High transposase abundance in the deep ocean is linked to a particle-associated lifestyle

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Abstract

Transposases are mobile genetic elements (MGEs) that move within and between genomes, enabling genomic plasticity within microbes. Transposases often carry functional genes, termed *cassette sequences*, when they migrate within and between genomes. In marine microbial communities, transposase abundance increases with depth, but the reasons for this trend are unclear. Through analysis of metagenomes from the *Tara* Oceans and Malaspina Expeditions, we identify the particle-associated lifestyle as a main covariate for the high occurrence of transposases in the deep ocean. The abundance of biofilm-associated genes correlates with transposases in a strong and depth-independent manner, suggesting that MGEs readily propagate among microbial communities in crowded biofilms. Genome size positively correlates with particle-associated populations and transposase abundance. This relationship may result from selection for larger genomes, in which essential genes are more sparse and less likely to be disrupted by the recombination activities of MGEs. Genes related to defense mechanisms are enriched in cassette sequences and upregulated in the deep sea. Further, defense mechanism genes in cassette sequences experience stronger selection than other cassette genes. Thus, while transposons can spread at the expense of their microbial hosts, they introduce novel genes and potentially benefit the hosts in accessing heavily contested resources. Together, our results reveal an emerging picture of deep ocean particles as gene sharing highways that result in expanded and defensively oriented microbial genomes.

Introduction

Mobile genetic elements (MGEs) are DNA segments that can mediate the movement of genetic sequences both within and between bacterial and archaeal genomes [1]. MGEs generally encode enzymes to mediate this process [1]: in transposons, the mediating enzymes are transposases,

through which the mechanism of transfer results in inverted repeats [2, 3]. When MGEs migrate

from one genomic region to another, they frequently carry cassette sequences, which have been

reported to express functional genes such as antibiotic resistance [4] and metal uptake [5, 6], and

regulatory genes that affect gene expression in host cells [7, 8].

Transposases are the most abundant and ubiquitous genes in nature [9], despite their uneven

distribution across taxa [10, 11]. In marine systems, one of the most striking – and as of yet

unexplained – trends in microbial genomics is the distinct increase in transposase abundance with

depth. Genomic analyses from station ALOHA in the North Pacific revealed a substantial increase

in transposase abundance with depth from 500 m to their observed maximum at 4000m [12, 13]. As

one of the most overrepresented COG-categories in ALOHA deep waters, transposases accounted

for 1.2% of all fosmid sequences from 4000 m [12, 14]. Similarly, a study of hydrothermal chimneys

showed that transposases were particularly abundant in biofilms and accounted for 8% of all

metagenomic reads, a 10-fold increase compared to metagenomes in other habitats [15]. Based on

these observations, our analyses focused on three central questions: (1) why is transposase

abundance associated with greater depths and biofilms in marine systems, (2) are transposases selfish

genes that spread widely with neutral or deleterious effects on host genomes, and (3) do

transposases perform useful functions for microbial hosts that encode them?

To identify reasons for the high transposase abundance in the deep sea and to expand our

knowledge of the role of MGEs in marine microbial communities, we analyzed 187 microbial

metagenomes and 181 microbial metatranscriptomes from the *Tara* Oceans Expedition [16, 17]. The

Tara Oceans samples were from 5-1000 m in depth; to represent bathypelagic microbial

communities, we also incorporated 58 metagenomes, sampled between 2400-4000 m in depth, from

the 2010 Malaspina Expedition [18]. To explore the role of transposases at a genome-resolved level,

we analyzed 1562 metagenome assembled genomes (MAGs) previously generated from the *Tara*

Oceans [19] and Malaspina [18] metagenomes. Leveraging these publicly-available genomes from

global oceans, we showed that the high abundance of transposases in deep ocean microbial

communities was strongly linked to the shift towards a particle-associated lifestyle. We identified

taxonomy, biofilm abundance, and genome size as key covariates to transposase abundance in

MAGs. Further, we found that among the open reading frames (ORFs) in cassette sequences, the

functional category "defense mechanism" was more abundant and under stronger selection,

suggesting that transposons introduce beneficial genes to their microbial hosts inhabiting highly

competitive habitats.

