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## ORIGINAL ARTICLE Size-fraction partitioning of community gene transcription and nitrogen metabolism in a marine oxygen minimum zone

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The genetic composition of marine microbial communities varies at the microscale between particleassociated (PA; > 1.6 µm) and free-living (FL; 0.2–1.6 µm) niches. It remains unclear, however, how metabolic activities differ between PA and FL fractions. We combined rate measurements with metatranscriptomics to quantify PA and FL microbial activity in the oxygen minimum zone (OMZ) of the Eastern Tropical North Pacific, focusing on dissimilatory processes of the nitrogen (N) cycle. Bacterial gene counts were 8- to 15-fold higher in the FL compared with the PA fraction. However, rates of all measured N cycle processes, excluding ammonia oxidation, declined significantly following particle (>1.6 µm) removal. Without particles, rates of nitrate reduction to nitrite  $(1.5-9.4 \text{ nmN d}^{-1})$  fell to zero and N<sub>2</sub> production by denitrification  $(0.5-1.7 \text{ nmN d}^{-1})$  and anammox (0.3-1.9 nMN d<sup>-1</sup>) declined by 53–85%. The proportional representation of major microbial taxa and N cycle gene transcripts in metatranscriptomes followed fraction-specific trends. Transcripts encoding nitrate reductase were uniform among PA and FL fractions, whereas anammox-associated transcripts were proportionately enriched up to 15-fold in the FL fraction. In contrast, transcripts encoding enzymes for  $N_2O$  and  $N_2$  production by denitrification were enriched up to 28-fold in PA samples. These patterns suggest that the majority of N cycle activity, excluding N<sub>2</sub>O and N<sub>2</sub> production by denitrification, is confined to a FL majority that is critically dependent on access to particles, likely as a source of organic carbon and inorganic N. Variable particle distributions may drive heterogeneity in N cycle activity and gene expression in OMZs.

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#### Introduction

The genetic diversity and activity of pelagic marine microorganisms vary in complex patterns in response to environmental conditions and interspecies interactions. Such variation is best understood at the scale of meters, for example, over depth gradients of light or over regional (kilometer) gradients in nutrient availability. Microbial communities are also structured over much smaller spatial scales, notably the micron-scale distances separating free-living (FL) cells from those on the surfaces or within the diffusive boundary layer of suspended or sinking organic particles (Stocker, 2012). Extensive research has identified consistent taxonomic compositional differences between FL and particleassociated (PA) bacterial and archaeal communities (DeLong et al., 1993; Hollibaugh et al., 2000; Ganesh

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et al., 2014), as well as differences in total microbial abundance, production and enzyme activity (Simon et al., 2002; Grossart et al., 2003, 2007). Surprisingly, most studies analyzing microbial genomic or metagenomic composition or rates of specific metabolic processes have either focused on microbes within a single biomass size fraction (typically the 0.2–3.0-µm range) or on bulk water samples. Such studies risk excluding important information about contributions from PA cells, larger non-PA cells or metabolic substrates in PA fractions. Furthermore, only a single study (Satinsky et al., 2014) has examined community gene expression (metatranscriptomes) in PA versus FL communities. When coupled to measurements of metabolic rates, size-fractionated metatranscriptomics can help identify the drivers, magnitudes and spatial scales of biogeochemistry in the oceans.

The extent to which microbial metabolisms are partitioned between PA and FL communities remains uncharacterized for many ocean regions of importance to global biogeochemical cycles. These include the marine oxygen minimum zones (OMZs) where microbial communities control key steps in nitrogen (N), carbon and sulfur transformations. OMZs form in poorly ventilated regions where microbial respiration

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fueled by high productivity in the overlying waters creates a layer of oxygen depletion. The largest OMZs occur in areas of persistent nutrient upwelling, as in the Eastern Tropical North Pacific (ETNP) off Mexico (Karstensen *et al.*, 2008). Encompassing ~  $12 \times 10^6$  km<sup>2</sup> of shelf and off-shelf waters south of Baja California, the ETNP OMZ is the largest of the major permanent OMZs (41% of total OMZ area; Paulmier and Ruiz, 2009), with dissolved O<sub>2</sub> concentrations falling below the detection limit (<0.1 µM) at mid-water depths (~150–750 m; Cline and Richards, 1974; Tiano *et al.*, 2014).

Oxygen drawdown in OMZs significantly restructures the pelagic ecosystem, resulting in microbedominated communities expressing diverse microaerophilic or anaerobic metabolisms. These include the reductive processes of denitrification and anaerobic ammonia oxidation with nitrite (anammox), whose combined activity in OMZs contribute up to half of oceanic N loss as N<sub>2</sub> or N<sub>2</sub>O gas (Codispoti et al., 2001; Gruber, 2004). Research in the eastern Pacific OMZs, notably in the anoxic OMZ off Chile and Peru, indicates that anammox and denitrification are linked to varying degrees with a diverse set of other microbial N transformations, including the production of nitrite and nitrate via nitrification along the oxycline and dissimilatory nitrate reduction to ammonium within the OMZ (Lam et al., 2009; Kalvelage *et al.*, 2013). OMZ N cycle processes also mediate key steps in other elemental cycles, for example, the fixation of carbon by anammox and nitrifying autotrophs, the remineralization of organic carbon and nutrients by denitrifying heterotrophs, and the oxidation of reduced sulfur compounds by chemoautotrophic denitrifiers (Ulloa et al., 2012).

The distributions of these networked metabolic interactions at multiple spatial scales are becoming understandable for some OMZs. Surveys combining marker gene counts and rate measurements have suggested mesoscale patterns in N cycling along coastal to offshore gradients in the Eastern Tropical South Pacific (ETSP) OMZ off Chile and Peru (Kalvelage *et al.*, 2013), as well as clear depthspecific variation in N cycle genes, transcripts, and rates (Thamdrup et al., 2006; Dalsgaard et al., 2012; Stewart et al., 2012). Recently, analysis of microbial metagenomes in the ETSP OMZ also identified a non-uniform distribution of N cycle genes among filter size fractions (Ganesh et al., 2014). Genes for aerobic ammonia oxidation at OMZ boundaries and for anammox at the OMZ core were consistently overrepresented in the FL fraction  $(0.2-1.6 \,\mu\text{m})$ . In contrast, genes mediating different steps of denitrification showed variable distributions between size fractions. Genes encoding NarG, part of the enzyme catalyzing nitrate reduction to nitrite, were abundant and evenly distributed between PA ( $>1.6 \mu m$ ) and FL fractions within the OMZ, whereas genes mediating the two terminal steps of denitrification, the reduction of nitric oxide to nitrous oxide (norB) and nitrous oxide to dinitrogen (nosZ), exhibited a fourfold increase in relative abundance in PA compared with FL metagenomes. These data highlight a potential separation of linked metabolic processes at varying spatial scales, potentially over micron gradients separating PA and FL communities.

