eDNA metabarcoding as a biomonitoring tool for marine protected areas

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#### Abstract

Monitoring of marine protected areas (MPAs) is critical for marine ecosystem management, yet current protocols rely on SCUBA-based visual surveys that are costly and time consuming, limiting their scope and effectiveness. Environmental DNA (eDNA) metabarcoding is a promising alternative for marine ecosystem monitoring, but more direct comparisons to visual surveys are needed to understand the strengths and limitations of each approach. This study compares fish communities inside and outside the Scorpion State Marine Reserve off Santa Cruz Island, CA using eDNA metabarcoding and underwater visual census surveys. Results from eDNA captured 76\% (19/25) of fish species and $95 \%$ (19/20) of fish genera observed during pairwise underwater visual census. Species missed by eDNA were due to the inability of MiFish $12 S$ barcodes to differentiate species of rockfishes (Sebastes, $\mathrm{n}=4$ ) or low site occupancy rates of crevicedwelling Lythrypnus gobies. However, eDNA detected an additional 30 fish species not recorded in paired visual surveys, but previously reported from prior visual surveys, highlighting the sensitivity of eDNA. Significant variation in eDNA signatures by location (50m) and site $(\sim 1000 \mathrm{~m})$ demonstrates the sensitivity of eDNA to address key questions such as community composition inside and outside MPAs. Interestingly, eDNA results recorded higher species richness outside the MPA while visual surveys observed the opposite pattern. This result is likely caused by swamping effects of high fish abundance in MPAs that reduce detection probabilities of pelagic and intertidal taxa. Results demonstrate the utility of eDNA metabarcoding for monitoring marine ecosystems, providing an important complementary tool to visual methods.


Keywords: biomonitoring; Channel Islands National Park; eDNA; environmental DNA; marine protected areas; MPAs.

## Introduction

Marine Protected Areas (MPAs) promote sustainability of marine ecosystems and the ecological goods and services they provide (1). However, ensuring MPA effectiveness requires regular monitoring to document that ecosystem health is stable or improving (1). MPA monitoring also provides an essential opportunity to assess the impact of management practices, allowing resource managers to adjust management plans as required (2).

Current MPA monitoring protocols typically assess the diversity and abundance of fish and benthic invertebrates, as well as community trophic structure (3). Much of this assessment is based on underwater visual census surveys conducted on SCUBA (3), which are costly, and time and labor intensive (3). For example, to survey 33 sites within the Channel Islands National Park once per year, the National Park Service Kelp Forest Monitoring Program spends over $\$ 395,000$ on $\sim 1,000$ hours of dive time, $\sim 1,400$ hours of data entry to survey 33 sites within the Channel Islands National Park once per year (J. Sprague per obs., 2020). Furthermore, SCUBA-based surveys are constrained by weather, diving conditions, and personnel (J. Sprague per. obs., 2020), and can require extended and repeated dives to accurately document marine communities that place divers at risk for dive-related injuries. SCUBA surveys can also introduce significant observer bias, as fish react differently to divers, particularly inside and outside of MPAs, potentially impacting survey results (5).

Given the above logistical and methodological constraints, MPA monitoring efforts are largely limited o shallow depths (e.g. $<30 \mathrm{~m}$ ) and the most economically or ecologically important taxa as proxies for ecosystem health (6). Moreover, examining a predetermined subset of community diversity potentially excludes crucial functional groups, biasing ecosystem assessment (7). Combined, these issues restrict the scope, scale, and frequency of visual surveys, limiting the utility of SCUBA-based MPA surveys to quantify biodiversity and trophic structure, (3), data essential for assessing MPA effectiveness.

