



# Environmental DNA Monitoring of Biodiversity Hotspots in Danish Marine Waters

Peter A. U. Staehr<sup>1\*</sup>, Karsten Dahl<sup>1</sup>, Helle Buur<sup>1</sup>, Cordula Göke<sup>1</sup>, Rumakanta Sapkota<sup>2</sup>, Anne Winding<sup>2</sup>, Marina Panova<sup>3</sup>, Matthias Obst<sup>3</sup> and Per Sundberg<sup>3</sup>

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### \*Correspondence:

Peter A. U. Staehr  
pst@ecos.au.dk

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<sup>1</sup> Department of Ecoscience, Aarhus University, Roskilde, Denmark, <sup>2</sup> Department of Environmental Sciences, Aarhus University, Roskilde, Denmark, <sup>3</sup> Department of Marine Sciences, University of Gothenburg, Gothenburg, Sweden

We investigated the use of eDNA metabarcoding for supplementing traditional diver-based monitoring of biodiversity of marine boulder reefs within the photic zone. The applied sampling design made it possible to evaluate the usefulness of eDNA monitoring as a supplement for traditional monitoring. Specifically, this study aimed to (1) assess the local influence of boulder reefs on biodiversity across the North Sea to Baltic Sea transition zone and (2) investigate the importance of environmental gradients for patterns in community structure. On samples collected during August 2020, we compared the composition and abundance of species associated with nine reefs, representing an environmental gradient of salinity (16–33 psu), water temperature (16–21°C) and water depth (6–29 m). At each reef site, water was sampled near the bottom just above the reef and on average 2.6 km upstream and downstream (location) and sequenced with metabarcoding using COI, 18S and 12S rDNA primers. eDNA identified 400 species, diver-based observations identified 184 with an overlap of 70 species (12%) and 81 genera (18%). While eDNA identified many infaunal species, it did not detect several macroalgal species which dominated in the diver-based observations. Multivariate analysis of eDNA and diver-based community structure both distinguished between reef communities, with a significant match between patterns observed by the two methods ( $r = 0.37$ ,  $p = 0.02$ ). Furthermore, the eDNA approach made it possible to identify significant differences in species composition between upstream, above-reef and downstream locations, suggesting that eDNA leaves a local footprint in benthic habitats. Patterns in both eDNA and diver-based species composition and richness were significantly related to geographical distance, salinity, water temperature and water depth. Despite of low detection of macroalgae, the eDNA sampling provided a substantial supplement to traditional diver-based monitoring of biodiversity around benthic hotspots in the Danish marine waters and therefore we recommend to add eDNA methods to conventional monitoring programs in the future.

**Keywords:** community structure, benthic, boulder reefs, eDNA metabarcoding, biodiversity

## INTRODUCTION

Boulder reefs are productive hard bottom habitats in marine ecosystems otherwise characterized by soft sediments (Dahl, 2003). The reefs encompass a large range of sizes, compactness and complexity which under favorable photic conditions are associated with a high coverage of macroalgae, and with diminishing light at depth gradually change to faunal communities (**Figure 1**). The reefs are known to be active sites for marine carbon sequestration (Krause-Jensen and Duarte, 2016) and provide habitat, refuge and food for sessile and mobile animals (Lundsteen et al., 2008). This includes fish species (Stenberg and Kristensen, 2015) with evidence of enhanced overall fish productivity through better access to shelter, increased food availability and reduced metabolic costs (Schwartzbach et al., 2020). Therefore, boulder reefs are considered as important biological hotspots for a range of benthic and pelagic species, resulting in several reefs being protected in regions, within the European Union (Directive, 1992). Due to the ecosystem services associated with reefs, they are increasingly restored and used as a management tool to mitigate human pressures on marine ecosystems (Bohnsack and Sutherland, 1985; Kristensen et al., 2017; Staehr et al., 2020; Staehr et al., 2021).

Structurally complex reef habitats are becoming rarer across many marine environments (Pandolfi et al., 2003; Airoidi and Beck, 2007) with negative implications for biodiversity (Airoidi et al., 2008). In Danish waters, boulder reefs have been diminished for decades through the removal of boulders to be used for port mills and construction works. A recent estimation suggests that over the last 50 years, around 55 km<sup>2</sup> of boulders and stones were removed from Danish coastal waters (Helmig et al., 2020). This was done mostly from the shallow waters (<10 m), until prohibited by law in the year 2010. In addition, significant amounts of stones have been removed from the fjords due to mussel dredging (Krause-Jensen et al., 2012). Although there was no systematic survey to estimate to what extent the removal of natural boulder reefs affected the ecosystem, evidence from a large reef restoration project in The Kattegat region, document that reintroducing boulders can result in a several fold increase in the abundance of associated macroalgae and fauna and the functions these provide (Stenberg et al., 2015). The restoration effort also documented the importance of boulder reefs as food and nursery grounds for higher trophic levels such as marine mammals which increased in numbers (Mikkelsen et al., 2013).

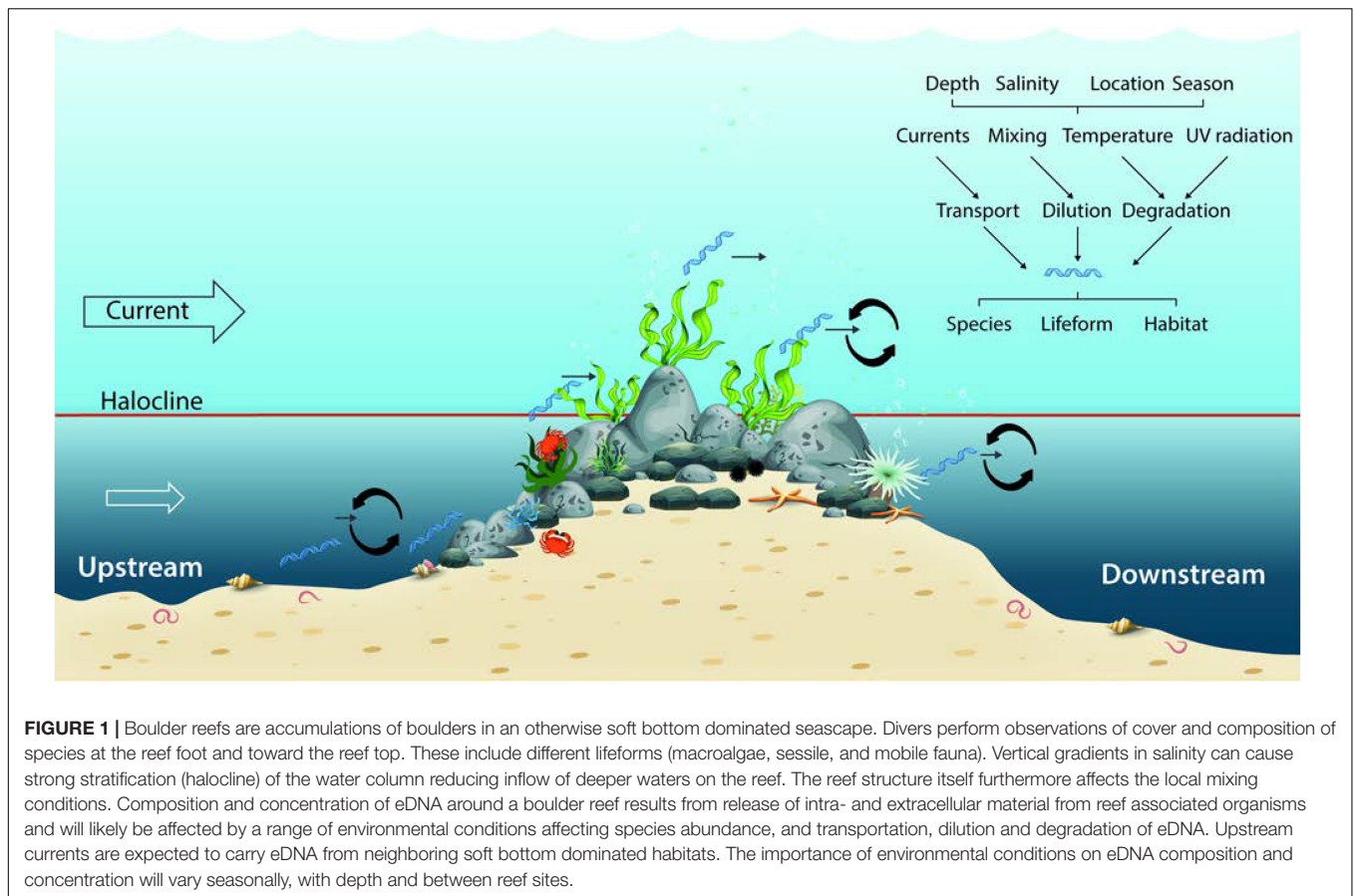
Robust and affordable monitoring surveys are necessary to provide assessment of ecosystem health, including detailed data on species' distributions and trends in abundance (Keith et al., 2015). Monitoring of reefs in Danish waters has been ongoing for more than 30 years using divers equipped with underwater video and radio communication. Species verification on collected material has provided high taxonomic certainty and enabled a thorough understanding of responses in species composition, coverage and diversity in relation to changes in environmental conditions including eutrophication and climate change (Krause-Jensen et al., 2021). While this monitoring approach is robust, it is very resource demanding and it provides