The proportional contribution of PA N metabolism to bulk process rates in OMZs remains unclear, notably for the larger ETNP OMZ. Despite recent studies describing the diversity and activity of key functional taxonomic groups in the ETNP (Podlaska et al., 2012; Rush et al., 2012; Beman et al., 2012, 2013), this region remains under-explored from a microbiological and molecular perspective. Assessing the actual biochemical significance of microspatial separation of microbial processes in OMZs requires quantification of metabolic rates and gene expression among size fractions from diverse OMZ regions. We combine community transcription profiling and rate measurements to quantify size fraction partitioning of key steps of the marine N cycle. These data, coupled with taxonomic analysis of genes and transcripts and estimates of bacteria abundance among size fractions, indicate a significant contribution of particles and PA bacteria to OMZ N cycling.

## Materials and methods

#### Molecular analysis

Sample collection. Samples were collected from the ETNP OMZ during the OMZ Microbial Biogeochemistry Expedition cruise (R/V New Horizon, 13–28 June 2013). Seawater was sampled from six depths spanning the upper oxycline (30 m), lower oxycline (85 m) oxic-nitrite interface (91 m), secondary chlorophyll maximum (100 m), secondary nitrite maximum (125 m) and OMZ core (300 m) at Station 6 (18° 54.0' N, 104° 54.0' W) on 19 June. Collections were made using Niskin bottles on a rosette containing a Conductivity Temperature Depth profiler (Sea-Bird SBE 911plus, Sea-Bird Electronics Inc., Bellevue, WA, USA) equipped with a Seapoint fluorometer (Seapoint Sensors Inc., Exeter, NH, USA) and SBE43dissolved oxygen sensor (Sea-Bird Electronics Inc.). High-resolution Switchable Trace amount OXygen sensors (STOX) were also mounted to the rosette to quantify oxygen at nanomolar concentrations (Revsbech et al., 2009; Supplementary Methods). Samples were also collected from 20, 40, 90, 100, 125 and 300 m during a replicate cast on the same day and used to count bacterial 16S rRNA genes.

Size-fractionated biomass was collected for RNA analysis by sequential inline filtration of seawater (~10–15 l) through a nylon disk filter (47 mm, 30 µm pore size, Millipore, Bellerica, MA, USA), a glass fiber disc filter (GF/A, 47 mm, 1.6 µm pore size, Whatman, GE Healthcare Bio-sciences, Pittsburgh, PA, USA) and a primary collection filter (Sterivex, 0.22 µm pore size, Millipore) via peristaltic pump. Replicate filters for DNA were collected from equivalent water volumes following RNA collection. Water samples (45 ml each) for 16S rRNA gene counts were filtered through 0.2 µm disc filters (25 mm, cellulose nitrate, Whatman). Disc filters were transferred to cryovials containing RNA stabilizing buffer (25 mM sodium citrate, 10 mM EDTA and 70 g ammonium sulfate per 100 ml solution, pH 5.2) for RNA samples or lysis buffer (50 mM Tris-HCl, 40 mM EDTA and 0.73 M sucrose) for DNA samples. Sterivex filters were filled with either RNA stabilizing buffer or lysis buffer, capped and flashfrozen (RNA samples). Filters were stored at - 80 °C. Less than 20 min elapsed between sample collection (water on deck) and fixation in buffer.

DNA and RNA extraction. DNA was extracted from disc and Sterivex filters using a phenol/chloroform protocol as in Ganesh *et al.* (2014). Cells were lysed by adding lysozyme (2 mg in 40 µl of lysis buffer per filter) directly to the disc filter containing cryovial or to the Sterivex cartridge, sealing the caps/ends and incubating for 45 min at 37 °C. Proteinase K (1 mg in 100 µl lysis buffer with 100 µl 20% SDS) was added, and cryovials and cartridges were resealed and incubated for 2 h at 55 °C. The lysate was removed and DNA was extracted once with phenol:chloroform:isoamyl alcohol (25:24:1) and once with chloroform:isoamyl alcohol (24:1), and then concentrated by spin dialysis using Ultra-4 (100 kDa, Amicon, Millipore) centrifugal filters.

RNA was extracted from disc and Sterivex filters using a modification of the mirVana miRNA Isolation kit (Ambion, Life Technologies, Carlsbad, CA, USA) as in Stewart et al. (2012). Filters were thawed on ice and RNA stabilizing buffer was removed by pipette from cryovials or expelled via syringe from Sterivex cartridges and discarded. Cells were lysed by adding lysis buffer and miRNA homogenate additive (Ambion) directly to the cryovial or cartridge. Following vortexing and incubation on ice, lysates were transferred to RNase-free tubes and processed via acid-phenol/chloroform extraction according to the kit protocol. The TURBO DNAfree kit (Ambion) was used to remove DNA and the extract was purified using the RNeasy MinElute Cleanup Kit (Qiagen, Hilden, Germany).

16S rRNA gene counts. Quantitative PCR was used to count bacterial 16S rRNA genes in bulk seawater (biomass  $> 0.2 \mu$ m) and in 0.2–1.6 and 1.6–30 µm size fractions. Extracts from the  $> 30 \mu$ m fraction did not contain measureable DNA (via Qubit) and failed to yield signals during quantitative PCR with diluted and undiluted extracts. We were not able to sum counts from size-fractionated samples to obtain counts per volume because exact volumes of filtered seawater were not recorded. We instead used samples of fixed volume from a replicate cast ('Sample collection' section above) to quantify total gene copies per ml of seawater. Because equal water volumes passed through sequential filters during size fractionation, counts from size-fractionated samples were used to quantify the ratio of copies in the 0.2–1.6- $\mu$ m fraction to those in the 1.6–30- $\mu$ m fraction (FL/PA ratio); counts from the >30  $\mu$ m fraction are assumed to be negligible.