One promising new approach for assessing and monitoring marine ecosystems is environmental DNA, or "eDNA", a technique based on isolation and sequencing of freely associated DNA from soil or water samples (8). Through metabarcoding and highthroughput next generation sequencing, eDNA can broadly survey community biodiversity in a rapid, repeatable, and affordable manner (8). As such, eDNA is ideally suited to intensive biodiversity monitoring programs, such as those required for MPAs (9).
eDNA has some key advantages over traditional SCUBA-based survey methods. First, eDNA can capture a wide diversity of marine vertebrate taxa, frequently detecting more species than traditional fish survey methods (10). Second, eDNA detects rare and cryptic species that are frequently overlooked or ignored in traditional survey methods $(11,12)$, including both endangered and invasive species (8). Third, eDNA collection is relatively simple, requiring only small volumes of seawater ( $<3 \mathrm{~L}$ ) and simple filtering techniques, allowing sampling by individuals with limited training, even in remote locations (Miya et al., 2016). Forth, because eDNA doesn't require diving, there are significant worker safety advantages. Lastly, eDNA is affordable (e.g. $\sim \$ 50 /$ sample) and has the potential for automation, allowing for remote sample collection and high throughput autonomous lab processing (14).

Despite these advantages, eDNA also has limitations. Of particular concern is PCR bias that can result in preferential amplification of particular taxa (15). Additionally, detection probabilities can be influenced by species specific eDNA generation and degradation rates (8), an issue potentially further complicated by the transport of eDNA on ocean currents (16). Furthermore, primer design, bioinformatic, and reference database limitations can also affect the accuracy of taxonomic assignment from eDNA (17).

Unlike well-established visual surveys, the impact of biases in eDNA metabarcoding are not well characterized, and may be less problematic than believed. For example recent studies show that impacts of PCR bias can be mitigated by technical replicates and site
occupancy modelling (17-19). Similarly, because eDNA signals decay relatively rapidly (e.g. hours to days; $(20,21)$, eDNA signatures are surprisingly stable (22). As such, eDNA holds tremendous promise for monitoring marine ecosystems. Realizing that promise, however, requires a better understanding of how visual surveys and eDNA metabarcoding approaches compare in direct field applications.

The Channel Islands MPA Network spans $>1000$ reefs across 8 islands of the coast of Southern California. It is monitored by several programs including the Kelp Forest Monitoring Program, which conducts visual monitoring surveys of 41 invertebrates and over 100 fishes (23). In total only 94 of the $>1000$ Channel Island reefs are surveyed, and just once per year (6), missing the seasonal dynamics in the variable Southern California Bight, limiting the scope and scale of assessment (2). While born of logistical necessity, the spatial and temporal limits of this survey protocol makes accurately assessing the health of this MPA network difficult $(2,24)$ and suggests the need for new approaches that produce data on broader taxonomic, spatial and temporal scales.

This study tests the efficacy of eDNA for MPA monitoring and to better understand the advantages and shortcomings of eDNA methods. We do this through a side-by-side comparisons of eDNA metabarcoding and visual surveys of fish communities conducted by the National Parks Service.

## Materials and Methods

## Sample Collection

We conducted our study at Scorpion State Marine Reserve within the Channel Islands National Park and National Marine Sanctuary. To determine the degree to which eDNA could capture documented differences inside and outside this MPA, we sampled three sites:

1) inside the MPA, 2) outside but adjacent ( $<0.5 \mathrm{~km}$ ) to the MPA ("edge site"), and 3) 2.3 km outside the MPA boundary ("outside site"; Figure 1). At each of these three sites, we sampled
directly along a 100 m fixed transect used by the Kelp Forest Monitoring Program for visual monitoring, using a GPS to ensure transects overlapped (23). We collected three replicate 1L water samples from three locations on each transect, totaling 9 spatially structured replicates per site. Due to fieldwork logistical challenges, each site was sampled on a different day with a maximum of 72 hours between sampling events.

Figure 1. Map of Scorpion State Marine Reserve off Santa Cruz Island, CA, USA.

We collected seawater samples from 10 m below the surface and 1 m above the benthos using a 4 L Niskin bottle deployed from the UCLA RV Kodiak (25). From each Niskin deployment, we transferred a single liter of seawater to an enteral feeding pouch and conducted gravity filtration through a sterile $0.22 \mu \mathrm{~m}$ Sterivex cartridge (MilliporeSigma, Burlington, MA, USA) in the field (Miya et al., 2016). Additionally, we processed three field blanks as a negative control that consisted of 1 L of distilled water following the method above. Finally, we dried Sterivex filters using a 3 mL syringe and then capped and stored the filters at $-20^{\circ} \mathrm{C}$ for DNA laboratory work back at UCLA (Miya et al., 2015).