Results and Discussion

Previous studies have revealed that transposase abundance in microbial genomes is

associated with increased ocean depth, a particle-associated lifestyle (as opposed to a planktonic

lifestyle), and lower dissolved oxygen (DO) concentrations [10, 13, 20]. However, the reason and

nature of these correlations has not been further explored. To confirm these findings on a broader

scale, we screened for significant covariates for transposase abundance in the *Tara* Oceans and

Malaspina metagenomes. We plotted the transposase abundance against depth, filter size fraction,

and DO. In our metagenome analysis, transposase abundance was defined as the proportion of

reads mapped back to all transposase ORFs (the database used to identify putative transposase

ORFs is shown in **Table S1**). We confirmed that transposase abundance increases steadily as depth

increases, despite large variations across samples (**Fig. S1**). In every ocean, the transposase

abundances of the deep water samples were higher than those of the shallow water samples (**Table**

S2). Here, *deep water* was defined as mesopelagic (depth 250-1000 m) and bathypelagic (2500-4000 m)

waters, and *shallow water* represents surface (<10 m) and deep chlorophyll maximum (DCM, depth

17-120 m) waters.

To investigate how MGE abundances relate to the planktonic and particle-associated

lifestyle, we calculated transposase abundance in metagenomes collected from different filter sizes.

In the *Tara* Oceans samples, samples from the 0.22-3.0 μm filter size fraction were considered

particle-associated, and samples from the 0.22-1.6 μm size fraction were *planktonic* [17]. In Malaspina

samples, samples from the 0.8-5.0 μm size fraction were *particle-associated* and 0.2-0.8 μm were

planktonic [18]. After controlling for depth, samples from particle-associated microbial communities

were more enriched in transposases than their planktonic counterparts (**Fig. 1**; ANOVA *F-test* P =

0.0032).

Dissolved oxygen, however, was not a significant covariate for transposase abundance after

controlling for depth (ANOVA *F-test* P = 0.71). In the surface and bathypelagic samples, DO

positively correlated with transposase abundance, but this correlation was reversed in DCM and

mesopelagic samples (**Fig. S2**).

Transposase and biofilm abundance were correlated in metagenomes and

metatranscriptomes.

To further investigate the relationship between transposase abundance and particle-

associated lifestyles, we examined the correlation between transposase and biofilm-associated ORFs

in metatranscriptomic and metagenomic samples (the bathypelagic zone was excluded for all

transcript analysis, because no metatranscriptomes were available for Malaspina samples). Biofilm

formation is essential for surface attachment, so the abundance of biofilm-associated ORFs was

used to quantify the degree to which a microbial community relied on a particle-associated lifestyle

(the database of genes used to identify putative biofilm ORFs is shown in **Table S3**).

In samples from the mesopelagic zone, the average transcript abundance of biofilm-

associated ORFs was doubled (95% CI: 1.70 to 3.13) compared to samples from the surface and

DCM (**Fig. S3**). As with metagenomic abundance, transcript abundance of a target gene was defined

as the number of metatranscriptomic read hits divided by the total number of metatranscriptomic

reads in a sample. The high transcript abundance of biofilm-associated ORFs in the mesopelagic

zone suggested increased biofilm production and a shift toward a particle-associated lifestyle in the

deep ocean. This shift also manifested at the population level: the proportion of particle-associated

MAGs steadily increased with greater depth (**Fig. S4A**).

Biofilms on marine particles are thought to be hotspots for horizontal gene transfer and

transposase propagation [21], and the prevalence of biofilm transcripts offers a promising

explanation for the elevated transposase abundance in the deep ocean. In both metagenomic and

metatranscriptomic samples, the abundance of transposases and biofilm-associated ORFs were

strongly correlated (**Fig. 2A, 2B**). After controlling for depth and sample region, the abundance of

biofilm-associated ORFs still explained a significant amount of the variation in transposase

abundance: incorporating biofilm DNA abundance increased R^2 by 0.219 to 0.616 in metagenomes

(ANOVA $P < 2.2 \times 10^{-16}$); incorporating biofilm RNA abundance increased R^2 by 0.152 to 0.519 in

metatranscriptomes (ANOVA $P < 1.9 \times 10^{-12}$). Correlations in metagenomes and metatranscriptomes

suggested that transposases spread more widely in microbial communities with a greater reliance on

a particle-associated lifestyle. After observing such trends at the community level, we sought to

determine if these trends hold true at a genome-resolved level to support our hypothesis that the

particle-associated lifestyle is a main driver for the high transposase abundance in the deep ocean.