Quantitative PCR used TaqMan-based reagents and universal bacterial 16S primers 1055 f and 1392r, as in Ritalahti et al. (2006) and Hatt et al. (2013). Tenfold serial dilutions of DNA from a plasmid carrying a single copy of the 16S rRNA gene (from Dehalococcoides mccartyi; Ritalahti et al., 2006) were included on each quantitative PCR plate and used to generate standard curves. Assays were run on a 7500 Fast PCR System and a StepOnePlus Real-Time PCR System (Applied Biosystems, Life Technologies). All samples were run in triplicate (20 µl each) and included 1× TaqMan Universal PCR Master Mix (Life Technologies), 300 nm of primers, 300 nm of TaqMan MGB probe (Life Technologies) and 2 µl of template DNA. Thermal cycling involved incubation at 50 °C for 2 min to activate uracil-*N*-glycosylase, followed by 95 °C for 10 min to inactivate uracil-*N*-glycosylase, denature template DNA and activate the AmpliTaq Gold polymerase, followed by 40 cycles of denaturation at 95 °C (15 s) and annealing at 60 °C (1 min).

16S rRNA gene amplicon sequencing. Highthroughput sequencing of dual-indexed PCR amplicons encompassing the V4 region of the 16S rRNA gene was used to assess bacterial community composition in all filter fractions. Despite low DNA yields (above), 16S gene fragments were amplifiable from the >30-µm fraction. The diversity of amplicons generated using Archaea-specific primers was not evaluated. Amplicons were synthesized using Platinum PCR SuperMix (Life Technologies) with primers F515 and R806 (Caporaso et al., 2011). Both forward and reverse primers were barcoded and appended with Illumina-specific adapters according to Kozich et al. (2013). Thermal cycling involved: denaturation at 94 °C (3 min), followed by 30 cycles of denaturation at 94 °C (45 s), primer annealing at  $55 \circ C$  (45 s) and primer extension at 72  $\circ C$  (90 s), followed by extension at 72 °C for 10 min. Amplicons were analyzed by gel electrophoresis to verify size (~400 bp) and purified using the QIAQuick PCR Clean-Up Kit (Qiagen). Amplicons from different samples were pooled at equimolar concentrations and sequenced on an Illumina MiSeq (Illumina, San Diego, CA, USA) using a 500 cycle kit with 5% PhiX as a control.

#### cDNA synthesis and metatranscriptome sequencing

Shotgun Illumina sequencing of community cDNA was used to characterize gene expression in  $0.2-1.6 \,\mu\text{m}$  and  $1.6-30 \,\mu\text{m}$  biomass fractions. Most samples of the  $> 30 \cdot \mu\text{m}$  fraction did not yield sufficient RNA for sequencing; this fraction was excluded from meta-omic analysis. Community RNA

was prepared for sequencing using the ScriptSeq v2 RNA-Seq Library preparation kit (Epicenter, Madison, WI, USA). Briefly, cDNA was synthesized from fragmented total RNA (rRNA was not removed) using reverse transcriptase and amplified and barcoded using ScriptSeq Index PCR Primers (Epicenter) to generate single-indexed cDNA libraries. cDNA libraries were pooled and sequenced on an Illumina MiSeq using a 500 cycle kit (Supplementary Table S1). Metagenomes from coupled DNA samples were analyzed to allow standardization of taxon transcript levels relative to abundance in the DNA pool. These data sets were generated in a separate study (in review, NCBI accession SRP044185) using the Nextera XT DNA Sample Prep kit and paired-end MiSeq sequencing as above for cDNA samples.

#### Sequence analysis—16S rRNA gene amplicons

Amplicons were analyzed using QIIME (Caporaso et al., 2010) following standard protocols. Barcoded sequences were de-multiplexed and filtered to remove low-quality reads (Phred score <25). Pairedend sequences were merged using custom scripts incorporating the FASTX toolkit (http://hannonlab. cshl.edu/fastx toolkit/index.html) and USEARCH algorithm (Edgar, 2010), with criteria of minimum 10% overlap and 95% nucleotide identity within the overlapping region. Merged sequences were clustered into operational taxonomic units at 97% sequence similarity using open-reference picking with the UCLUST algorithm (Edgar, 2010), with taxonomy assigned to representative operational taxonomic units from each cluster using the Greengenes database (DeSantis et al., 2006). Operational taxonomic unit counts were rarefied (10 iterations) and alpha diversity was quantified at a uniform sequence depth (n = 6506) using the phylogenetic diversity metric of Faith (1992). To compare community composition between samples, sequences were aligned using the PyNAST aligner (Caporaso *et al.*, 2010) and beta diversity was calculated using the weighted Unifrac metric (Lozupone and Knight, 2005). Sample relatedness based on Unifrac was visualized with a twodimensional principal coordinate analysis.

## Sequence analysis—metatranscriptomes and metagenomes

Analysis of protein-coding genes and transcripts followed that of Stewart *et al.* (2012) and Ganesh *et al.* (2014). Reads were filtered by quality and merged as described above. rRNA transcripts were identified using riboPicker (Schmieder *et al.*, 2012) and removed. Merged non-rRNA sequences were queried via BLASTX against the NCBI-nr database (November 2013). BLASTX matches to bacterial and archaeal genes (>bit score 50) were retained to evaluate marker genes of dissimilatory N metabolism: ammonia monooxygenase (*amoC*), nitrite oxidoreductase (*nxrB*), hydrazine oxidoreductase (*hzo*), nitrate reductase (*narG*), nitrite reductase (*nirK*+*nirS*), nitric oxide reductase (*norB*) and nitrous oxide reductase (*nosZ*). N gene transcript abundances were normalized based on gene length and expressed as a proportion of the abundance of transcripts matching the gene encoding RNA polymerase subunit B (rpoB), as has been done in studies of diverse bacteria (for example, Schumann et al., 2010; Ceja-Navarro et al., 2014; Dalsgaard et al., 2014; Eldholm et al., 2014). Although *rpoB* expression can vary (Vandecasteele *et al.*, 2001), *rpoB* appears to be one of the more stably expressed housekeeping genes (Sue et al., 2004; Sihto et al., 2014). Furthermore, it has been shown that *rpoB* can be a proxy of bulk mRNA transcription level for bacteria (Milohanic et al., 2003; Sue et al., 2004)*rpoB*-normalized values therefore reflect transcription of a target gene relative to a housekeeping gene under a given condition/sample.