limited information on fish associated with reefs and on species living in the soft sediment between (here referred to as infaunal species) the boulders as these are less visible to the diver. Also, occurrence of species with unresolved taxonomy including those of unknown origin (cryptogenic) in combination with general diminishing taxonomic expertise in many countries, may reduce the applicability of traditional, observation-based monitoring techniques with implications for proper protection of marine areas (Gill et al., 2017). Attempts are therefore being made worldwide to apply a variety of molecular approaches to monitor marine biodiversity (Leray and Knowlton, 2015; Barnes and Turner, 2016). They are potentially less expensive and/or provide more detailed information on the plants, sessile and mobile animals and plankton associated with the reefs.

The use of environmental DNA (eDNA), in particular metabarcoding, has gained attention as a promising tool for monitoring aquatic species for biodiversity assessments. By avoiding visual species observation, capture and direct sampling (Goldberg et al., 2016) eDNA metabarcoding has the potential to greatly reduce cost and time, while aiding ecosystem conservation and management through improved detection of species (Thomsen and Willerslev, 2015; Winding et al., 2019). Studies have demonstrated that eDNA metabarcoding can detect taxa not easily detectable such as alien or endangered species (Dejean et al., 2012; Piaggio et al., 2014), and document local scale patterns in benthic communities in marine habitats connected by water movement (Jeunen et al., 2019).

There are potential problems with eDNA based monitoring (Darling and Mahon, 2011) one should be aware of. There may for example be false positives, where DNA from a species is detected during the analysis although actually not present in the area. This could be a case of DNA arising from species far from the study site and would depend on the DNA "life-time," currents and other environmental conditions. There is also the possibility of false negatives, i.e., no DNA is detected from a particular species although present in the area. We know that "detectability" varies between phyla and also depends on the primers used (see e.g., the case of the macroalgae in this study). It could also depend on abiotic factors like DNA degradation. The completeness of reference databases will determine the match between sequence and species. As a consequence, all sequences cannot be assigned Linnean names. Like traditional visual biodiversity inventories there are thus also shortcomings with eDNA monitoring (McClenaghan et al., 2020).

Application of eDNA metabarcoding as a technique to monitor biodiversity in hotspot areas such as boulder reefs in Danish marine water, is furthermore challenging as there are many conditions (**Figure 1**) which may potentially confound results by dispersal of eDNA in the water column (Goldberg et al., 2016; Jeunen et al., 2019). The shallow bathymetry of the Danish marine waters combined with a significant exchange of high saline North Atlantic waters with the outflowing brackish Baltic Sea water cause large scale movement within the Baltic-North Sea transition zone (Bendtsen et al., 2007). In addition, water movements around boulder reefs vary greatly over time from different directions depending on local dynamics (e.g., turbulence, vertical mixing) influencing currents around and



within the reefs (Sørensen, 2012). It is therefore likely that currents are capable of transporting eDNA over larger distances, potentially leading to false positive signals (Roussel et al., 2015).

In this study, we investigated the applicability of eDNA metabarcoding to survey boulder reef habitats in a hydrodynamically complex marine system within the transition zone from the North Sea to the Baltic Sea. We present eDNA data from three metabarcoding assays for eukaryotes (18S rDNA), fish (12S rDNA) and invertebrates (COI) collected on average 2.6 km upstream and downstream and ca. 1 m above a boulder reef (see **Table 1**). Nine reef sites were sampled representing a total distance of 430 km and salinity gradient from 10 to 34 psu, with depth ranges of 6–29 m. At each reef we also obtained diver-based observations of benthic sessile and mobile fauna and attached macroalgae. These surveys enabled us to address the following questions and hypotheses:

- (1) Does eDNA metabarcoding enable detection of benthic associated species related to discrete boulder reef habitats? We expect that reef samples will be dissimilar compared to samples collected upstream and downstream of the reefs and contain more reef-associated species.
- (2) What is the level of agreement between benthic species community composition and species richness detected by eDNA metabarcoding and diver-based observations, respectively? We expect some similarity in

the characterization of the nine reef sites for both methods, but with overall more species detected through eDNA which is expected also to better detect infaunal species and fish not associated with the hard-bottom reef structures.

- (3) To what extent can patterns in species composition determined from eDNA and diver-based observations be explained by the environmental conditions associated with the reefs? We expect salinity to be the most important driver of change in species richness and benthic community structure.

## METHODS AND STUDY SITES

### Sampling Sites

The inner Danish marine waters covers a transition zone from the high saline dense North Sea waters entering from the north into the Kattegat area, where the water is intercepted by less saline surface waters outflowing from the Baltic Sea (**Figure 2**). Along this transition zone several natural formations of boulders are scattered providing habitats for several sessile and mobile organisms. The boulders are interspersed with sand and gravel, and typically surrounded by deeper soft sandy and muddy sediments. The boulders consist of mostly granite, gneiss and limestone left behind by retreating glaciers, and ranges from a few cm to 1–2 m in diameter. Formations of boulders covering more

**TABLE 1** | Information on depth distribution of boulders and eDNA sampling locations (Loc).

Reef no	Reef site name	Loc	Latitude	Longitude	Dist (km)	US/DS Dist (km)	Fvol (ml)	Depth (m)	Salt (psu)	Temp (°C)
1	Herthas Flak	US	57° 39.50' N	10° 52.00' E		2	1020	27	33.1	17.0
1	Herthas Flak	Reef	57° 38.48' N	10° 51.93' E	0		1020	15 (10–20)	33.2	17.0
1	Herthas Flak	DS	57° 37.50' N	10° 52.00' E		2	1020	26	33.2	17.0
2	Per Nilen	US	57° 20.50' N	11° 7.80' E		7	1020	10	25.2	18.0
2	Per Nilen	Reef	57° 22.74' N	11° 2.60' E	31		1020	11 (6–11)	27.5	18.0
2	Per Nilen	DS	57° 23.20' N	11° 2.00' E		1	1020	15	27.5	18.0
3	Tønneberg Banke	US	57° 24.50' N	11° 16.00' E		7	1020	29	32.5	17.0
3	Tønneberg Banke	Reef	57° 28.29' N	11° 16.25' E	48		1020	11 (10–15)	32.8	17.0
3	Tønneberg Banke	DS	57° 29.50' N	11° 16.00' E		2	1020	22	32.8	17.0
4	Kims Top	US	56° 58.96' N	11° 35.38' E		3	1020	20	33.1	17.0
4	Kims Top	Reef	57° 0.76' N	11° 35.43' E	103		1020	16 (15–23)	33.5	18.0
4	Kims Top	DS	57° 1.51' N	11° 35.70' E		1	1020	26	33.6	16.0
5	Briseis Flak	US	56° 19.58' N	11° 14.00' E		6	1020	22	31.7	16.5
5	Briseis Flak	Reef	56° 19.58' N	11° 19.57' E	181		780	8 (5–10)	29.7	20.0
5	Briseis Flak	DS	56° 18.00' N	11° 20.00' E		3	1020	20	30.4	17.0
6	Schultzs grund	US	56° 7.240' N	11° 8.67' E		1	1020	27	32.1	16.0
6	Schultzs grund	Reef	56° 7.53' N	11° 7.91' E	206		900	17 (4–18)	32.1	17.0
6	Schultzs grund	DS	56° 8.53' N	11° 9.81' E		3	780	24	30.6	15.5
7	Staaegrund Banke	US	54° 59.06' N	11° 18.79' E		<1	1020	14 (14)	18.2	21.0
7	Staaegrund Banke	Reef	54° 59.14' N	11° 19.04' E	333		1020	9	18.2	21.0
7	Staaegrund Banke	DS	54° 59.19' N	11° 19.20' E		<1	1020	13	17.9	20.0
8	Kirkegrund	US	55° 6.67' N	11° 23.36' E		1	840	12	16.1	21.0
8	Kirkegrund	Reef	55° 6.84' N	11° 22.26' E	348		1020	6 (6–13)	16.8	21.0
8	Kirkegrund	DS	55° 7.21' N	11° 22.56' E		1	1020	15	16.5	21.0
9	Moens Klint	US	54° 56.24' N	12° 32.73' E		2	1020	12 (4–21)	10.2	19.0
9	Moens Klint	Reef	54° 57.43' N	12° 33.46' E	426		1020	6	9.9	19.5
9	Moens Klint	DS	54° 58.98' N	12° 34.95' E		3	1020	21	11.7	19.0