## DNA Extraction and Library Preparation

We extracted eDNA from the Sterivex cartridge using the DNAeasy Tissue and Blood Kit (Qiagen Inc., Germantown, MD) following modifications of Spens et al. (2017). We PCR amplified the extracted eDNA using the MiFish Universal Teleost $12 S$ primer (Miya et al., 2015) with Nextera modifications following PCR and the library preparation methods of Curd et al. (2019) (See supplemental methods). All PCRs included a negative control where molecular grade water replaced the DNA extraction. For positive controls, we used DNA extractions of grass carp (Ctenopharyngodon idella, Cyprinidae) and Atlantic salmon (Salmo salar, Salmonidae), both non-native to California. Libraries were sequenced on a MiSeq PE $2 \times 300 \mathrm{bp}$ at the Technology Center for Genomics \& Bioinformatics (University of CaliforniaLos Angeles, CA, USA), using Reagent Kit V3 with 20\% PhiX added to all sequencing runs.

## Bioinformatics

To determine community composition, we used the Anacapa Toolkit to conduct quality control, amplicon sequence variant (ASV) parsing, and taxonomic assignment using usergenerated custom reference databases (28). We processed sequences using the default parameters and assigned taxonomy using two reference databases. We first assigned taxonomy using the FishCARD California fish specific reference database (Gold 2020).

Second, we used the $C R U X$-generated $12 S$ reference database supplemented with FishCARD reference sequences to assign taxonomy using all available $12 S$ reference barcodes to identify any non-fish taxa.

Raw ASV community table was decontaminated following Kelly et al. (2018) and McKnight et al. (2019) (See supplemental methods). We then transformed all read counts into an eDNA index for beta-diversity statistics (15). All non-fish species (mammals and birds) were removed prior to final analyses.

## eDNA Data Analysis

To test for alpha diversity differences, total species richness for each site was then compared, using an Analysis of Variance (ANOVA) and subsequent Levine's test for homogeneity of dispersions (31).

To determine whether our eDNA sampling design was sufficient to fully capture fish community diversity, we created species rarefaction curves using the iNext package (32). Species coverage estimates were then compared between each site, with and without site occupancy modeling, and using all three 1 L replicates taken at three locations along a 100 m transect $(\mathrm{n}=9)$ as well as only three 1 L biological replicates $(\mathrm{n}=3)$. We ran a piecewise regression analysis to identify breakpoints in the rate of species diversity found per sample collected using the $R$ packaged segmented (33).

To test for differences among fish communities, we calculated Bray-Curtis similarity distances on the eDNA index scores between all samples (22). Specifically, we tested for the
difference in community similarity variance between our three sites using an adonis PEMANOVA (31), followed by a companion multivariate homogeneity of group dispersions test (BETADISPER) (31). Both the PERMANOVA and BETADISPER were run using the following model: eDNA Index $\sim$ Site + Location. We also visualized community beta diversity using non-metric multidimensional scaling (NMDS) (31). To further investigate which species were driving eDNA community differences among sites, we conducted constrained analysis of principle components (CAP) (31).

## Visual Underwater Census Methods

To assess fish communities using underwater visual census techniques, SCUBA divers from the Kelp Forest Monitoring Program followed standard survey protocols following Kushner et al. (2013). These protocols include survey types: visual fish transects, roving diver fish counts, and 1 m quadrats. The visual fish transects targeted 13 indicator species of fish on visual fish transects recording the counts of adults and juveniles. This protocol consists of performing $2 \mathrm{~m} \times 3 \mathrm{~m} \times 50 \mathrm{~m}$ transects along the 100 m permanent transect. During roving diver fish count surveys all positively identified species are recorded. This protocol consists of 3-6 divers counting all fish species observed during a 30 minute time period, covering as much of the $2000 \mathrm{~m}^{2}$ of bottom and entire water column as possible. The $1 \mathrm{~m}^{2}$ quadrat records three small demersal species of fish. All visual surveys occurred along a permanent 100 m transect at each site and were conducted within 2 weeks of eDNA sampling (See supplemental methods).

## Comparison of eDNA and Visual Underwater Census Methods

We compared species detected by eDNA and underwater visual census approaches across corresponding transects at each site. We identified core taxa that were shared across all sites for a given method. In addition, we identified species that eDNA methods failed to detect but
were observed in visual census surveys and vice versa. We note that given the few numbers of sites $(\mathrm{n}=3)$ we were unable to robustly compare abundance estimates between methods.