The taxonomic composition of protein-coding genes and transcripts was determined using MEta-Genome ANalyzer 5 (Huson *et al.*, 2011) based on the annotations of BLASTX-identified genes, according to the NCBI taxonomy. The proportional contribution of a taxon (Phyla and Class levels) to the RNA pool was calculated as an RNA:DNA ratio, calculated as in Frias-Lopez et al. (2008) and Stewart et al. (2012) to account for variation in taxon abundance in the DNA pool: (protein-coding RNA reads per taxon/total protein-coding RNA reads)/(protein-coding DNA reads per taxon/total protein-coding DNA reads). For subsets of transcripts matching specific functional taxa (anammox genera, Nitrospina), genes differentially expressed between FL and PA fractions were identified using baySeq (Hardcastle and Kelly, 2010) as in Ganesh et al. (2014). Full details regarding sequence analysis are in the Supplementary Methods.

#### Amplicon and metatranscriptome sequences are available through NCBI under BioProject ID PRJNA263621

Biochemical analysis. Water for rate measurements was taken from Niskin bottles immediately after arrival on deck and transferred to 2 l glass bottles. Bottles were overflowed (three volume equivalents) and sealed without bubbles using deoxygenated butyl rubber stoppers (De Brabandere *et al.*, 2014). Bottles were stored in the dark at *in situ* temperature until experimentation (<6 h). Each bottle was purged with a gas mixture of helium and carbon dioxide (800 p.p.m. carbon dioxide) for ~ 20 min. Under a slight overpressure, water was dispensed into 12 ml exetainers (Labco, Lampeter, Ceredigion, UK) either directly or through helium-flushed inline filter holders, and immediately capped with deoxygenated lids.

Rates were measured for two biomass fractions: bulk water containing all particles (no filtration) and water without particles  $>1.6 \,\mu$ m. Particles were excluded via filtration as described above. Exetainers

The ISME Journal

Size-fractionated gene transcription and N cycling S Ganesh et al

were subsequently amended with <sup>15</sup>N-labeled substrate by injection through the septum. Three <sup>15</sup>N amendments were carried out for all samples: <sup>15</sup>NH<sub>4</sub><sup>+</sup> addition (to 5  $\mu$ M concentration), <sup>15</sup>NO<sub>2</sub><sup>-</sup> addition (5  $\mu$ M) and <sup>15</sup>NO<sub>3</sub><sup>-</sup> addition (15  $\mu$ M). Headspaces of 2 ml were introduced into each exetainer and flushed twice with the helium–carbon dioxide mixture as in De Brabandere *et al.* (2014). For each experiment, triplicate exetainers were preserved with 100  $\mu$ l of 50% (w/v) ZnCl<sub>2</sub> at the start of the incubation and again at the end point (27 h). Oxygen concentration was <80 nM in all treatments. The act of filtering did not affect exetainer oxygen content (Supplementary Methods).

The production of <sup>14</sup>N<sup>15</sup>N and <sup>15</sup>N<sup>15</sup>N was determined on a gas chromatography isotope ratio mass spectrometer as in Dalsgaard *et al.* (2012). Rates of  $N_2$ production by anammox and denitrification were calculated using the equations in Thamdrup and Dalsgaard (2002). Nitrite oxidation was determined from the production of  ${}^{15}NO_3^-$  from incubations with <sup>15</sup>NO<sub>2</sub>. After removal of unused <sup>15</sup>NO<sub>2</sub> using sulfamic acid, <sup>15</sup>NO<sub>3</sub> was converted to <sup>15</sup>NO<sub>2</sub> with cadmium and then to  $N_2$  with sulfamic acid (Füssel *et al.*, 2012; McIlvin and Altabet 2005). Ammonia oxidation and nitrate reduction rates were determined as production of <sup>15</sup>NO<sub>2</sub> from incubations with <sup>15</sup>NH<sub>4</sub> or <sup>15</sup>NO<sub>3</sub>. <sup>15</sup>NO<sub>2</sub> produced during incubations was converted to  $N_2$  with sulfamic acid.  $N_2$  was then analyzed on the gas chromatography isotope ratio mass spectrometer. Rates for all processes were calculated from the slope of the linear regression of <sup>14</sup>N<sup>15</sup>N or <sup>15</sup>N<sup>15</sup>N with time. *T*-tests were applied to determine whether rates were significantly different from zero (P < 0.05). Nonsignificant rates are presented as not detected.

Nitrate, nitrite and ammonium concentrations were determined using standard protocols, as described in the Supplementary Methods. The N deficit estimates the amount of fixed N loss and was calculated as: N deficit = (DIN)–(16 ×  $[PO_4^{3-}] \times 0.86$ ), where DIN =  $[NO_3^{-}]$ +  $[NO_2^{-}]+[NH_4^{+}]$ . The value of 0.86 accounts for the release of  $PO_4^{3-}$  from organic N remineralized during denitrification (Codispoti *et al.*, 2001).

## **Results and discussion**

Particle removal significantly altered N cycle rates and gene expression, suggesting physiological variation at the microscale between water column and PA niches. These patterns are discussed below relative to oxygen and N concentrations, bacterial abundance and community taxonomic composition.

#### Oxygen and nitrogen

Oxygen concentrations recorded by the SBE43 sensor were highest ( $\sim 200 \,\mu$ M) in surface waters and declined steeply in the oxycline between 30 and 85 m (Figure 1a). From 90 to 800 m, concentrations measured by STOX sensors were <50 nM, with

the majority close to or below the detection limit (Figure 1b) representing the OMZ core. Oxygen concentrations at the six depths sampled for size fractionation work varied markedly, from 200 µM at 30 m to 229 nm at 85 m, representing the upper and lower limits of the oxycline, respectively, 43 nm at the oxic-nitrite interface (91 m), 21 nm at the secondary chlorophyll maximum (100 m) and 14 nm at the secondary nitrite maximum (125 m), before reaching the detection limit (9 nm) at 150 m and staying undetectable to 300 m in the OMZ core (Figure 1b). Oxygen profiles coincided with patterns in nitrate, nitrite and the N deficit. As commonly observed in anoxic OMZs (Ulloa et al., 2012), a prominent secondary nitrite maximum (up to 6.1 µM) was observed as oxygen declined, coinciding with local nitrate and N deficit minima (Figures 1a and c). Ammonium concentrations remained below 155 nm throughout the profile. Chlorophyll peaked at 0.6 and  $0.8 \ \mu g \ l^{-1}$  at 50 and 100 m, respectively, indicating the primary and secondary chlorophyll maxima characteristic of OMZs (Figure 1c; Ulloa et al., 2012).