Genome size and taxonomy are key factors to transposase abundance in populations.

To identify factors affecting transposase abundance at a genome-resolved level, we analyzed

1307 MAGs recovered from the *Tara* Oceans metagenomes [19] and 255 MAGs from the Malaspina

metatranscriptomes [18]. All MAGs in our analysis had percent completeness >70% and redundancy

<10% (both criteria were calculated with CheckM [22]). The transposase abundance in MAGs was

quantified by the percentage of transposase ORFs among all ORFs in the MAG (abbreviated as *%-*

transposase). Similar to metagenomes, MAGs from deep waters had higher transposase abundance

than MAGs from shallow waters. Specifically, MAGs from the mesopelagic and bathypelagic zones

had a mean %-transposase 6 times (95% CI: 5.38 to 6.57) that of MAGs from the surface and DCM.

138   Given the enrichment of transposase ORFs in deep water MAGs, we ask 3 questions: (1)

139   whether the depth-independent correlation between transposase abundance and the particle-

140   associated lifestyle persists in MAGs; (2) whether specific taxa encode more transposases than

141   others, and thus whether community composition plays a role in transposase abundance; and (3)

142   since larger genomes provide more neutral insertion sites for transposases [13, 23], whether genome

143   size correlates to transposase abundance in MAGs.

144   To categorize the lifestyle of each MAG as *planktonic*, *particle-associated* or *mixed*, we compared

each MAG's relative mapping of metagenomic reads from the small and large filters (see Methods).

Taxonomy was analyzed at a *class* level, and the *complete genome size* was estimated using the genome

length of a MAG divided by its estimated percent completeness. Although MAG assembly might

bias against MGEs [24] and the completeness of MAGs might be underestimated for rare taxonomy

groups [25, 26], we can still gain valuable insights by analyzing the distribution of transposase ORFs

in MAGs of various genome sizes.

151   After controlling for depth, we observed a positive correlation between the estimated

complete genome size of a MAG and its transposase abundance (**Table 1**), confirming previous

speculations that larger genomes were linked to high transposase abundance [10, 13]. While deep

water genomes were bigger (**Fig. 3A**), the particle-associated lifestyle correlated with greater

complete genome size in every depth (**Fig. 3B**). Bacterial genomes typically contain around 500

essential genes, so as genomes get larger, the risk of inactivating essential genes quickly decreases,

and transpositions are more tolerated [23]. Thus, the particle-associated lifestyle might facilitate

transposase propagation by reducing the distance between microbes, and by providing more

neutral/non-fatal MGE insertion sites via larger genome size [23]. However, the causal relationship

between genome size, transposase abundance and particle association remains unclear. It is worth

noting that the transposase abundance in MAGs peaked when the complete genome size reached 5

Mbp, but it stabilized or declined beyond the peak (**Fig. 3C**). A previous study has also reported a

decreased proportion of transposase ORFs after bacterial genomes surpass 6 Mbp in size [11].

However, most (88.8%) MAGs recovered from the *Tara* Oceans and Malaspina metagenomes were

under 5 Mbp, so the association between large genomes and high transposase abundance generally

held true.

Taxonomic class was also a key predictor of transposase abundance in MAGs (**Table 1**),

after controlling for depth, genome size and lifestyle. Under the same environment, some taxonomic

classes were more enriched in transposases than others (**Fig. 3D, E**). MAGs of the taxonomic

classes *Alpha-*, *Beta-*, *Gammaproteobacteria*, and *Actinobacteria* were enriched in transposases compared

to other MAGs (for each class with ≥10 MAGs, The %-transposase of MAGs in that class were

compared against those of all other MAGs; *t*-test *P* cutoff: 0.05). MAGs of *Flavobacteria*,

Acidimicrobidae, *Gemmatimonadetes*, *Marinisomatia*, and *SAR202-2* had low transposase abundance. Taxa

that were enriched/low in transposases mostly matched with previous studies [10, 11], except that

Actinobacteria had previously been reported to be low in transposase abundance.

The link between taxonomy and transposase abundance could partially be attributed to

depth. MAGs of transposase-enriched classes were more abundant in deep waters, and MAGs from

low-transposase classes were more abundant in shallow waters (2 χ^2-tests, both $P < 1\mathrm{x}10^{-6}$; **Fig.**

S4B). Thus, although community composition is a key covariate to transposase abundance, the

distribution of taxa is nonetheless linked to the depth of a microbial community.

