied to cluster generation according to the Illumina Cbot User Guide (part no. 15006165). PhiX DNA spike-in was adapted for some libraries (20% instead of 1%) to minimize the loss of data due to low nucleotide diversity at the beginning of the sequencing run. Libraries were sequenced on HiSeq4000 or HiSeq2500 instruments (Illumina) on a paired-end mode. The raw sediment sequencing data have been deposited to the European Nucleotide Archive (ENA) under project accessions PRJEB33873 (eDNAbys) and PRJEB48517 (deep_sea).

Public 18S-V9 rDNA sequencing datasets

We gathered published datasets (table S2) targeting the V9 hyper-variable region of the eukaryotic 18S rRNA gene and using the same PCR primers pair (1389F and 1510R) used here for the DOS samples. These datasets were produced by studies sampling the euphotic/aphotic zones (33–35, 67–69) and the DOS (30, 67).

Environmental variables

Although some environmental variables and sediment descriptors were collected during the oceanic expeditions from which we collected sediment samples, their heterogeneity led us to extract more homogeneous environmental layers from the Global Marine Environment Datasets (<http://gmed.auckland.ac.nz>) to standardize our concatenated dataset across multiple studies. These variables included the surface calcite (calcite, in mole per cubic meter), surface nitrate (nitrate, in micromole per liter), surface silicate (silicate, in micromole per liter), surface phosphate (phosphate, in micromole per liter), average photosynthetically active radiation (PAR_mean, in Einstein per square meter per day), surface pH, average sea surface temperature (sst_mean, in celsius), variation in sea surface temperature (sst_range, in celsius), average surface currents strength (srf_current, in meter per second), primary production (primprod, in mgC·m²/day/cell), average stock of particulate inorganic carbon (PIC_mean, in mole per cubic meter), average stock of POC (POC_mean, in mole per cubic meter), total suspended matter (tsm_mean, in grams per cubic meter), seabed slope (slope, degree), seabed nitrate (sb_nitrate, in micromole per liter), seabed silicate (sb_silicate, in micromole per liter), seabed-dissolved oxygen (sb_o2dissolve, in milliliter per liter), seabed-utilized oxygen (sb_o2utilized, in milliliter per liter), seabed temperature (sb_temp, in celsius), seabed salinity [sb_salinity, practical salinity scale (PSS)], and average temperature in the water column (wat_col_temp, in celsius). We also extracted the estimated POC export at 100 m depth below the surface (POC_export, g C_{org}/m² per year) (58) and the POC fraction reaching the seafloor (POC_seafloor, g C_{org}/m² per year) (59, 70). The values of each environmental variable for each sample analyzed in this study were extracted from the environmental layers with their Global Positioning System (GPS) coordinates (table S7).

Raw sequencing data processing

For the deep_sea dataset, the sequencing libraries were demultiplexed using Double Tag Demultiplexer (DTD) software (<https://github.com/yoann-dufresne/DoubleTagDemultiplexer>) to screen the R1 and R2 files of each library and retrieve unique tag-encoded primer combinations associated to each sample (allowing no mismatches). We thus produced pairs of fastq files for each sample. For all other illumina datasets (see table S2), we obtained at least one pair of fastq files (paired-end) per sample (some samples were sequenced several times to obtain enough reads that were subsequently merged before