#### 16S rRNA gene abundance

Counts of bacterial 16S rRNA genes varied by an order of magnitude with depth (Figure 1f). Bulk seawater counts declined from  $\sim 6 \times 10^5$  per ml in the primary chlorophyll maximum and upper oxycline to  $1.3 \times 10^5$  at the oxic-nitrite interface (90 m), before increasing to a maximum of  $1.4 \times 10^6$  at the OMZ core. This pattern agrees with trends from other OMZ sites, where particulate backscattering and bacterial load show local maxima in the photic zone and again in the OMZ (Spinrad et al., 1989; Naqvi et al., 1993; Whitmire et al., 2009). At all depths, gene numbers were substantially higher in the 0.2- $1.6 \,\mu m$  (FL) fraction compared with the  $1.6-30 \,\mu m$ (PA) fraction, with FL/PA ratios from 8 to 15 (Figure 1f). Elevated microbial biomass in FL compared with PA fractions has been observed in diverse ocean regions (Cho and Azam 1988; Karl et al., 1988; Turley and Stutt 2000; Ghiglione et al., 2009). Here, FL/PA was lowest at 300 m, suggesting an increased contribution of PA or large bacteria within the OMZ core, possibly related to increases in particle load or size.

#### Community composition—16S rRNA gene amplicons

Community 16S rRNA gene diversity varied substantially among biomass fractions and depths. Unifrac-based clustering indicated that size class was a stronger predictor of community relatedness compared with depth, notably for samples from the OMZ layer (100, 125 and 300 m) (Figure 2). Phylogenetic diversity differed widely among fractions, with values in the two PA fractions up to 50% greater than those for the corresponding FL fraction (Supplementary Figure S1). Elevated diversity in PA communities has been reported for the ETSP OMZ



**Figure 1** Vertical profiles of hydrochemical parameters, bulk N cycling process rates and bacterial 16S rRNA gene counts at Station 6, off Manzanillo, Mexico on 19 June 2013. The N deficit ( $\mathbf{a}$ , open squares) is shown relative to oxygen concentrations, measured during the upcast profile with both a SBE43 sensor ( $\mathbf{a}$ ; solid line) and STOX sensors ( $\mathbf{b}$ ), and to profiles of nitrite, nitrate and chlorophyll concentration ( $\mathbf{c}$ ). The dashed line in  $\mathbf{b}$  indicates the detection limit of the STOX sensors ( $\mathbf{-9}$  nM). N cycle process rates ( $\mathbf{d}$ ,  $\mathbf{e}$ ) are bulk rates (no size fractionation) in nMN per day. ( $\mathbf{f}$ ) Quantitative PCR-based counts of 16S rRNA gene copies per ml of bulk seawater (all biomass > 0.2 µm) and the ratio of gene counts in the FL (0.2–1.6 µm) biomass fraction to counts in the PA (1.6–30 µm) fraction. Arrows ( $\mathbf{c}$ ,  $\mathbf{f}$ ) indicate the depths sampled for rate measurements. Error bars represent the standard error.

(Ganesh *et al.*, 2014) and may be driven by increased niche richness due to substrate heterogeneity on particles, or to the exposure of particles during sinking to diverse communities in different biogeochemical zones. Here, phylogenetic diversity in all size fractions peaked at the secondary chlorophyll maximum, similar to trends reported for non-fractionated samples (biomass  $> 0.2 \mu$ m) from ETNP sites north of the study area, where taxon richness peaked just below the oxycline, before declining with depth (Beman and Carolan, 2013). That study identified deoxygenation as a driver of bulk community diversity, whereas our results suggest that diversity estimates vary depending on the filter fraction examined.

Several microbial clades with roles in N cycling were proportionally enriched in FL relative to PA fractions (Figure 3; Supplementary Figure S2).

Sequences matching ammonia-oxidizing Thaumarchaeota and nitrite-oxidizing Nitrospina (classified as Deltaproteobacteria in Supplementary Figure S3; Teske et al., 1994) peaked in relative abundance (2.2–2.9% of total) in the FL fraction from the lower oxycline before declining with depth. Abundances of both groups decreased by 50-60% in the 1.6-30-µm PA fraction relative to the FL fraction and were negligible in the >30-µm PA fraction. Sequences matching the anammox Planctomycete Candidatus Scalindua (Order Brocadiales) were also confined primarily to the FL fraction, peaking at 14.1% of total FL amplicons at 300 m, compared with 0.3-1.5% in PA fractions. Anammox bacteria were previously shown to be enriched in the smallest size fractions in studies of the Chilean OMZ (Ganesh et al., 2014), the Black Sea (Fuchsman *et al.*, 2012), and an OMZ off Costa Rica (Kong et al., 2013), but have also been



**Figure 2** Principle coordinate analysis of community taxonomic relatedness based on 16S rRNA gene amplicons, as quantified by the weighted Unifrac metric. Samples from different filter size fractions are circled (excluding outliers from the 30-m depth).

detected in direct contact with particles in oxygendepleted waters over the Namibian shelf (Woebken *et al.,* 2007).

The composition of the ETNP bacterial community with potential roles in coupled N and sulfur cycles differed from that of other OMZs and varied among size fractions. The sulfur-oxidizing and denitrifying Gammaproteobacterial SUP05 clade, a ubiquitous inhabitant of low-oxygen waters (Wright et al., 2012), accounted for <0.2% of amplicons in ETNP samples. ETNP samples were instead enriched in members of the uncultured SAR406 and Deltaproteobacterial SAR324 lineages (Figure 3), as well as Gammaproteobacteria of the Thiohalorhabdales, Chromatiales and Thiotrichales (Supplementary Figure S3 and Supplementary Information), all of which may contain sulfur-oxidizing members. The SAR406 cluster was particularly abundant in FL samples, contributing 22% (average) of FL sequences, compared with 2.8% in PA fractions (Figure 3). SAR406 may participate in sulfur cycling via dissimilatory polysulfide reduction to sulfide or sulfide oxidation (Wright et al., 2014), although pathways for denitrification and carbon fixation have not been unambiguously identified. The SAR324 lineage, which includes members with genes for sulfur chemolithoautotrophy and nitrite reduction (Swan et al., 2011; Sheik et al., 2014), was also enriched in FL samples, representing 5-8% of sequences at OMZ depths, compared with <0.5% in PA fractions (Supplementary Figure S3). FL enrichment of SAR406 and SAR324 is consistent with an autotrophic lifestyle, as autotrophs would not require organic particles for carbon acquisition. Whereas sulfide-oxidizing autotrophs in other OMZs are capable of using oxidized N compounds as terminal oxidants (Walsh et al., 2009; Canfield et al., 2010), the extent to which ETNP clades participate in sulfurdriven denitrification remains unclear.