## Results

## eDNA Results

We generated over 4 million reads that passed quality control. The Anacapa Toolkit identified 2,906 ASVs from 3,091,063 reads representing 27 samples and 8 controls. After the second decontamination step, however, totals reduced to 931 ASVs and 2.35 million reads (Tables S1-S3).

Combined, eDNA metabarcoding successfully detected 54 fish taxa, representing 50 unique species, 48 genera, 34 families, and two classes (Tables S1-S3). eDNA detected 35 species within the MPA, 34 at the edge, and 42 species outside the MPA. The three sites shared a core group of 26 taxa including bony fish and one species of ray (Figure 2) (Table $\mathrm{S} 4)$. Of these taxa, 15 species are associated with rocky reef habitat, five species are associated with sandy bottom habitat, four species are pelagic-neritic, and two species are pelagic-oceanic.

Figure 2. Venn Diagram of Fish Species Detected with eDNA

Species rarefaction curves showed that sampling at each site ( $n=9$ ) was insufficient to capture all species diversity (Figure 3). Sample coverage estimates from eDNA results before filtering by site occupancy modeling filters were $94.0 \%, 88.0 \%$, and $92.9 \%$ for the MPA, edge, and outside sites, respectively. Coverage estimates dropped to $81.0 \%, 80.0 \%$, $83.6 \%$ for the MPA, edge, and outside sites, respectively, when only three 1 L samples were used. Piecewise regression analysis showed a transition from exponential to linear increase in species detected per replicate between three and four replicate water samples per site (3.36-3.53) with subsequent diminishing sample coverage returns with the addition of more
samples. In contrast, species diversity was near saturated (>99.0\%) when applying a site occupancy rate above $75 \%$ and using three 1 L replicates taken at three locations along a 100 m transect. However, using only three samples, sample coverage dropped to $87.1 \%$, $90.3 \%, 88.9 \%$ for the MPA, edge, and outside sites, respectively.

Figure 3. Species Rarefaction Curves. a) Species rarefaction curves for all fishes found at each site across 3 1L replicates taken at 3 locations along a 100m transect. b) Species rarefaction curves for fish species with occupancy rates above $75 \%$ found at each site across 3 1L replicates taken at 3 locations along a 100m transect. Sample coverage estimates were higher for species with occupancy rates above $75 \%$ ( $100 \%$ ) than for all species ( $85.8 \%-93.1 \%$ ). For species with occupancy rates above $75 \%$ sample coverage estimates ranged from 89.3-91.1\% for only 31 L replicates.

Analyses showed a significant difference in the total number of observed species across sites, with the site outside the MPA having significantly higher diversity than both the edge and MPA sites (ANOVA, $\mathrm{p}<0.001$, Levine's test $\mathrm{p}>0.5$ ). Observed species differences between sites were partially driven by the presence of non-rocky reef taxa $(46.4 \%, 13 / 28)$, primarily pelagic, mobile, sandy bottom, and intertidal species. Moreover, there were also significant differences in fish communities among the three sites as well as among the three sampling locations along each of the three transects (PERMANOVA $\mathrm{p}<0.001$, betadisper $\mathrm{p}>0.05$ ). Location along the transect explained $26.4 \%$ of the total variance while site (e.g. inside, edge and outside MPA) explained $19.0 \%$ of the total variance; $54.5 \%$ of the total variance was unexplained.

NMDS ordination showed weak clustering of samples by both location and site (NMDS, Stress 0.20; Figure 4). Constrained analysis of principle components (CAP) found significant differences in species assemblages between samples collected at different sites and locations (CAP, $\mathrm{p}<0.001$ ) (Figure 5), further indicating difference in eDNA signatures
across sites and locations. CAP analysis identified seven taxa with the strongest differences between sites. The MPA site had higher eDNA index scores of kelp perch (Brachyistius frenatus, Embiotocidae), sarcastic fringehead (Neoclinus blanchardi, Chaenopsidae), and spotted cusk-eel (Chilara taylori, Ophidiidae). The edge site had higher index scores of roughback sculpin (Chitonotus pugetensis, Cottidae). The site outside the MPA had higher index scores of yellowtail amberjack (Seriola lalandi, Carangidae), sand bass sp. (Paralabrax spp., Serranidae), and dog-faced witch eel (Facciolella gilberti, Nettastomatidae).