181 **Relaxed selection does not explain transposase abundance in genomes.**

182   It is possible that transposases accumulate in deep ocean microbial populations as a result of

183 genetic drift, because those populations tend to be smaller in size [27] and experience slow growth

184 rate [28]. To examine this possibility, we tested whether the strength of selection on ORFs in

185 metagenomes correlated with their transposase abundances. We calculated the pN/pS ratio for

186 ORFs with ≥20x coverage in 50 randomly selected metagenomes from all four depths (see

187 Methods). pN/pS represents the proportion of nonsynonymous mutations to the proportion of

188 synonymous mutations, and characterizes selection at the level of the population, in contrast to

189 dN/dS, which characterizes selection between individual species [29–31].

190   In the *Tara* Oceans metagenomes (surface, DCM, mesopelagic), the pN/pS of ORFs was

191 similar between the planktonic and particle-associated size fractions. However, in the bathypelagic

192 metagenomes, the pN/pS of ORFs was higher in particle-associated samples than planktonic

193 samples (**Fig. S5**). Considering the planktonic filter size of 0.2-0.8 μm and large prefilter (20μm

194 mesh) in the Malaspina Expedition samples compared to the Tara Ocean samples, it is possible that

195 the high pN/pS in bathypelagic particle-associated samples is due in part to the inclusion of small

196 eukaryotes, which are generally 1-3 μm in diameter [32], though these were not detected in high

197 abundances in the Malaspina metagenomes.

198   In metagenomes from all depths, transposases had higher pN/pS than non-transposase

199 ORFs (4 t-tests on log-transformed pN/pS, all $P < 10^{-11}$; **Fig. 4A**). The high pN/pS of transposases

200 indicates relaxed selection pressure relative to the other ORFs on average. Moreover, ORFs from

201 deeper ocean layers had higher pN/pS than layers above (pN/pS of ORFs from BAT > MES >

202 DCM > SRF; 3 t-tests, all $P < 10^{-15}$; Fig. 4A). The high pN/pS of ORFs from the deeper layers

203 suggested relaxed selection pressure relative to ORFs from shallower layers, which was in agreement

204 with previous results [13]. The general explanation for such a trend is a slower replication rate, which

leads to smaller effective population sizes and a reduced selection effect in the deep ocean [12, 13].

However, further work is needed to substantiate this hypothesis.

Since transposases and deep-sea ORFs were both under relaxed selection, we tested whether

high transposase abundance correlated with relaxed selection at a genome-resolved scale. Mapping

of reads to each MAG represents variation within a microbial population, and the selection pressure

was measured by the median pN/pS of all ORFs in a MAG (a MAG needed at least 100 ORFs to be

included in the pN/pS calculation). After controlling for depth, we did not find any correlation

between the median ORF $pNpS$ of a MAG and its transposase abundance (**Fig. 4B**, ANOVA P =

0.85). Thus, although relaxed selection and transposase enrichment co-occur in deep oceans at a

community scale, we did not observe this trend on a genome-by-genome basis, suggesting that there

is not a direct connection between transposase abundance and relaxed selection at a genome-

resolved scale, and thus within individual microbial populations.

Transposons/integrons carry a high proportion of ORFs related to defense mechanisms

One important question regarding high transposase abundance in the deep sea is whether

these transposases are neutral or deleterious, or whether they perform important functions in the

genomes encoding them. In some cases, transposases are deleterious and proliferate as a result of

genetic drift [33], but transposases can also benefit the host by introducing functional and regulatory

genes [7, 21, 34, 35].

Transposases mediate the migration and integration of cassette sequences into host

genomes; a transposon or integron is the combination of a transposase and its cassettes. Thus,

cassette sequences are functionally similar to auxiliary metabolic genes (AMGs) [36], in that they are

carried by a selfish MGE (or viruses in the case of AMGs) to increase the fitness of the host and

therefore increase the fitness of the MGE.