Many microbial groups common to low-oxygen waters, including those discussed above, were either at low abundance or absent from the >30-µm PA fraction. This fraction was instead enriched in taxa known to associate with the surfaces or guts of plankton or polymer aggregates (for example, fecal pellets), notably Gammaproteobacteria related to *Vibrio*, *Pseudomonas* and *Alteromonas* (Supplementary Figure S3; Rao *et al.*, 2005; Hunt *et al.*, 2008; Ivars-Martinez *et al.*, 2008). Microorganisms on particles >30 µm are likely a minor component of the bulk OMZ microbial community, and may be relatively transient members, passing through low-oxygen depths attached to sinking aggregates or zooplankton.

#### RNA:DNA ratios

The taxonomic identities of protein-coding genes and transcripts suggest differences in the proportional contributions of specific taxa to bulk transcript pools in FL versus PA (1.6-30 µm) communities. RNA/DNA ratios for several groups with roles in N cycling, including anammox bacteria (Brocadiales), ammonia-Thaumarchaeota and nitrite-oxidizing oxidizing Nitrospina bacteria, were consistently elevated in FL relative to PA communities (Figure 4). These groups were also proportionately enriched in 16S gene pools from FL samples. In contrast, groups such as the Actinobacteria and Gammaproteobacteria exhibited greater RNA/DNA ratios in the PA fraction. Similar patterns were observed for ratios based on 16S rRNA gene amplicons and transcripts from metatranscriptomes (rRNA:rDNA; Supplementary Figure S4). Although RNA:DNA ratios, based either on target genes or community gene pools, have been used as proxies for metabolic activity (Campbell and Yu, 2011; Hunt et al., 2013; Satinsky et al., 2014), linking ratios to activity is tenuous. Notably, as RNA/DNA ratios are based on proportional abundances, increases in taxon representation in the transcriptome can reflect either increases in the activity of the target taxon or decreases in the activity of other organisms. Furthermore, using ratios to infer activity is challenging for broad divisions such as the Gammaproteobacteria that contain taxonomically and functionally diverse members, as the relationship between cell RNA content and activity is unlikely to be consistent across members or activity gradients (Blazewicz et al., 2013). Here, the composition of Gammaproteobacteria at the Order level varied widely (Supplementary Figure S3), highlighting the possibility that taxon-specific differences confounds interpretation of Phylum-level ratios. Studies at finer levels of taxonomic resolution utilizing transcriptome mapping to reference genomes coupled with measurements of absolute transcript numbers are necessary to confirm shifts in taxon-specific activity between FL and PA niches. The latter could reflect differences in substrate conditions or the proportions of live versus dead cells between fractions.



Figure 3 ETNP OMZ bacterial community diversity revealed by 16S rRNA gene Illumina sequencing. The abundances of major bacterial divisions are shown as a percentage of total identifiable 16S rRNA gene sequences. 'Other' includes 34 divisions, including unassigned sequences.



**Figure 4** Fold increase in taxon RNA/DNA ratios between PA (1.6–30  $\mu$ m) and FL (0.2–1.6  $\mu$ m) communities. Plot shows the fold increase in ratios for major taxonomic groups identified by the NCBI annotations of protein-coding genes and transcripts in coupled metatranscriptome and metagenome data sets. Values right of zero indicate higher ratios in PA communities (PA/FL>1). Values left of zero indicate higher ratios in FL communities (FL/PA>1). The plot shows only groups with relative abundance in metagenome data sets greater than 0.2% of total sequences, and only groups with an average (across all five depths) fold increase >1.5. Numbers in parentheses are false discovery rate *q*-values for *t*-test comparisons of PL and FL ratios, calculated as in Storey and Tibshirani (2003).

#### Bulk biochemical rates

N transformation rates in bulk water (no filter fractionation) varied among processes and over depth gradients. Rates of nitrate reduction to nitrite increased with depth and diminishing *in situ* oxygen concentration, with measured rates from 1.5 to 9.4  $nMN d^{-1}$  (Figure 1e). The reduction of nitrite to  $N_2$  via denitrification was slower and measurable only

below 125 m, with a maximum of  $1.7 \text{ nmN d}^{-1}$  at 300 m (Figure 1d). Anammox was measurable between 91 and 300 m at rates from 0.3 to  $1.9 \text{ nmN d}^{-1}$ , with the highest rates in the secondary nitrite maximum. Anammox rates after <sup>15</sup>NO<sub>2</sub><sup>-</sup> addition were consistently higher than those after <sup>15</sup>NH<sub>4</sub><sup>+</sup> addition, similar to trends in De Brabandere *et al.* (2014) working in the ETSP OMZ. The largest discrepancy in <sup>15</sup>NO<sub>2</sub><sup>-</sup>

# Size-fractionated biochemical rates and gene expression

Nitrate reduction and denitrification. Rates of nitrate reduction to nitrite were undetectable after removal of particles (>1.6  $\mu$ m) by filtration (Figure 5a). Filtration therefore removed either a significant proportion of total nitrate-reducing cells or a critical substrate source fueling FL nitrate

reducers. Although the proportional abundances of transcripts encoding nitrate reductase (narG) were uniform among filter fractions (Figure 5b), suggesting roughly equivalent contributions of nitrate reduction to fraction-specific metabolism in PA and FL niches, total transcript counts were still considerably higher in the FL fraction (Figure 5c). The taxonomic identities of *narG* transcripts spanned a wide phylogenetic range (Figure 5d), with sequences related to anammox bacteria and candidate divisions OP3 and OP1 particularly highly represented in both fractions, which is consistent with results from ETSP OMZ metagenomes (Ganesh et al., 2014). The distribution of *narG* suggests that declines in nitrate reduction after filtration were likely driven primarily by the removal of particulate organic matter (OM) for use by diverse FL nitrate reducers and to a minor extent by the removal of particle-attached nitrate reducers.