Water samples were collected at nine reefs sites, with samples taken upstream (US), downstream (DS) and above the reefs (Reef). Distance (Dist) is from the first reef and US/DS Dist, is the distance either upstream or downstream of the central reef location. Fvol is the filtration volume for DNA sampling. Depths in parenthesis indicate the depth range of the respective reefs. Salt represent summer average salinity levels while water temperatures (Temp) were measured inside the water sampler.

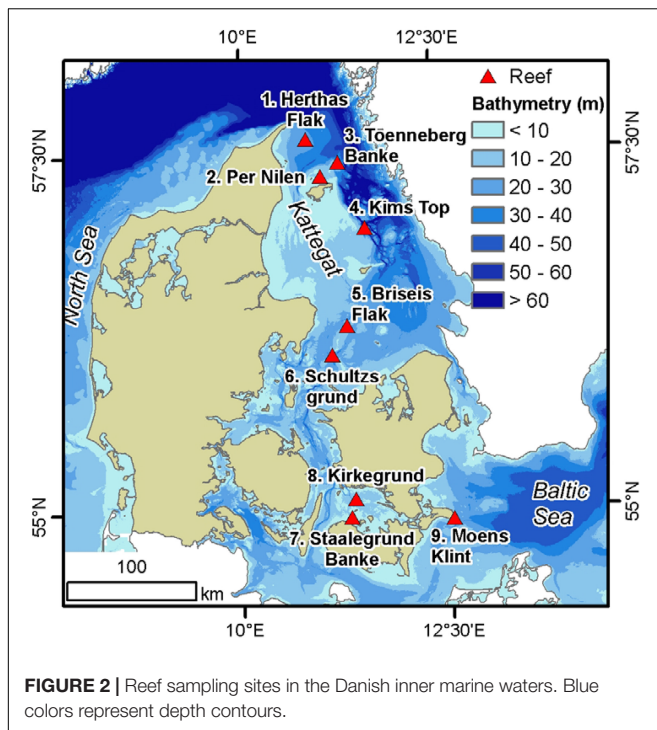
than 25% of the seafloor are defined as boulder reefs according to the Danish EPA's definition. As part of the Danish national marine monitoring program, a number of the larger boulder reefs have been investigated since the 1990s. Of these, we selected nine of the largest reefs for our investigation (**Figure 2**). The depth distribution of the nine reef structures varies considerably, some more shallow some deeper and some having a larger depth range (**Table 1**).

## Environmental DNA Sample Collection, Filtration, and Extraction

At each of the nine reef sites, water eDNA was collected above the central part of each reef (above-reef) and on average 2.6 km upstream (US) and 2.6 km downstream (DS) from the reef center. Samples were collected during the annual reef monitoring cruise during 1 week in August 2020. At each sampling site, the maximum water column depth was determined by the ships echo sounder, after which the sampling depth (max – 1 m) was decided and replicate water samples were collected 1–2 m above the seafloor with a 1.5 L Niskin water sampler. In cases where the water sampler touched the seafloor a new sample

was taken. This approach was used to optimize collection of benthic eDNA traces while avoiding collection of resuspended material (Tréguier et al., 2014; Turner et al., 2015). The choice of downstream and upstream sites was based on interpretation of the direction and strength of the local currents and knowledge of bathymetry conditions. Shorter distances were thus chosen around reefs. e.g., at Kirkegrund (**Figure 3**) where currents were low and bathymetry indicated hard bottom structures at greater distance. Current direction was determined from positioning of the anchored ship over the central reef site relative to the geographic north. Current speeds were obtained from the Sejladsudsig<sup>1</sup>. Between 780 and 1020 mL of water were collected per samples and manually pressure filtered using 100 ml vials through a 0.22 mm Sterivex filter cartridge (Millipore). Filters were transferred to individual zip lock plastic bags and stored at –20°C until DNA extraction. Negative controls during fieldwork were carried out by filtering RNA/DNA free water at sampling sites using the same equipment and procedures as for the sharp samples. To avoid cross-contamination, non-disposable and non-sterile equipment was wiped or soaked in 10% bleach between

<sup>1</sup><https://ifm.fcoo.dk/>



sampling sites. Information on sampling depth, position, water depth and filtration volume is shown in **Table 1**.

The DNA extraction was performed with NucleoSpin® eDNA Water, MACHEREY-NAGEL according to the manufacturer's instructions. This kit allows processing of encapsulated Sterivex filters which prevents cross-sample contaminations. A no-sample control was included at the DNA extraction stage. DNA extraction and the following PCR were carried out in separate rooms. Laboratory procedures to avoid contamination involved regular wiping of bench surfaces with DNA Away™, placing equipment in UV-cabinet, using sterile filter pipette tips and small aliquots of chemical solutions. No-template controls were included in all PCRs.

In addition to the field samples we included two mock community samples: one containing DNA from nine invertebrate species and the other containing DNA from ten fish species. These mock communities were used as positive controls for PCR amplification and sequence analyses. Altogether, 63 samples were included for each of the three barcodes: nine reefs × three locations (upstream, above-reef, downstream) per reef site × two field replicates per location = 54 water samples, five negative controls (three field controls, one lab control and one PCR no-template control) and two mock communities. More details on positive and negative controls are provided in the **Supplementary Material**.

## Metabarcoding of Environmental DNA Samples

The amplicon libraries were prepared using three targeted markers: 18S rDNA with universal eukaryote primers SSU-F04 and SSU-R22, fragment size approx. 370 nt (Fonseca et al., 2010),

COI with universal invertebrates primers mICOLintF and dgCOI2198, fragment size 367 nt (Leray et al., 2013), and 12S rDNA with universal ray-finned fish primers MiFish-U-F and MiFish-U-R, fragment size approx. 260 nt (Miya et al., 2015). The libraries were prepared in two steps: first, the target gene fragments were amplified with the locus-specific primers, extended with overhang adapter sequences compatible with Illumina Nextera XT library preparation kit in the second PCR. The first PCR products were amplified with the Nextera index primers to add Illumina sequencing adapters and dual-index barcodes.