To determine whether transposons in marine habitats carry advantageous genes, we began

by querying the functional categories of cassette sequences. The software package *Integron Finder [11]*

was used to locate cassettes on contigs; the program searches for the two palindromic flanking sites

necessary for transposase-mediated recombination as well as a nearby transposase/integrase. We

treated transposons and integrons as equivalent, due to the sequence and function similarity between

integrases and transposases [11]. We found 8,519 cassette ORFs from the co-assembled Malaspina

[18] and *Tara* Oceans [17, 19] metagenomes (see Methods). Only 27% of the cassette sequences

were assigned with a Clusters of Orthologous Genes (COG) annotation, which was a lower

annotation rate compared to other ORFs in the *Tara* Oceans (55-60%) and Malaspina (68%)

metagenomes.

Compared to the rest of the metagenome, cassettes were enriched in ORFs of the COG

categories "replication, recombination, and repair", "defense mechanisms", and "mobilome:

prophages, transposons" (**Fig. 5A**). Transposons/integrons were expected to be enriched in ORFs

related to the mobilome and replication/recombination. The prevalence of defense mechanism

cassettes was noteworthy: defense mechanisms accounted for 14.3% of known function calls in

cassettes, but only accounted for 2.47% of known function calls in non-cassette ORFs (*known* was

defined as all functional groups except "function unknown" and "general function prediction"). Out

of the 276 defense mechanism cassettes,123 of them encoded toxin/antitoxin genes. Since

transposases are more pervasive on particles, toxin and defense genes they carry would be useful in

competition and protection on crowded biofilms [37–40]. Moreover, the abundance of biofilm-

associated ORFs – indicative of particle attachment – strongly correlated with the abundance of

defense mechanism ORFs (**Fig. 5B**), after controlling for depth. Incorporating biofilm abundance

increased R^2 by 0.351 to 0.801 (ANOVA $P < 2.2 \times 10^{-16}$). Thus, if defense mechanism genes in

cassette sequences are conserved and expressed, this would substantiate the hypothesis that deep

ocean microbes benefit from novel genes introduced by integrons/transposons.

Conservation of defense mechanism ORFs in cassette sequences

To further investigate whether cassette sequences in transposons provide functional

advantages to the host, we examined selection pressure in cassette ORFs. We compared the pN/pS

of cassette ORFs to those of non-cassette ORFs in the metagenomes.

Out of 8519 identified cassette ORFs, 1286 and 477 ORFs from the *Tara* Oceans and

Malaspina metagenomes had sufficient coverage ($\geq$20x) to calculate pN/pS, respectively. The 97

percentile pN/pS ratio of all cassette ORFs was 4, which was used as the upper cutoff for our

subsequent pN/pS analysis. Then, we calculated the pN/pS for 500000 randomly selected non-

cassette ORFs from the *Tara* Oceans and Malaspina metagenomes, according to the ratio of cassette

ORFs described above (477:1286).

Non-cassette ORFs had lower pN/pS than cassette ORFs (*t*-test, $P < 2.2 \times 10^{-16}$, medians

were 0.137 and 0.283, respectively). Among cassette ORFs, those with COG function calls had

lower pN/pS than those without (**Fig. 6**). And cassette ORFs of the category defense mechanisms

had lower pN/pS than cassettes of other functional categories (**Fig. 6**). The low pN/pS of defense

mechanism cassettes suggested that they were under strong purifying selection, suggesting that they

provide a selective advantage to their hosts on densely populated biofilms.

Besides defense mechanisms, other cassette ORFs might also enhance host fitness. For

instance, cassettes related to "lipid transport and metabolism" and "amino acid transport and

metabolism" were under stronger selection than other ORFs carried by MGEs. The former had a

median pN/pS of 0.079 (n = 14), and the latter had a median pN/pS of 0.107 (n = 23); both were

lower than the median of 0.283 for cassette ORFs. Although these two categories were not as

abundant as defense mechanisms in cassettes (**Fig. 5**), their potential to exploit different organic

carbon sources may be beneficial for hosts dwelling in the rapidly changing environment of a

sinking particle.

Expression of transposase, biofilm, and defense mechanisms ORFs

In addition to examining the genetic potential of microbial communities through analysis of

the abundance of transposase, biofilm, and defense mechanism genes in metagenomes, it is also

helpful to examine the relative expression of these genes at different depths. Thus, we calculated the

RNA/DNA ratios (defined as the transcript abundance of a target gene divided by its gene

abundance) of biofilm, defense mechanisms, and transposase ORFs in each *Tara* Oceans sample

with paired metagenome and metatranscriptome (n = 132). Malaspina samples were excluded from

this analysis, because no metatranscriptomes were sequenced.