Figure 4. NMDS of Bray-Curtis Dissimilarities. Bray-Curtis dissimilarities were calculated between all samples using only species with occupancy rates over $75 \%$. Samples from Sites (colors) and locations (shapes) are similar to each other (NMDS, Stress $=0.20$ )

Figure 5. Constrained Analysis of Principle Components (CAP) Ordination. BrayCurtis dissimilarities were calculated between all samples using only species with occupancy rates over $75 \%$. Samples from sites and locations within sites were used as independent variables. Site and locations within sites are significantly more similar to each other (CAP, $\mathrm{p}<0.001$ ). Sites (shapes) and Locations (colors) are plotted against CAP1 and CAP2 axes. Arrows correspond to direction and strength (length) of each species. Only the top 7 species with CAP distances greater than 0.35 were plotted.

Across all three sites, 25 bony fish species were recorded using underwater visual censuses, representing 20 genera, 13 families, and one class (Figure 6) (Table S5), 11 of which were shared across all three sites (Table S6). Within the MPA site, visual census methods detected 21 unique species, 18 genera, and 11 families. At the edge site visual census methods detected 18 species, 16 genera, 11 families, and four classes. Lastly, at the outside site visual census methods detected 13 species, 13 genera, 10 families, and four classes. Of all taxa observed in visual census methods, 24 species were associated with rocky reef habitat and one species was pelagic-neritic. The pelagic-neritic species, top smelt (Atherinops affinis, Atherinopsidae), was only found in the MPA site.

On average, roving diver fish counts recorded 17.6 species per replicate survey (Range: 10-22). Visual fish counts recorded an average 7.8 species per replicate survey out of the 13 indicator species (Range: 5-10). 1m quadrats recorded an average 2.3 species of 3 target species (Range: 1-3).

Figure 6. Venn Diagram of Species Observed from Visual SCUBA Surveys.

## Comparison of eDNA and Visual Census Surveys

eDNA detected $76 \%$ (19 out of 25) of species observed during all combined National Park Service transect surveys (Table S5-S6). eDNA failed to resolve Lythrypnus dalli (Gobiidae), L. zebra, Sebastes atrovirens (Sebastidae), S. auriculatus, S. chrysomelas, and S. serranoides to species level. At the genus level, eDNA performed markedly better recovering $95 \%$ (19 out of 20) of genera observed during under water censuses. The remaining genus Lythrypnus was detected prior to site occupancy modeling, but occurred in only one replicate at two separate sites.

In addition to the above, eDNA recovered 31 species that were not recorded during the visual censuses conducted by the National Park Service. Of these, 30 were California fish
species previously recorded in Kelp Forest Monitoring Program surveys (Table S7), but not observed during our paired surveys. In addition, eDNA detected the California native dogfaced witch eel (Facciolella gilberti, Nettastomatidae) that had not previously been observed by the Kelp Forest Monitoring Program.

There were few conspicuous differences in species observed across sites, with visual census results identifying 11 common taxa across all sites (Table S6). Of these, 10 were also found to be common across all sites using eDNA methods with one species (Lythrypnus dalli) not detected by eDNA. Species richness from visual census data showed that fish diversity was highest within MPA $(\mathrm{n}=21)$, lowest outside the MPA $(\mathrm{n}=13)$ and intermediate $(\mathrm{n}=18)$ on the edge of the MPA, while eDNA had the opposite pattern.

## Discussion

Results demonstrate the power of for detecting a broad range of fish biodiversity in California kelp forest ecosystems, providing more detailed species inventories needed for marine ecosystem monitoring (9). eDNA was able to detect significant differences in fish communities inside, on the edge of, and outside of the Scorpion State Marine Reserve, even though the closest sites were no more than 500 m apart. Even within each of these sampling sites, eDNA distinguished among sample locations separated by only 50 m , highlighting the sensitivity of eDNA in capturing local fish communities, and matching previous studies showing fine-scale spatial resolution of eDNA signatures (12).