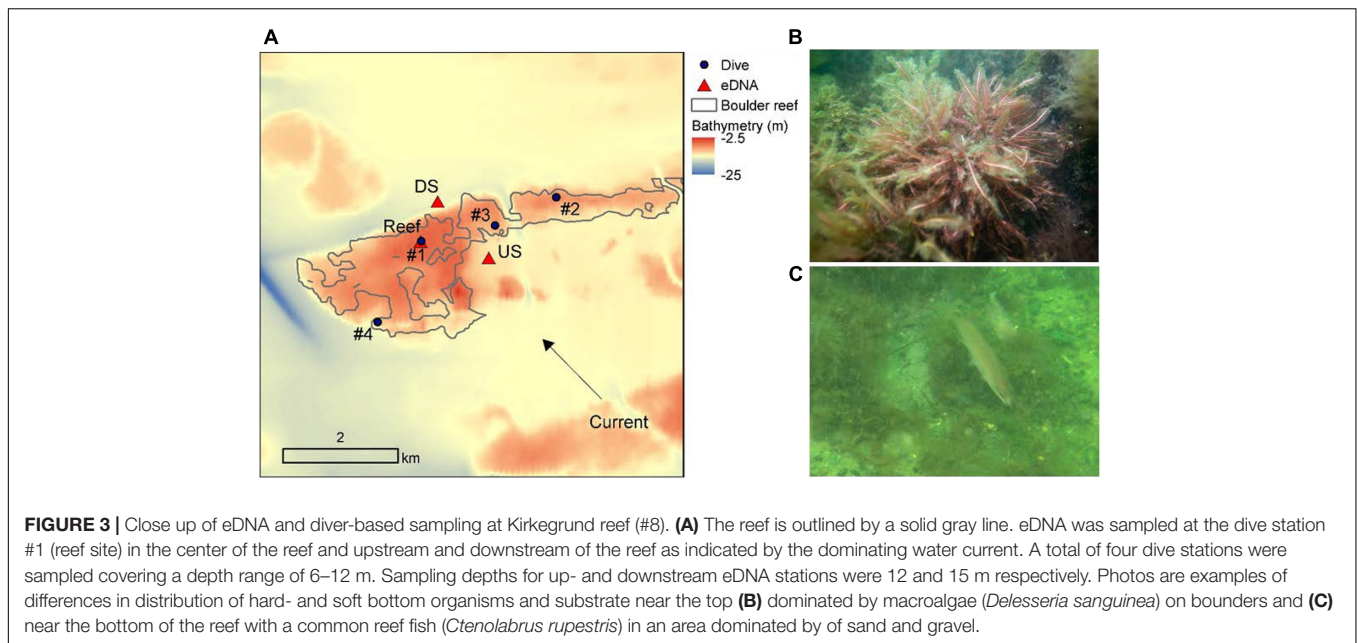
The first, locus-specific PCR, two PCR reactions were performed for each sample and pooled to minimize random variation. Each PCR was performed in 25 µL volume, containing 12.5 µl KaPa HiFi HotStart ReadyMix 2x (Roche), 1 µl of 10 mM forward and reverse primers, 0.5 µl of bovine serum albumin 20 mg µL<sup>-1</sup>, and 2 µL (10–20 ng) of DNA template. Thermocycling conditions involved initial denaturation at 98°C for 2 min followed by 35 cycles at 98°C for 40 s, Ta °C for 30 s, 72°C for 30 s, and final extension at 72°C for 5 min. Annealing temperatures (Ta) were 57°C for 18S rDNA, 48°C for COI and 65°C for 12S rDNA. PCR products were visualized on agarose gels to confirm successful amplification and cleaned with AMPure XP beads in 1:1 ratio (Beckman Coulter) following the Illumina amplicon preparation protocol<sup>2</sup>.

The second index-PCR was performed in 50 µL volume, containing 25 µl KaPa HiFi HotStart ReadyMix 2x (Roche), 5 µL of index 1 and index 2 primers from Illumina Nextera XT v.2 Index kit, 5 µL of cleaned inner PCR products and 10 µL of PCR-grade water. Thermocycling conditions (Tm) were 95°C for 2 min; 10 cycles at 95°C for 30 s, 55°C for 30 s, 72°C for 30 s; 72°C for 5 min. PCR products were cleaned with AMPure XP beads (Beckman Coulter) following the Illumina protocol, see above. The DNA concentrations of the cleaned PCR were measured with Qubit fluorometer and PCR products were pooled in equimolar concentrations (900 nM). The samples were sequenced on the Illumina MiSeq v3-600 (2x300) platform by the National Genomic Infrastructure (NGI) in Sweden, 96 samples per run combining PCR products for different loci. All sequence files and metadata from this study were deposited in the NCBI sequence read archive under the project accession number PRJEB48452.

## Bioinformatic Analyses

Bioinformatic analysis was performed with a custom pipeline written in the R programming language (R-Core-Team, 2019). Raw sequencing files in fastq format were processed with Dada2 (Callahan et al., 2016). Primer location and orientation was assessed, while primer removal was done with Cutadapt (Martin, 2011). Quality profiles for all samples and markers were assessed with FastQC. Subsequently, low-quality read ends were trimmed off at the first instance with a quality score less than 2 and the error model was trained and evaluated, resulting in a good

<sup>2</sup>[https://support.illumina.com/documents/documentation/chemistry\\_documentation/16s/16s-metagenomic-library-prep-guide-15044223-b.pdf](https://support.illumina.com/documents/documentation/chemistry_documentation/16s/16s-metagenomic-library-prep-guide-15044223-b.pdf)



match between observed and expected errors. Thereafter de-replication and inference of Amplicon Sequence Variants (ASV) were performed and forward and reverse reads merged. Finally, chimeras and singletons were removed using “pseudo-pooling” option. Remaining sequences were trimmed to a minimum length to exclude short reads (12S: 150 bp, COI: 300 bp, 18S: 300 bp). After filtering, the number of reads per sample was on average 24,176 (range 7,554–100,784). The scripts are available in the **Supplementary Material**.

Taxonomic assignment for COI was done against the BOLD reference library<sup>3</sup> using BOLDigger (Buchner and Leese, 2020). 18S rDNA ASVs (Amplicon Sequence Variants) were assigned against the PR2 reference library<sup>4</sup>, and 12S rDNA against MitoFish reference library<sup>5</sup> using “assignTaxonomy” option in Dada2. Output files included the distribution of identical sequence reads across all samples associated with a taxonomic identification, process-ID, and similarity value. ASVs tables were transformed into presence/absence tables for all taxa unambiguously identified with a similarity threshold 98% across all samples and species assignments with lower similarity as well as sequences without any match were discarded. All ASV tables are available in the **Supplementary Material**, while all original files and derived species observations are publicly available under the PlutoF project <https://plutof.ut.ee/#/study/view/107978>.

All species with a low match to the reference libraries were excluded from the data set as well as observations of typical lab contaminants (*Canis lupus*, *Homo sapiens*) which were rare. Finally, we removed observations of 6 tropical fish detected by the 12S rDNA marker, which are considered highly unlikely to occur in Danish waters. In these cases, observations were based on a

single ASV occurring only in one or two samples with few reads (<20) and may originate from using a low quality score during trimming of raw sequences. Two separate data sets were saved, one including and one excluding presumed contaminations and are available in the **Supplementary Material**. The taxonomic species lists were finally reduced to macroalgae, fish and benthic epi- and infauna species as we wanted to focus the investigation on species that are expected to be associated with the boulder reef habitats. This accordingly excluded species belonging to phytoplankton and zooplankton.

## Diver-Based Species Detection

The dive investigation included an *in situ* description of the seabed sediment composition at each of the nine reef sites, a description of the total vegetation cover, and species-specific cover of macroalgae and hard bottom fauna organisms identified by the diver. In addition to the *in situ* dive observations, video recordings were later used for quality assessment and a more detailed species account. The area covered at each dive site was at least 25 m<sup>2</sup>. A dive site was located for each 2–3 m depth interval on the reef structure from the top of the reef to the reef foot where hard stable substrate became scarce (<10% cover, **Figure 1**). Thus, depending on the size and depth range of the reefs, there were between 1 to 6 dive sites at each reef site (**Figure 3**). The investigation followed the Danish technical guideline TA-M14 for reef monitoring (Dahl and Lundsteen, 2018), which describes the reef monitoring conducted as part of the Danish national monitoring program (NOVANA). Some organisms were not identified to species level but at higher taxonomic level. Examples are crust-forming algae that are separated into calcified red crusts, red and brown crusts and the species *Lithothamnion glaciale*. In addition to the diver-based *in situ* observations, individual species were sampled for verification, thus providing a more detailed species account. The

<sup>3</sup>[www.boldsystems.org/](http://www.boldsystems.org/)

<sup>4</sup><https://pr2-database.org/>

<sup>5</sup><http://mitofish.aori.u-tokyo.ac.jp/>

species were stored in 5–10 L buckets to which 70% alcohol was added for conservation and later identified in the laboratory. The investigations were made by divers with many years of experience in hard bottom monitoring and a trained taxonomist with high expertise. Eventually all species were assigned a cover value ranging from 0.1 to 100% as an integrated measure over the ca. 25 m<sup>2</sup> covered area. For the purpose of comparing with the eDNA based detection we, however, reduced cover information to presence/absence. All diver-based species observations are available in the **Supplementary Material** and also under the public PlutoF project <https://plutof.ut.ee/#/study/view/107978>.