Rates of  $N_2$  production by denitrification also declined significantly (by 85%) following particle removal. Transcripts encoding enzymes for nitrite reduction (*nirK/S*) and  $N_2O$  and  $N_2$  gas production (nosZ and norB, respectively) were at low abundance compared with those of nitrate reduction and anammox (Figure 5c), and showed contrasting size fraction distributions. Transcripts for NirK/S were at relatively uniform proportional abundances in PA and FL data sets. These transcripts reflected a diverse assemblage, but were notably enriched at the lower oxycline and oxic-nitrite interface by Thaumarchaeota nirK sequences (Figure 5d). NO-forming Nir activity in ammonia-oxidizing Thaumarchaeota is not well understood (Lund et al., 2012), but may have roles in both energy generation and nitrite detoxification, with the latter of potential relevance in nitritereplete OMZs. In contrast, nosZ and norB transcripts were enriched up to 28-fold in PA fractions, particularly at upper OMZ depths (Figure 5b), and affiliated with a community taxonomically distinct from that upstream steps catalyzing of denitrification (Figure 5d), as also reported in Dalsgaard et al. (2014). These results support metagenome data from the Chilean OMZ (Ganesh et al., 2014) and from an estuarine site (Smith et al., 2013) showing nor/nos enrichment in PA fractions, suggesting a conserved PA niche. After scaling based on 16S gene counts (a proxy for cell counts), absolute counts of *nosZ* and

versus <sup>15</sup>NH<sub>4</sub>-based anammox rates occurred at 300 m, the depth where maximum denitrification rates were measured (Figure 1d), suggesting that nitrite shunting by denitrifiers could explain the offset in anammox rates, as proposed by De Brabandere et al. (2014). In this interpretation, incubations with <sup>15</sup>NH<sub>4</sub><sup>+</sup> reflect true anammox rates, while incubations with <sup>15</sup>NO<sub>2</sub> overestimate the process. Our measured N loss rates are similar to those reported by Babbin et al. (2014) for stations close to ours  $(0.8-4.7 \text{ and } 0.9-3.3 \text{ nm} \text{ N} \text{ d}^{-1}$  for anammox and denitrification, respectively), and are generally consistent with those recorded in other OMZs (Lam and Kuypers, 2011). Dissimilatory nitrate reduction to ammonium was not detected in any of the samples. Ammonia oxidation was detected only at 100 m or shallower, with maximum rates at 85 m (0.92 nm N  $d^{-1}$ ), the shallowest and most oxygenated of the depths where rates were measured (Figure 1e). These rates are at the lower end of those previously observed in the Gulf of California and ETNP (0–348 nm d<sup>-1</sup>; Beman *et al.*, 2012) and in the ETSP OMZ (0.2–89 nmd<sup>-1</sup>; Kalvelage *et al.*, 2013). Nitrite oxidation was detected at all depths except 125 m, at rates  $(13-261 \text{ nm d}^{-1}; \text{ Figure 1e})$  up to an order of magnitude higher than those for other processes, with rates peaking in the secondary chlorophyll maximum, suggesting a decoupling between ammonia and nitrite oxidation. These values are consistent with nitrite oxidation rates measured in the Gulf of California and ETNP (0-213 nmd<sup>-1</sup>; Beman *et al.*, 2013), the ETSP (5–928  $nMd^{-1}$ ; Kalvelage *et al.*, 2013) and the Benguela upwelling  $(14-372 \text{ nm } \text{d}^{-1}; \text{Füssel } et al., 2012),$ further confirming the activity of nitrite oxidizers at nanomolar oxygen levels (Füssel et al., 2012).

**Figure 5** Measured rates and marker gene transcript levels for major dissimilatory N cycle processes. Process rates (a) are shown for incubations with particles (no filtration) and without particles measuring 1.6  $\mu$ m or larger. Zero values indicate non-significant rates and error bars represent the standard errors. Note variation in *y* axis scales. (b) Marker gene transcript abundances in FL (0.2–1.6  $\mu$ m) and PA (1.6–30  $\mu$ m) filter fractions. Abundances are calculated as read count per gene per kilobase of gene length, and shown as a proportion of the abundance of transcripts matching the universal, single-copy gene *rpoB*. A value of 1 indicates abundance equal to that of *rpoB*. Note variation in *y* axis scales. (c) Multiplies the values in **b** by the counts of bacterial 16S genes in Figure 1f and the FL/PA ratio (for FL counts only), with the values then divided by 1 000 000 for presentation. The resulting values do not reflect absolute counts, but provide an approximation of how variation in bacterial abundance (inferred by proxy from 16S counts) is predicted to affect comparisons of absolute transcript counts scale with bacterial load. Scaled *amoC* values are not provided in **c**, as FL:PA ratios do not reflect archaeal contributions. Patterns in **c** should be interpreted cautiously, as they could change if RNA content per unit biomass varies substantially among samples. (d) The taxonomic affiliations of marker gene transcripts based on NCBI annotations of genes identified as top matches (> bit score 50) via BLASTX.

*norB* transcripts were estimated to be comparable between size fractions (Figure 5c), suggesting that filtration removes a significant proportion of the  $N_2O$ -and  $N_2$ -forming denitrifier community.

Anammox. Anammox rates declined 53–100% without particles. These declines may indicate that particle removal eliminates an important substrate source for FL anammox bacteria. Particles could facilitate



anammox by providing (1) ammonium remineralized by heterotrophic PA bacteria consuming particulate OM (Shanks and Trent, 1979), (2) ammonium produced by anammox bacteria via oxidation of particulate OM with nitrate or nitrite (Kartal *et al.*, 2007) or (3) nitrite produced by other (non-anammox) nitratereducing heterotrophs consuming particulate OM. Explanations (1) and (3) are consistent with the observed reduction in rates of nitrate reduction to nitrite, the most active respiratory process detected, in the absence of particles. We therefore hypothesize that particle-dependent nitrate or nitrite reduction by both FL and PA communities likely provides a critical supply of ammonium or nitrite for anammox, although it remains unclear whether anammox bacteria are ammonium- or nitrite-limited in OMZs (Lam and Kuypers, 2011; De Brabandere et al., 2014).

Two alternate hypotheses could explain the decline in anammox after filtration. First, filtration removed a significant fraction of total anammoxcapable cells. This hypothesis is dismissed given the substantial enrichments of total 16S rRNA gene copies and Brocadiales 16S copies in the FL fraction. Second, anammox-capable cells in PA fractions, although a minor component of the total population, contributed disproportionately to bulk anammox rates, potentially overexpressing anammox enzymes compared with FL cells. The active transcription of anammox genes in the FL fraction argues against this hypothesis. Transcripts encoding hydrazine oxidoreductase, catalyzing hydrazine oxidation to N<sub>2</sub> during anammox, were up to 15-fold higher in proportional abundance in FL samples (Figure 5b), consistent with the 14-fold enrichment of Brocadiales 16S genes in the FL fraction.