statistical analysis). For the datasets produced with the 454 sequencing technology, we obtained one fastq file per sample. We used two R scripts (for paired-end illumina datasets and for 454 dataset, see the “rds_pipeline_illumina.R” and “rds_pipeline_454.R” scripts) to process all the fastq files by batch of 10 samples per job on a High-Performance Computing cluster (Baobab, University of Geneva). The R scripts implemented the key steps of the DADA2 workflow (71) and additional quality filtering steps (see below). The scripts performed the quality filtering with the *filterAndTrim* function of the DADA2 v1.12.1 R package with default settings, the trimming of primers using the *cutadapt* v2.4 software (72), the filtering of any read that still contain traces of primers (*fastqFilterPrimersMatches* function in the *fastqUtils.R* script), the filtering of any read below 20 bp (*fastqFilterWidth* function in the *fastqUtils.R* script), the training of errors models using the *learnErrors* function of DADA2 with default settings, the inference of ASVs using the *dada* function with default settings (but for the 454 data, for which we used the HOMOPOLYMER_GAP_PENALTY = -1, BAND_SIZE = 32 options, as recommended by the DADA2 package developing team), and the merging for the overlapping paired-end reads using the *mergePairs* function with the option “trimOverhang.” Last, we exported the output of the DADA2 workflow, i.e., the “.rds” files that contain all the ASV sequences and their counts for each sample. We also collected summary statistics on each processing step, the trained errors models, and processing time for each sample.

Combining the datasets into a single ASV-to-sample table, taxonomic and functional annotations, matrix curation

We reimported the rds files into R to build an ASV-to-sample table. We first produced an ASV table per dataset, filtered chimeric ASVs with the option “consensus” within each dataset, and aggregated the replicated libraries per biological sample for the deep_sea, tara, and tara_polar datasets. We also aggregated the reads obtained from DNA and RNA libraries generated for each deep_sea sediment samples, since a comparative analysis revealed that the diversity and biogeographic patterns of eukaryotic communities are mostly similar between DNA and RNA [fig. S12; in line with (29, 73)]. We filtered the ASVs detected in the negative controls of the eDNAbys dataset across the eDNAbys ASV table. Last, we concatenated each dataset-based ASV-to-sample table into a single one and exported all the ASV sequences into a fasta file for taxonomic annotations. We used the “assignment-fasta-vsearch” module of the SLIM v0.6 software (74) that wraps the vsearch v2.2.2 software (75). The ASVs were compared to a custom version of PR² (33) that focus on the 18S V9 region and that include functional annotations (available at <https://doi.org/10.5281/zenodo.3768950>) and with the SILVA v138 database (76). Taxonomic annotations were the consensus among up to three candidate reference sequences that are above 85% similarity with the query or directly assigned to the reference sequence if the query had a similarity of at least 99%. We also performed another search without restricting a minimum similarity threshold to match an entry reference sequence in the custom V9 version of PR², to identify non-18S V9 sequences. We focused our analysis on the eukaryotic diversity by discarding any prokaryotic, plastidic ASVs, or any other artifactual ASV. We used taxonomic annotations obtained with the SILVA database to discard prokaryotic ASVs and the annotations obtained with PR² to discard organelle-derived ASVs. All ASVs that only loosely match any V9 reference sequence (i.e., <20% similarity) were considered as non-18S V9 sequence and were discarded. We also filtered ASVs that did not contain the “GTCC” motif in the first

four nucleotides in the 5' end. This motif is widely conserved across eukaryotes, whereas prokaryotes have a "GTCA" motif highly conserved in those positions. We lastly used the length distribution of eukaryotic and prokaryotic ASVs to discard any possible prokaryotic unassigned ASVs (filter set at 116 bp; fig. S13). For downstream taxonomic analyses, we used PR²-based annotations using the 85% minimum similarity threshold. We also inferred the trophic mode of pelagic ASVs (phototrophic/photosymbiotic/parasitic/heterotrophic protists and zooplankton/other metazoan) based on the matching candidate reference sequences in PR² (up to three candidates per queried ASV). We ascribed our ASVs to functional groups only if the functional attributes across candidates above 95% similarity were unambiguous, i.e., all the candidates for taxonomic assignment share similar functional attributes. We also used the different size fractions of the *Tara* Oceans samples to infer the size of pelagic ASVs, by using a weighted average of relative abundances across the size fractions of plankton samples (using the lowest mesh size, e.g., from the 20- to 180- μm size fraction, we used 20 μm in our calculation for this size fraction).