Importantly, eDNA captured 76\% of fish diversity observed during visual surveys, despite species rarefaction indicating insufficient sampling. In total, eDNA only failed to identify six of 25 fish species observed during visual surveys, four of these being rockfish (Sebastes, Sebastidae), a taxon that $12 S$ barcoding cannot distinguish to species (29). This small deficiency was offset by detecting an 30 additional fish taxa not recorded during paired Kelp Forest Monitoring Program visual monitoring, representing an important
advantage of eDNA. Because sampling can be obtained easily and processed economically, eDNA could allow for more frequent monitoring, expanding the scope of MPA monitoring programs while providing greater personnel safety.

## The utility of eDNA for MPA monitoring

Despite the limited sampling design and the inability of our $12 S$ barcode to distinguish species of rockfish and gobies, eDNA largely recovered the same taxa observed in visual census surveys. This strong concordance likely stems from high eDNA detection probabilities lasting only a few hours (20), such that eDNA captures marine communities that were recently present (21). The similarity of eDNA and visual surveys is even more remarkable given that eDNA and visual surveys were taken two weeks apart, a result that strongly suggests that fish diversity captured by eDNA is truly representative of fish communities and their differences inside and outside the Scorpion State Marine Reserve (22).

In addition, eDNA recorded an addition 30 species not recorded from visual surveys, but have been previously reported in other Kelp Forest Monitoring Program surveys (Table S7). Importantly, these taxa included species of significant management concern such as endangered giant black seabass (Stereolepis gigas, Polyprionidae) and important commercial targets like yellowtail amberjack (Seriola lalandi, Carangidae). Additionally, although we focused on teleost fishes, our eDNA data included elasmobranchs, marine mammals, and marine birds, taxa that play important roles in nearshore rocky reef ecosystems, but that can be difficult to survey and monitor (9). The expanded taxonomic coverage and the ability to detect rare, or hard to observe taxa is a significant advantage of eDNA over traditional visual surveys, expanding the scope of MPA monitoring by capturing entire communities rather than a selected subset of taxa.

Key to MPA monitoring is the ability to distinguish among communities inside and outside of the MPA. Not only did eDNA detect significant differences inside and outside the

MPA, it could also differentiate among samples taken 50 m apart. This result adds to a growing literature that shows the fate and transport of eDNA in marine environments is relatively limited in space and time $(20,34,35)$, and highlights the suitability of eDNA for comparing inside and outside of even relatively small MPAs (12).

While eDNA found significant differences inside and outside of the MPA and provided data on more taxa than visual survey methods, it did it for a fraction of the cost and effort. Roving fish diver counts, the most similar visual survey to eDNA monitoring methods, costs the Kelp Forest Monitoring Program $\sim \$ 1,200$ per site (Table S8). In contrast, the eDNA sampling design employed in this study including materials, labor, and transportation was ~\$600 per site (Table S9)—and $25 \%$ of this total was just transportation. Moreover, total costs could have been significantly reduced by sampling in one day, which was not possible due to vessel logistics. Further cost efficiencies can come from automating lab methods and conducting sequencing in house (8).

In addition to the above, eDNA has other significant advantages. It can potentially detect invasive species, even when rare (8). Sequence data from eDNA provides an annual snapshot of standing genetic diversity, providing the ability to monitor changes over time (9). Similarly, in species with population structure, eDNA could provide evidence of range shifts associated with climate change (36). Importantly, given eDNA metabarcoding samples can be preserved and archived, eDNA samples can be reanalyzed in the future with improved metabarcoding methods to answer additional hypotheses and environmental monitoring goals (8). Combined, the above advantages of eDNA suggest that even if eDNA metabarcoding is not viewed as a full replacement for visual surveys, the power of this method, and it's ease of sampling and affordability argue for using eDNA as a critically important complementary tool to greatly expand current monitoring activities.

Limitations and Caveats of eDNA

Although this and other studies highlight the promise of eDNA for monitoring marine ecosystems, there are also important limitations. One key limitation is the lack of universal barcode loci. Four of the six undetected species in this study were rockfish in the genus Sebastes. While the MiFish $12 S$ metabarcoding primers have broad utility in vertebrates, rockfishes are a recent adaptive radiation (37) with a highly conserved 12 S sequence, resulting in the inability to distinguish among rockfish ASVs. Identifying rockfish to species using eDNA approaches is critical for MPA monitoring efforts in California as Sebastes are important for commercial and recreational fisheries (38) and play a wide array of functional and ecological roles in nearshore ecosystems (37).