To further examine the potential that anammox bacteria alter their metabolism between FL and PA niches, we tested for differential gene expression between PA and FL data sets, focusing only on genes from known anammox genera (Supplementary Methods). After normalizing for variation in total transcripts matching anammox genera, PA and FL transcript profiles were well correlated  $(R^2 = 0.81)$ and no genes (of 1392 total) were differentially expressed between fractions (P > 0.05). However, testing for DE required grouping data sets from different depths as replicates, raising the possibility that depth-specific variation confounded the detection of DE between fractions. Despite this apparent uniformity in expression, marker genes for the anammox process itself (hzo and hzs encoding hydrazine synthase) were consistently, although not statistically, enriched (2-3 fold) in the FL fraction, suggesting an upregulation of anammox in the FL niche (Supplementary Figure S5). In contrast, transcripts encoding nitrate reductase NarGH were among those most abundant and enriched in PA profiles. Nar likely acts in reverse in anammox bacteria, converting nitrite to nitrate and helping replenish electrons lost during CO<sub>2</sub> fixation via the acetyl-CoA pathway (Strous et al., 2006; Jetten et al.,

2009). Here transcripts encoding key acetyl-CoA pathway genes (formate dehydrogenase and carbon monoxide dehydrogenase) were ~ 10-fold less abundant than Nar transcripts, and did not differ appreciably between PA and FL fractions. Alternatively, Nar in anammox bacteria may function as a traditional nitrate reductase during anaerobic growth on organic compounds (Güven *et al.*, 2005), and it is plausible that oxidation of organics is enhanced in anammox bacteria on particles. The observed fold change differences in *hzo*, *hzs* and *nar* raise the possibility of microniche-specific gene expression by anammox-capable bacteria, but do not support the hypothesis that the anammox process itself is upregulated in PA compared with FL communities. Thus, the effect of filtration on anammox rates is best explained by dependence of FL anammox bacteria on the PA fraction for substrate.

Nitrification. Compared with denitrification and anammox, ammonia and nitrite oxidation were less affected by particle removal. Filtration decreased ammonia oxidation rates by  $\sim 25\%$  in the lower oxycline and upper OMZ. At the oxic-nitrite interface, rates did not change following filtration. Nitrite oxidation decreased by  $\sim 50\%$  without particles, although rates after filtration were still several orders of magnitude higher than those of other N processes. Transcripts encoding ammonia monooxygenase (amoC) were proportionately enriched in the FL fraction (excluding at 85 m) and affiliated predominantly with sequences annotated as Thaumarchaeota or as 'uncultured crenarchaeote' (the latter were entered into NCBI before formal recognition of the 'Thaumarchaeota' designation and likely should be re-annotated as Thaumarchaeota; Figure 5d). Transcripts encoding nitrite oxidoreductase (nxrB) did not show a strong size fraction-specific enrichment, consistent with *nxrB* gene distributions in metagenomes from the Chilean OMZ (Ganesh et al., 2014). NxrB transcripts affiliated primarily with sequences from the genome of Nitrospina gracilis (Lücker et al., 2013), supporting reports of high *Nitrospina* activity in the ETNP region (Beman et al., 2013). Analysis of only N. gracilis-affiliated transcripts did not reveal any genes that were differentially expressed between FL and PA fractions (P > 0.05), although low N. gracilis read counts in PA data sets (5% those in FL data sets) likely confounded statistical detection. Indeed, nxr genes (all subunits combined) represented similar proportions of total *N. gracilis* counts in both fractions (2.5% and 3.2% in FL and PA, respectively), suggesting that expression of nitrite oxidation genes was not substantially altered between PA and FL niches.

## Conclusions

Filter fractionation significantly altered N metabolism rates, confirming a critical role for particles and PA microorganisms in OMZ N cycling. A strong dependence on particles may help explain heterogeneity of denitrification and anammox rates among OMZ sites and time points (Dalsgaard et al., 2012; De Brabandere et al., 2014; Kalvelage et al., 2013), notably if particle load varies over depth and distance from shore or between times of high versus low export from the photic zone. Our data also suggest differences in how OMZ microbes interact with particles. A significant fraction of some functional groups, notably  $N_2O$ - and  $N_2$ -producing denitrifiers, are recovered in PA fractions, suggesting direct adherence to particles, or potentially larger cell sizes. A tight coupling to particle surfaces could facilitate access to organic carbon for respiration, as well as oxidized N compounds produced by upstream steps of the denitrification pathway. Indeed, enhanced hydrolytic activity of particulate organic substrates has been demonstrated in diverse marine waters (Hoppe et al., 1993; Taylor et al., 2009; Yamada et al., 2012). Denitrifiers are generally known as facultative anaerobes (Zumft, 1997) and populations of denitrifiers on OMZ particles may develop during sinking through the oxycline, switching to denitrification upon transition to the OMZ core.

In contrast, groups such as obligately anaerobic anammox bacteria are recovered almost exclusively within the FL fraction, but appear no less dependent on particles. Anammox cells presumably rely on particles indirectly as sources of nitrite and ammonium, produced by nitrate or nitrite reducers consuming particulate OM. Although anammox cells have been recovered in direct contact with particles in other systems (Woebken et al., 2007), enrichment of anammox genes and transcripts in OMZ FL fractions suggests a relatively loose physical association with particles, although it is possible that some particle-adhered cells are dislodged into the FL fraction during filtration. It is plausible that the proportion of the anammox community adhered to particles varies depending on local substrate conditions and oxygen content. Direct adherence may enable access to anoxic microniches and be favored at upper OMZ depths where water column oxygen content is closer to the threshold for anammox inhibition (~900 nm; Dalsgaard et al., 2014).

The potential for OMZ microbes to alter their physiology between FL and PA niches remains unresolved. Anammox Planctomycetes and nitriteoxidizing *Nitrospina*, two groups recovered in both FL and PA fractions and occupying relatively welldefined functional roles, did not exhibit significantly different expression profiles between fractions. This suggests that the physical act of filtration had a relatively minor effect on cell state. Nonetheless, certain genes exhibited large fold changes in relative abundance between fractions, raising the possibility that additional analyzes with higher replication per depth may reveal size fraction-specific transcriptional differences in certain taxa. Clarifying such patterns, potentially by sequencing deeply across biological replicates coupled with transcriptome mapping to reference genomes, may help estimate per-cell differences in biochemical processing at the microscale. However, the use of biomass fractionation to characterize the microspatial architecture of microbial activity remains challenging. As shown here, particle removal significantly disrupts bulk N cycle processes mediated by a FL majority, likely by severing important chemical and biological linkages between FL and PA niches.

## **Conflict of Interest**

The authors declare no conflict of interest.

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