Classifying eukaryotic ASVs into pelagic or benthic taxa

We considered the ASVs being detected in pelagic samples as planktonic (or nektonic), the ASVs detected exclusively in sediment samples as benthic, and the ASVs detected in both pelagic and sediment datasets as sinking plankton [although 29 vertebrates ASVs, comprising most of the nekton, represented ~1.29% of the sequences detected in both pelagic and sediment samples (table S3), we hereafter refer only to sinking plankton]. However, because multiple benthic groups have meroplanktonic larvae and hence could be detected in pelagic samples, we manually curated the ASVs assigned to metazoans within the sinking plankton fraction, based on their known lifestyles. This was, for instance, the case for some polychaetes, molluscs, echinoderms, or harpacticoid copepods that were "forced" into benthic diversity but not for pteropods that were left in the sinking plankton. Of the 546 metazoan ASVs in the sinking plankton fraction, 224 were curated as benthic (see table S8 for the details of this manual curation).

Eukaryotic community diversity and structural analysis

For α and β diversity analyses, we used functions of the *vegan* R package v2.5-3 (77), unless specified differently. Because the size fractionation of the pelagic samples from the *Tara* Oceans datasets has a strong effect on α and β diversity measures, we compared eukaryotic diversity patterns across pelagic and benthic realms by considering only the richest nano- (3 to 20 μm) and pico- (0.2 to 5 μm) size fractions of pelagic samples. The eukaryotic ASV accumulation curves as a function of sampling effort were computed with the *specaccum* function with the "random" method. We calculated the Shannon diversity for each sample and compared the distribution of sample diversity across both pelagic euphotic and aphotic with the strictly benthic diversity using the *stat_compare_means* function of the *ggpubr* R package v0.2.5 (78) with default settings. For β diversity analysis, we removed samples with less than 1000 reads and discarded ASVs represented by less than 100 reads throughout the dataset. We then normalized the ASV-to-sample matrix with the cumulative sum scaling (CSS) method (79) and computed a Bray-Curtis dissimilarity matrix between pairs of samples. The dissimilarity matrix was used to perform a nonmetric multidimensional scaling (NMDS) ordination on two axes. Sampling depth and absolute latitude variables

were fit to the NMDS as smooth surfaces using the *ordisurf* function. The dissimilarity matrix was also used as input of the *adonis* function for PERMANOVA models testing for differences between eukaryotic compositional structure between realms (pelagic euphotic, pelagic aphotic, and sediment) and along a gradient of absolute latitude (nested in type of realm and restricting permutations within type of realm with the "strata" option), using 999 permutations. Last, we measured the β diversity dispersion within each realm using the *betadisper* function and compared the distances distribution to group centroids between realms using the *stat_compare_means* function of the *ggpubr* R package.