In addition, eDNA failed to detect two gobies, Lythrypnus dalli and L. zebra (Gobiidae). Previous efforts to barcode L. dalli for the FishCARD reference database found two insertions not found in any other California goby, including the sister species L. zebra (29). Thus, primer mismatch may have limited the amplification and detection of some $L$. dalli in our eDNA samples. Alternatively, the eDNA methods employed here may not be suited for small, crevice-dwelling fish species such as gobies. Species of Lythrypnus rarely leave the reef boundary layer (39). As such their eDNA maybe entrained close to the reef, resulting in hyper-spatial variability of eDNA signatures (12). More work is necessary to determine whether eDNA can reliably detect species living in interstitial reef habitat. This limitation, however, is not unique to eDNA as the Kelp Forest Monitoring Program employs $1 \mathrm{~m}^{2}$ quadrat surveys, specifically designed to capture these taxa. Likewise eDNA surveys that specifically sample within the boundary layer may be needed to survey benthic cryptic species.

Another limitation of eDNA is standardizing processing techniques, including the spatial design of field sampling, number of replicates, and sequencing depth $(8,15,19)$. The three replicate water samples taken from a single location and time recovered only $81.5 \%$ of the species present based on modeled species coverage estimates of species with at least
$75 \%$ occupancy. This value increased to near saturation ( $>99 \%$ ) by sampling three replicate water samples from three locations along a 100 m transect. That said, rarefaction curves indicated that additional sampling would have recovered additional species. These results provide important benchmarks for replication and sampling efficiency within nearshore marine environments and highlight the need to adjust sampling intensity and replicates, depending on the questions to be addressed with eDNA.

Despite not achieving saturation with our sampling design, we did observe a transition from exponential to linear addition of species detections with additional sampling similar to that previously demonstrated in mesocosm experiments (19). This shift likely reflects the biological reality of eDNA within marine ecosystems, with a few taxa being abundant and a long tail of low abundant species (15). As such, while only a few replicates are needed to capture local core species diversity, high technical (PCR) and biological (bottle) replication may be required to saturate species detection (19). Thus, if the goal is to detect rare species, it is imperative to increase sample number, an unsurprising result given the reality of detection probabilities of rare taxa (18). Despite this caveat and our relatively limited number of sample replicates, we still detected rare species such as giant black seabass (Stereolepis gigas, Polyprionidae) suggesting that eDNA is likely still superior to visual techniques at rare species detection (10).

## Importance of Site Occupancy Modelling

Site occupancy modeling showed that almost all species (48/50) with occupancy rates higher than $75 \%$ were common Southern California kelp forest species with the exception of the spotted cusk eel and dog-faced witch eel (40). In contrast, almost all pelagic and intertidal species that should not be present in a kelp forest had low occupancy rates and were detected only in a single bottle replicate (Tables S1-S2). These low occupancy detections cannot be contamination because they did not occur in field or laboratory
controls; instead, they likely represent eDNA transported between habitats (16). Regardless, site occupancy modeling removed the vast majority of unexpected kelp forest fishes, highlighting its value for determining true species detections in a rigorous and repeatable way $(18,19)$, aiding in the interpretation and comparison of eDNA results.

While site occupancy modelling removed non-kelp forest taxa (e.g. Blue whale; Balaenoptera musculus (Cetacea); California sea lion, Zalophus californianus (Otariidae); pelagic cormorant Urile pelagicus (Phalacrocoracidae); Table S10), it also removed some kelp forest species (e.g. zebra goby, L. dalli, Gobiidae; swell shark, Cephaloscyllium ventriosum, Scyliorhinidae; zebra-perch Hermosilla azurea, Embiotocidae; California angel shark, Squatina californica, Squatinidae). These results highlight the need for increased replication depending on the management question, just as it may require more visual surveys to observe numerically rarer taxa, such as sharks. Although the ability of eDNA to detect marine mammals and birds is useful, visual observations maybe more effective depending on the taxa, suggesting that complementary methods may yield the most effective sampling regime (41).