## Environmental Variables

At each site water temperature of the sample was measured with a thermometer inside the water sampler. Salinity was extracted for each site from position and depth using modeled data representing summer average values (Staehr et al., 2019). From the sample positions we calculated the straight distances between the central reef sites. The upstream and downstream distance was calculated in relation to the central reef position (**Table 1**).

## Community Analysis

Rank vs. relative abundance curves were used to compare the level of evenness (Foster and Dunstan, 2010) between benthic communities determined by eDNA and diver observations. For each species, relative abundance was calculated as the number of sites a species was observed divided by the total number of sites investigated (54 for eDNA, and 35 for diver-based observations). As a measure of evenness, we calculated the slope of the relations between Log<sub>10</sub> abundance and rank, using an exponential decay model.

Patterns in community structure for both eDNA and diver-based observations were analyzed with Bray–Curtis similarities (Bray and Curtis, 1957) using a non-parametric multivariate statistical software PRIMER (Clarke and Gorley, 2015). To investigate the effect of location (upstream, above-reef, downstream), and site (nine reefs) on eDNA based species composition, we applied a Permutational Analysis of Variance (PERMANOVA) from the PRIMER add on package (Anderson et al., 2008) based on the Bray–Curtis similarity matrix. We ran PERMANOVA using sums of squares (SS) Type III. Highly non-significant terms were removed from the final model. Similarities between sample groups (eDNA based: location and reef sites, Diver-based: reef sites and sampling depths) were visualized with a metric Multi-Dimensional Scaling plot (mMDS-plots) using the PRIMER software package (Clarke and Gorley, 2015). To assess significant differences in diver-based species composition among the nine reef sites, we applied a one-way analysis of variance (ANOSIM) (Clarke et al., 2014). The RELATE analysis in PRIMER (Clarke et al., 2014) was applied to investigate the level of agreement between resemblance matrices for eDNA and diver-based observations.

The Biota–Environmental (BIO–ENV) routine in PRIMER v7 was used to explore relationships between community structure and the environmental variables (water depth, temperature, salinity, distance between sampling sites) presented in **Table 1**. The BIO–ENV routine calculates Spearman rank

correlations between the similarity matrix derived from species absence/presence data and matrices derived from environmental variables that could explain the biotic structure (Clarke et al., 2014). The statistical significance of the results was tested by the global BIO–ENV match permutation test whereby each set of samples was randomly permuted relative to the other. We tested the null hypothesis that there is no relationship between the species abundance matrix and any of the possible resemblance matrices subsets of the environmental variables. The real rank correlation coefficient was compared with the permuted null hypothesis values, and if the actual coefficient was larger than any of the permuted coefficients, the null hypothesis of no relationship between the species abundance matrix and any of the possible resemblance matrices subsets was rejected with a  $p < 1\%$ . Environmental parameters were log-transformed and normalized prior to analysis to derive meaningful Euclidean distances between environmental variables.

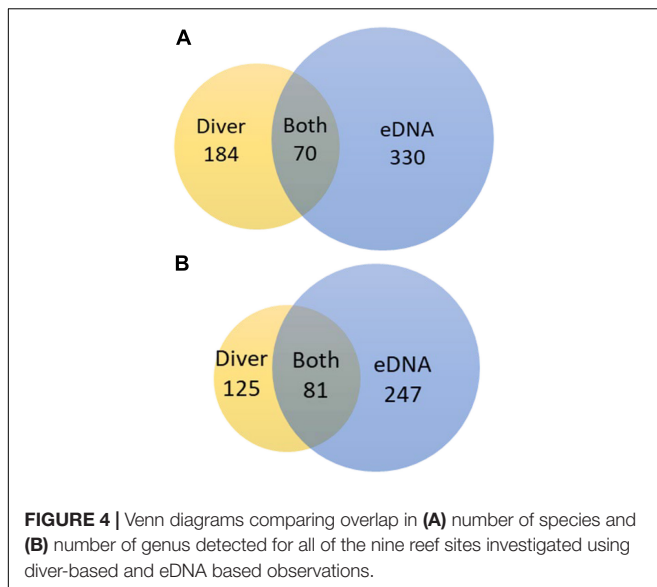
## RESULTS

### Comparability in Species Richness and Evenness

eDNA metabarcoding using three barcodes detected a total of 400 species within 328 genera in 54 samples. In comparison diver-based monitoring provided 254 species and 206 genera in 35 samples (**Table 2**). There was an overlap between the two methods of 70 species (12%) and 81 genera (18%) (**Figure 4**). The highest overlap was within epifauna (gastropods, hydrozoans, crabs, bryozoans, barnacles etc.) and macroalgae (red, brown and green) (**Table 2**). Divers only observed 12 fish species, four of which was also identified by eDNA, which, however, detected 40 fish species. While eDNA detected 120 infaunal species (polychaetes etc.), divers only observed six. In the mock communities, 96% of the reads were correctly assigned to the invertebrate species and 93% of the reads to the fish species by COI. By 12S, 100% of the reads were correctly assigned to the fish species in the mock at the genus level (not at the species level

**TABLE 2** | Comparison of the number of species and genus within functional groups.

Taxonomic level	Functional groups	Only diver	Only eDNA	Both (% of total)	Total
Species	Macroalgae	78	33	16 (13)	127
	Epifauna	94	143	48 (17)	285
	Fish	8	36	4 (8)	48
	Infauna	4	118	2 (2)	124
	Total	184	330	70 (12)	584
Genus	Macroalgae	49	18	22 (25)	89
	Epifauna	69	105	50 (22)	224
	Fish	5	26	6 (16)	37
	Infauna	2	98	3 (3)	103
	Total	125	247	81 (18)	453



because the pikeperch in the mock was identified both as *Sander lucioperca* and *S. canadensis*).

While eDNA detected more species overall, the two methods identified on average a similar number of species per site (Figure 5). For the eDNA approach, we detected slightly more species when sampling above the boulder reefs (46) compared to downstream (43) and upstream (43) of the reef. Differences in number of species detected were mostly associated with the hard bottom associated species (Table 3). Both methods provided significant different number of species among reef sites ( $p < 0.001$ , one-way ANOVA). Species richness detected by eDNA at sample locations (upstream, above-reef, downstream), were however, not significant different ( $p = 0.127$ , one-way ANOVA).

To compare the overall species composition by the two methods, we calculated the relative abundance of species, as sum of species present divided by number of samples. Sorting the species lists according to their relative abundance, and plotting these with their rank number, provided rank abundance curves where the slope can be used as a simple indicator of the overall evenness of the species composition (Figure 6). Each data set was modeled with an exponential decay function. Overall, the eDNA method had a higher slope ( $-0.021$ ) compared to diver-based data (slope =  $-0.017$ ). The eDNA method therefore seems to provide a less even distribution of species with a few species being very dominant. The eDNA records were furthermore dominated by many infaunal species not detected by the divers, while divers reported a number of macroalgae not recognized in the eDNA analysis (Figure 6 and Table 2).

## Patterns in Community Structure

To assess the level of agreement between benthic species community composition detected through eDNA metabarcoding and diver-based observations, we calculated the similarity of the species communities using the Bray–Curtis similarity index. Based on eDNA data, the species community structure was

overall significantly different among reefs and between locations, using replicate samples for each location and analysis of variance with PERMANOVA (Table 4). Also, differences in diver-based species composition among the nine reef sites, were significant ( $p = 0.001$ , one-way ANOSIM).