For α diversity and β diversity analyses of the deep-ocean benthic communities, we focused on oceanic samples only, i.e., we did not consider the samples from the Mediterranean Sea nor the ones from the Gulf of California, to avoid potential effects from coastal ecosystems. We calculated the normalized ASV richness per sample for the overall benthic communities and for selected benthic groups (nematodes, foraminifera, plathyhelminths, polychaetes, molluscs, and ciliates) by rarefying each benthic sample at the lowest remaining sequencing depth (after removing planktonic ASVs and after focusing on a given benthic taxonomic group). We used generalized additive models (GAMs) to investigate the possible nonlinear variation of richness and Shannon diversity along gradients of latitude, primary production, and POC export from the surface and reaching the seafloor using the *gam* function of the *mgcv* R package (<https://cran.r-project.org/web/packages/mgcv/>) and the smoothing parameter set to 3. For β diversity analyses, we used a similar approach than detailed above (CSS-normalized and Bray-Curtis dissimilarity matrix), although here, we did not filter rare ASVs. We used the *coa* function of the *ape* R package (80) to perform a principal coordinate analysis of the Bray-Curtis dissimilarity matrix and calculate the structural variation explained by the first two axis of the ordination. We used the *ordisurf* and *envfit* functions to respectively fit the absolute latitude and a selection of environmental variables (seabed variables: salinity, temperature, silicate, nitrate, dissolved oxygen, POC reaching the seafloor, and pelagic variables that connect the surface to the DOS, namely, the primary productivity and the POC export from the surface) to the ordination. PERMANOVA models were used to test for differences in benthic composition between abyssal postulated biogeographic provinces (42) and along a gradient of absolute latitude using 999 permutations. Then, we used the selected environmental variables in a stepwise model building for constrained ordination (distance-based redundancy analysis) using the *ordi2step* function in a forward direction and using 999 permutations, to explain the observed benthic community structure. We calculated the proportion of shared ASVs between pairs of benthic samples to investigate the decrease of shared ASV proportion as a function of increasing spatial distance (calculated from GPS coordinates, see the "companionFunctions.R" script). We also calculated key distance-decay parameters as in (81), i.e., the initial similarities (Sørensen similarities between pairs of samples distant to each other by less than a kilometer), the slope of distance-decay relationship (here in a log-linear regression form), and the halving distances, i.e., the spatial distance after which the initial similarities are halved. We calculated these parameters on an average Sørensen dissimilarity matrix calculated over 10 rarefaction draws at the minimum sequencing depth possible (the sequencing depth of the sample with the lowest number of reads) and by considering the full benthic community or by focusing on selected benthic groups only, e.g., polychaetes, molluscs, or

platyhelminths (macrofaunal size classes); nematodes or foraminifera (meiofauna); and amoebae or ciliates (microbes). We used the *mantel* function to test for correlation between spatial distance and community dissimilarities using 999 permutations. We used the *betadisper* function to calculate the β dispersion of benthic communities at increasing sampling spatial scale (between replicates samples of a sediment core, between cores of the same deployment, between deployments at a given station, and within a given abyssal basin). Last, we aggregated all samples at the station scale and fitted neutral community assembly models as in (82) to investigate whether the distribution of ASVs within the pelagic and benthic realms are less or more geographically widespread than expected by neutral models.

We compared the inferred functional attributes (size and trophic mode) of sinking pelagic ASVs with their nonsinking counterparts to explore whether these traits could explain their transfer to the DOS. We also explored the variation of functional groups and size classes of the sinking planktonic communities in the sediment along the gradient of latitude. We investigated the spatial pattern of planktonic abundance on the seafloor by fitting a GAM on the proportion of planktonic DNA reads in the sediment as function of latitude (with smoothing parameter set to 3). Then, we aggregated the planktonic DNA reads of all sediment samples at the station scale and used random forest models to predict the POC export from the surface and the POC reaching the seafloor in a leave-one-out cross-validation approach. We used the *ranger* function of the *ranger* R package (83) in a regression mode, growing 300 trees and setting the “mtry” parameter at one-third of the total number of features (number of sinking pelagic ASVs). Linear models were used to measure the performance of predictive models. Last, we used a sparse partial least square regression [mixOmics R package (84)] to identify the pelagic ASVs detected in the sediment that are best correlated with the variation of POC export and POC reaching the seafloor and with primary productivity and latitudes. We then focused on the pelagic ASVs that were reported with a correlation coefficient above 0.3 with POC export and POC reaching the seafloor and presented them in a clustered heatmap.

SUPPLEMENTARY MATERIALS

Supplementary material for this article is available at <https://science.org/doi/10.1126/sciadv.abj9309>

[View/request a protocol for this paper from Bio-protocol.](#)

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Tristan CordierInès Barrenechea AngelesNicolas HenryFranck LejzerowiczCédric BerneyRaphaël MorardAngelika BrandtMarie-Anne Cambon-BonavitaLionel GuidiFabien LombardPedro Martinez ArbizuRamon MassanaCovadonga OrejasJulie PoulainCraig R. SmithPatrick WinckerSophie Arnaud-HaondAndrew J. GoodayColomban de VargasJan Pawlowski

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