## Diversity inside and outside MPAs

Traditional visual surveys most often report higher biodiversity and biomass inside MPAs (42), including Scorpion State Marine Reserve (6). However, our results surprisingly indicate lower diversity inside the MPA. This paradoxical result is partially explained by the inability of eDNA to resolve Sebastes species that were visually observed inside ( $\mathrm{n}=3$ ) and on the edge of the MPA $(\mathrm{n}=1)$, but not outside. In addition, despite standardize sample concentration during pooling, sites outside the MPA had $\sim 50 \%$ more read depth. Increased read depth should increase species detection, although species rarefaction curves suggest that all samples had sufficient read depth to saturate species richness following site occupancy modelling (Figure S1).

Instead, a more likely explanation for this unexpected result is that low density of kelp forest fishes outside the MPA increased the detection of non-kelp forest taxa advected from elsewhere. In total, $46.4 \%$ of taxa detected outside the MPA were non-rocky reef species such as California angel shark (Squatina californica, Squatinidae), Chub mackerel (Scomber japonicus, Scombridae), and Ocean sunfish (Mola mola, Molidae). Although these species occasionally pass through nearshore rocky reef environments, a more likely explanation is that eDNA from these species were transported from nearby pelagic, intertidal, and sandy bottom ecosystems $(16,35)$. While such transport would be expected at all sites, high fish abundance inside the MPA would likely result in a strongly skewed ratio of endogenous kelp forest eDNA to exogenous pelagic eDNA (16), with the signal of kelp forest taxa dominating that of pelagic species.

This paradoxical pattern of species richness highlights that eDNA data must be interpreted with caution (43). Metabarcoding methods often perform unexpectedly when DNA concentrations are low, increasing the probability of sequencing rare species (8). Thus additional ecological metrics to species richness, ones that are more representative of ecological patterns and processes, are needed to optimally interpret eDNA results (15). These results ultimately highlight the value of ground truthing eDNA results with visual surveys in novel applications to ensure proper interpretation of results (41).

## Conclusion

Marine protected areas are indispensable tools for protecting marine ecosystems and effective monitoring is paramount to their success (1). Our results demonstrate that eDNA can distinguish fish assemblages inside and outside MPAs, and can detect other vertebrates, like marine mammals and birds, of special conservation concern.

Given its power, ease of sampling and relative affordability, eDNA could provide critical cost-added-benefits of repeated temporal or expanded spatial sampling of marine protected
areas. In particular, eDNA metabarcoding can overcome many of the current limitations of visual monitoring, increasing sampling frequency and expanding monitoring beyond a small subset of "important" focal taxa. Such expanded monitoring would improve our ability to understand the ecological processes, human impacts, and management strategies that affect marine community communities that MPAs are designed to protect.

However, important aspects of eDNA remain unresolved, notably determining abundance and biomass via eDNA (44). Given the mixed results on the efficacy of biomass estimates from eDNA in marine systems $(8,44)$, eDNA will not be viewed yet as a wholesale replacement for visual monitoring, but instead as a powerful complementary tool. There will always be value in the direct observation by divers in particular for informing size class distributions and sex ratios (24), but eDNA provides an important way to simultaneously make surveys more comprehensive and efficient. By replacing aspects of underwater visual surveys, eDNA could reduce the dive time per site, allowing more sites to be surveyed more frequently or improve overall biodiversity estimates. Additionally, whereas it takes 3 months for the Kelp Forest Monitoring Program to complete diver-based surveys, field collection of eDNA could be completed in a week, allowing for surveys to occur during short periods of good weather in the winter when full visual surveys would be impossible. As such, eDNA could greatly expand current monitoring activities across space, time, and depth, providing resource managers critical information on the response of MPAs to changing environments and management practices, and contributing greatly to marine sustainability.

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Data Availability: We intend to archive all data on the Dryad Digital Repository and a link will be provided upon acceptance.

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## Outside <br> Edge

Santa Cruz Island

Figure 1

## Outside

Edge

All Species


Species with Occupancy $>75 \%$


Figure 3


Figure 4


Figure 5


Outside

Figure 6