To visualize differences in species composition detected by eDNA and diver-based observations, we made 2D ordination plots and outlined the reef sites on these (Figure 7). Both eDNA and diver-based 2D ordination plots had a high stress of 0.33 and 0.26 respectively (Figure 7), compared to stress of 0.24 and 0.18 in 3D ordination (not shown). Thus, while the reef sites, according to the PERMANOVA (eDNA data) and ANOSIM (diver data) tests were statistically different, similarity in species composition were not optimally visualized in 2D ordination plots. Accordingly, some overlap was observed among reef sites for both the eDNA (Figure 7A) and diver-based (Figure 7B) data, with the highest degree of overlap for neighboring reefs. Furthermore, the PERMANOVA test indicated that there was a significant difference between the upstream, above-reef and downstream communities as detected by eDNA sampling. A visual comparison of the eDNA and diver-based ordination plots, suggested some similarities in the overall distribution of reef sites. This was supported by comparison of resemblance matrices using the RELATE analysis ( $r = 0.37$ ,  $p = 0.02$ ), indicating a moderate but significant match between the species composition pattern detected by the two methods.

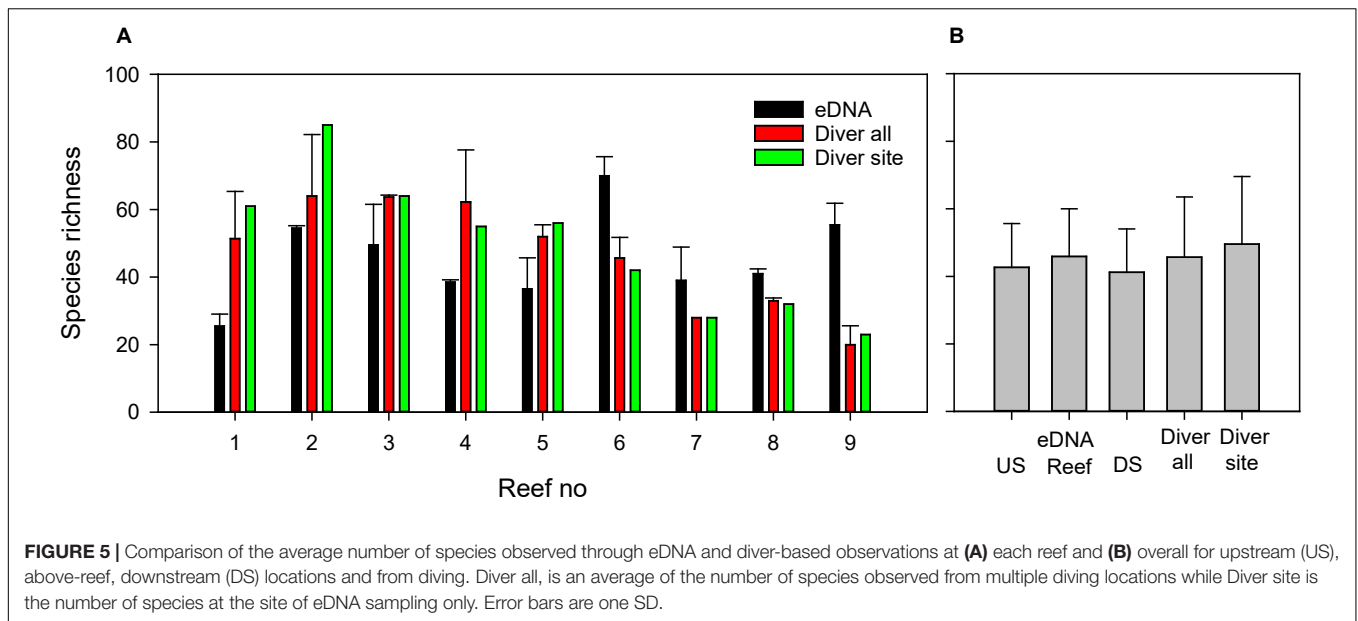
## Importance of Environmental Conditions

A Pearson correlation analysis showed that, as expected, salinity decreased with increasing distance from the northern reef sites ( $r = -0.87$ ,  $p < 0.001$ ) and increased with depth ( $r = 0.58$ ,  $p < 0.001$ ). Also, water temperature decreased significantly with depth ( $r = 0.71$ ,  $p < 0.001$ ) and reef depths decreased with distance from north ( $r = -0.41$ ,  $p < 0.001$ ). Thus, with increasing distance from north to south, reefs overall became shallower, with warmer and less saline waters. Along this gradient, the species richness detected by eDNA showed a weak decrease with decreasing salinity ( $r = 0.23$ ,  $p = 0.09$ ), and a decrease with increasing temperatures ( $r = -0.44$ ,  $p < 0.001$ ). A correlation analysis for diver-based observations of species richness, showed similar trends, with higher richness in more saline waters ( $r = 0.77$ ,  $p < 0.001$ ), decreasing richness toward southern sites ( $r = -0.80$ ,  $p < 0.001$ ) and a decrease with increasing temperatures ( $r = -0.46$ ,  $p = 0.005$ ). Using the BIO-ENV routine to explore relationships between community structure and the environmental variables patterns, we found that the highest level of explanation to derive from a combination of distance, salinity, and water temperature ( $r = 0.48$ ,  $p = 0.01$ ) listed in order of importance.

## DISCUSSION

The usefulness of eDNA metabarcoding as a possible supplement to traditional diver-based monitoring of biodiversity at boulder reefs was investigated. The eDNA approach provided substantial additional information for the investigation of patterns in





community structure along large scale environmental gradients as well as local differences around the nine reefs. While this is promising, the inability to identify several dominant macroalgal species, indicate that adjustments of the metabarcoding protocol for this specific group is needed to allow for better detection of benthic flora associated with boulder reefs. The relatively low agreement between species lists obtained from eDNA and diver-based observations is not surprising as it has been described in other comparative studies such as (Obst et al., 2020; Valdivia-Carrillo et al., 2021), demonstrating in part how these methods complement each other and highlighting that both techniques have limitations.

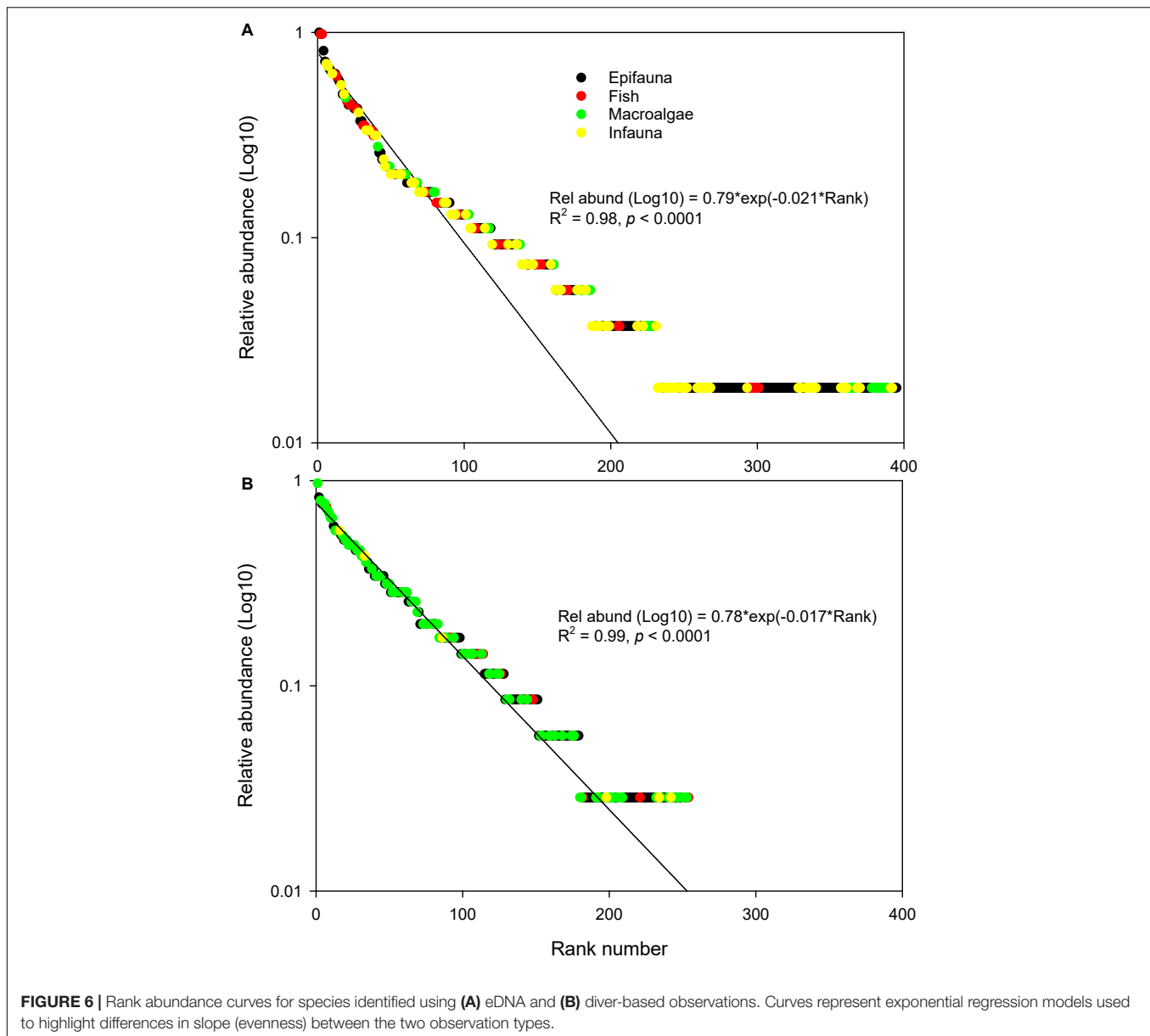
### Comparability in Species Richness and Evenness

The eDNA approach provided an overall much larger list of species compared to the diver-based observations, suggesting that eDNA is a more sensitive approach. Part of this stems from the fact that eDNA captures signals from several infaunal and fish species not observed by the diver. In addition, due to exchange of water masses, the size of the investigated area is many times larger (square km) compared to the diver observations, which record species within an area of only approximately 25 m<sup>2</sup>. While

eDNA provided more species overall, the average number of species at each reef site was surprisingly similar to the diver-based approach. However, there was a geographical difference with eDNA detecting less species at the northern sites (1–4) and more species at the southern sites compared to diver observation. The northern sites typically have a stronger stratification due to higher influence from the high saline inflow combined with generally greater water depth. At the southern sites with likely more mixing, the species identified by eDNA water samples, might originate from a larger and less restricted area leading to “overestimation” of the local species richness. A recent study of fish composition using metabarcoding, however, found that even in systems with strong vertical stratification, eDNA derived species composition, did not vary much between surface and bottom samples (Stoeckle et al., 2021), suggesting that mixing conditions may be less of an issue for fish. Also, looking carefully at changes in the species composition at the nine reef areas, the eDNA method has a larger renewal of species between sites compared to the diver-based method, which is more homogeneous across reefs. This interpretation stems from the fact that although two methods provided quite similar levels of species richness, the eDNA method identified many more species. Also, the rank abundance curves for the two methods are quite different. At ranks above ca. 50 there are several species identified by the eDNA technique which have very low relative abundance. This suggests a larger replacement of species compared to the diver-based method. In addition, most variation in species between reefs detected by eDNA are within the group of infaunal species not detectable by the diver-based approach. Comparing rank abundance curves, we likewise found a more even distribution of species with the diver method. This suggests that while divers may overlook some rare species, they overall manage to account for a comparable number of species across the investigated reef sites. In comparison, the eDNA method picked up more fish and infaunal species, and seemed to detect more

**TABLE 3 |** Average number of species identified with eDNA for samples collected downstream (DS), above the reef (Reef) and upstream (US) of the nine reef sites and their distribution between four different habitats.

Habitat	DS	Reef	US
Mixed bottom	11	12	11
Pelagic	2	1	1
Hard bottom	17	20	18
Soft bottom	13	13	13
Total	43	46	43



rare species, but failed to detect some of the larger key species, especially within the group of macroalgae.

Remarkably, the eDNA method only detected 16 out of 94 (13%) species of macroalgae observed through diver-based sampling. At the genus level the eDNA approach detected 22 out of 81 (22%). Missing a target group in eDNA metabarcoding could be due to its absence in the reference database or low taxonomic resolution here; low affinity of the metabarcoding primers, or lack of DNA in the water sample from low release rate from the target organisms (Guillera-Arroita et al., 2017). Checking of the reference databases revealed that most of the missing macroalgal species are present in the 18S-PR2 and COI-BOLD databases. As recently shown, other 18S markers are only able to identify brown algae to order or family level (Ørberg et al., 2021). The COI-marker has also been used

for the DNA barcoding of both brown and red algae with specific primers developed for these groups (Bartolo et al., 2020). Therefore, it is likely that the universal invertebrate COI primers, used in this study, misses the macroalgae due to a low affinity. At present there are no standard barcoding primers known to cover the whole macroalgal diversity (Bartolo et al., 2020), and the important lesson learned from this study is new protocols are required to catch this important organism group. Application of statistical models, such as occupancy models, should also be considered in preparation of future comparisons of visual and eDNA methods. Experiences show that application of occupancy models help assess the performance of used methods, reduce the risk of false detections (Ficetola et al., 2015), and improve ecological inference (McClenaghan et al., 2020).

**TABLE 4** | PERMANOVA table of the significance of reefs site and location [downstream (DS), above-reef (Reef), and upstream (US)] for the variation in community structure in eDNA samples.

Source	df	SS	MS	Pseudo-F	P(perm)	Unique perms
Reef (sites)	8	47592	5949	2.713	0.0001	9827
Replicates	1	1226.9	1226.9	1.0312	0.4257	9919
Location (Reef, US, DS)	18	39470	2192.8	1.8431	0.0001	9649
Residual	26	30933	1189.7			
Total	53	1.19 E++05				

## Origin of Environmental DNA Sampled

Considering the differences between upstream, above-reef, and downstream sampling sites, our results indicated slightly higher number of species physically close to the reefs, as expected. However, differences in species richness were not significant, as the number of infaunal and fish species were similar among sites and because eDNA failed to detect the majority of macroalgal species, which dominated the reef locations (see **Figure 5B**). As boulder reefs consist of aggregations of stones of varying sizes laying on a bed of sandy sediment or clay, there will be a high number of soft bottom infaunal species within the boulder reefs themselves (see **Figure 1**). Furthermore, there was a water current of between 0.1 and 1.5 knots during the time of sampling. With the down- and upstream areas placed on average 2.6 km away from the central part of the reef area, it would approximately take less than 3 h for upstream water masses to move over the reef to the downstream site. Another factor which influences the exchange of water masses and thus DNA between upstream, above-reef and downstream sampling locations, is the sampled water depth. Due to the influence of salt water intrusion from the North Sea and outflow of less saline water from the Baltic Sea, many of the reefs have a top which is located strictly in water mass above the halocline during summer. As up- and downstream sites were sampled at greater depth, exchange of DNA between these water masses across the halocline is highly unlikely, albeit this has been observed in fish surveys (Stoeckle et al., 2021). Furthermore, in areas where exchange of water masses with remote DNA do occur, the concentration will be strongly affected by dilution from currents and degradation. Studies have shown that eDNA degrades exponentially over time in sea water, with rates reported between 10 and 50% per hour for fish (Saito and Doi, 2021). These factors suggest, that while eDNA from up- and downstream areas may influence the eDNA sampled above a reef (**Figure 1**), the majority of eDNA measured within a reef area would likely be of local origin. While species richness was similar among upstream – above-reef - downstream locations, the PERMANOVA analysis indicated significant differences in the composition of species. Although we expected species richness to be higher above-reef, eDNA detection suggested that approximately the same number of species were found around the reefs. But according to the PERMANOVA analysis the composition of the communities varied locally around the reefs.

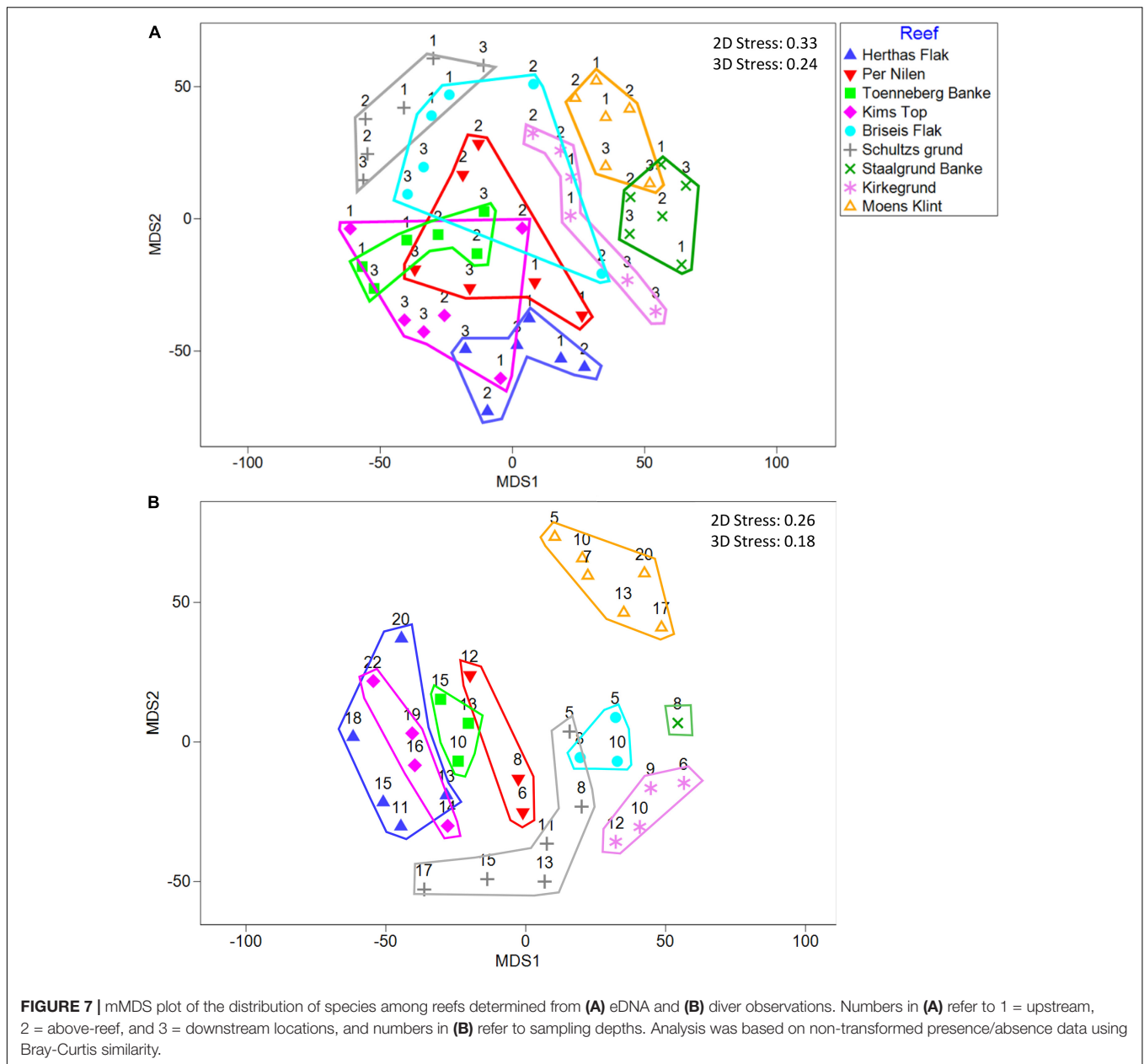
Thus, while water movement between adjacent areas around a reef may efficiently transport DNA material, there were still sufficiently large differences in the eDNA footprint among the local locations to distinguish these.

## Importance of Environmental Conditions

It is known that higher water temperatures accelerate DNA degradation (Akihida et al., 2020), thus reducing the potential geographical donor area contributing to the DNA sampled at a given site. We observed a significant reduction in species richness with increasing temperature, indicating a direct effect of temperature on eDNA fate. This supports previous findings that the eDNA methodology to obtain species is sensitive toward a range of environmental conditions (Barnes and Turner, 2016). There was, however, also a significant negative correlation between species richness, determined by divers and water temperature. This suggests that the temperature effect was not causal, but inferred from a significant covariation with other governing conditions, such as salinity, which is known to affect species richness in benthic communities of Danish waters (Middelboe et al., 1997; Josefson and Hansen, 2004). In support of this expectations, both the eDNA and diver-based method indicated a significant salinity dependency, with lowest species richness in the less saline and warmer waters in the south eastern waters. The observed correlations between eDNA derived species richness, temperature and salinity are therefore likely caused by a combination of direct physical effects and a range of ecological factors including seasonal affinity to prevailing environmental conditions by the species (see **Figure 1**). In addition, the multivariate analysis showed that community structure was significantly related to gradients in distance, salinity, and water temperature, underlying the importance of these conditions for observed patterns in species composition and species richness associated with boulder reef structures. Also, differences in temperature and salinity conditions around the reefs resulting from different sampling depths, suggests that differences in eDNA sampled were affected by the level of water column mixing within each of the nine reef sites.

## Patterns in Regional Community Structure

Multivariate analysis of eDNA and diver-based observations, both showed that the nine reefs, differed significantly in community structure. The mMDS ordination plots were associated with high uncertainty (high stress values) indicating large variations in the species composition among samples from the same reef. This is to be expected when comparing data from sites spanning large gradients in several environmental conditions, in particular since the within site variability in conditions (i.e., light, temperature, salinity, and substrate conditions) framing the benthic communities vary substantially. Nevertheless, a significant match was found between the overall community structure detected by the eDNA and diver-based method. Thus, while the methods emphasize different aspects of the benthic communities, with eDNA method biased toward faunal species, and diver-based method focusing on macroalgae,



the detected patterns in community structure suggest that the methods provide complimentary information. Lack of replication for the diver-based method precluded us from a rigorous statistical testing of differences between reefs sites. This was possible and a clear advantage with the eDNA method, which in agreement with our expectations, showed that the nine investigated reef sites differed significantly in their community structure.

## CONCLUSION

Environmental DNA added substantially to the diver-based observations of benthic species composition, especially within

infauna and fish which are difficult to detect as a diver. While insignificant differences in species richness between downstream, above-reef and upstream locations suggest that the local imprint of boulder reefs is rather weak, analysis of species community structure showed a significant effect of sample location indicating a boulder-specific imprint in the region, although smaller than anticipated. While the eDNA technique currently misses many of the macroalgal species, eDNA sampling within a reef can be a useful supplement to diver-based observations, providing a much more detailed account of many faunal species, not accessible to the diver-based methodology. To reduce the influence of eDNA signals from species outside the reefs, it is important to sample water from different sites around the reefs, and to collect environmental data such as water temperature, salinity,

current speed, and direction to characterize and discriminate water masses. This will also be useful to assess the importance of physical (dilution) and biochemical (degradation) processes that may affect eDNA signals at the study site.

## DATA AVAILABILITY STATEMENT

The datasets presented in this study can be found in online repositories. The names of the repository/repositories and accession number(s) can be found below: European Nucleotide Archive (accession: PRJEB48452).

## AUTHOR CONTRIBUTIONS

PS designed the study, contributed to eDNA and diver-based data collection, and wrote the manuscript and was responsible for analyzing data and producing figures and tables. MP designed the metabarcoding experiment, supervised the laboratory work, and contributed to the discussion of results. MO performed the bioinformatical analysis and contributed to write the manuscript. HB identified species from stone samples collected by the divers and performed quality assessment of the diver-based observations. RS contributed to the statistical and bioinformatical analysis and in the manuscript writing. AW contributed to the writing of the manuscript. KD organized the field sampling trip and contributed to diver-based assessment and helped write the manuscript. PSu designed and planned the eDNA study and associated research questions, and contributed manuscript writing. CG helped obtain environmental data, produce maps and contributed to manuscript writing. All the authors contributed to the article and approved the submitted version.

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## SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/fmars.2021.800474/full#supplementary-material>

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