ORFs related to biofilms and defense mechanisms had greater RNA/DNA ratios in the

mesopelagic zone than in the surface and DCM (**Fig. 7A, B, and D**), demonstrating a greater need

for defensive genes as deep ocean microbial communities switch toward a particle-associated

lifestyle. In contrast, although transposases were more abundant in the mesopelagic zone, their

RNA/DNA ratios were similar across all depths (**Fig. 7C and D**). A possible explanation is that

although transposases are not upregulated, they sometimes carry beneficial cassette genes, which

tend to operate under purifying selection and are increasingly expressed in deep-sea microbial

genomes.

Conclusion

Our analysis suggests a cyclic interaction between the particle-associated lifestyle, expanded

genome size, and selection for defense mechanism genes to explain the increasing abundance of

transposases with depth (**Fig. 8**). From the surface to the bathypelagic zone, microbial communities

shift from a predominantly planktonic lifestyle toward a predominantly particle-associated lifestyle,

observed both in the literature [18, 41] and here via the increased transcript abundance of biofilm-

associated ORFs in deeper oceans. On densely-populated biofilms, the close proximity between

microbes leads to resource competition and allows transposases to spread more rampantly. Particle-

associated microbes also tend to have larger genomes, which alleviate the danger from active

transposition activities disrupting essential genes [23]. Thus, deep-sea prokaryotic genomes sustain

high abundances of MGEs, allowing transposons to actively shape the ecology of microbial biofilm

communities with the novel genes they introduce. Specifically, cassette sequences are enriched in

defense mechanism genes, which are highly conserved and can benefit microbes engaging in the

intense competition on biofilms [37, 39]. Altogether, transposons not only exploit the dense

microbial population on particles to propagate but also contribute functional genes that help hosts

compete in such an environment.

Investigating the elevated transposase abundance in the deep ocean is crucial for

understanding gene flow, competition, and other ecological characteristics of the dark ocean, one of

the largest habitats on Earth. Here, we show a strong association between transposase abundance

and the particle-associated lifestyle, suggesting that transposons can enable microbial lineages to

compete in crowded biofilm-associated habitats. We did not find correlation between the strength of

selection and transposase abundance at a genome-resolved scale, so the relaxed selection pressure is

unlikely to be the primary driver for the high transposase abundance in the deep ocean. Overall, our

results reveal an emerging picture of the ocean as a stratified system in which the deep ocean acts as

a gene sharing highway with increased networks of gene exchange, particularly on particles, resulting

in large and defensively-oriented genomes in the deep-sea microbial communities, compared to the

streamlined and specialized genomes that dominate the surface oceans.

Materials and Methods

Analysis of the Ocean Microbial Reference Catalog v2 (OM-RGC.v2) from the *Tara* Oceans

Project. OM-RGC.v2 contained 47 million non-redundant open reading frames (ORFs) [16, 17],

and the coverage of each ORF in every metagenomic (n = 187) and metatranscriptomic (n = 180)

sample (website). We identified transposases and biofilm-associated ORFs in OM-RGC.v2 through

TBLASTN (e-value cutoff of 10^{-5}). The transposase database contained "transposase" and

"integrase" genes from the Pfam database [42] (Table S1), and the biofilm database contained

representative genes for *lapABCE*, *csgABCD*, *pelABCD*, t*apAB*, *tasAB*, *esp*, and *FapC* [43] from the

KEGG and UniProt database [44, 45] (Table S3). We identified ORFs of the "defense mechanisms"

category through COG annotations in OM-RGC.v2. Finally, the coverage data in OM-RGC.v2 was

used to determine the relative abundance of a target gene in a sample.

Mapping and calculating *pN/pS* ratios. To assess the strength of selection of target ORFs, we

calculated the *pN/pS* ratio (the proportion of nonsynonymous mutations over the proportion of

synonymous mutations) for all ORFs. To do this, we mapped the metagenomic reads against the

assembled contigs for each metagenome. Metagenomic reads of the *Tara* Oceans Project and

Malaspina Expedition were downloaded from the European Nucleotide Archive (ENA) under study

accessions PRJEB402 and PRJEB44456, respectively. Methods for sample collection and Illumina

sequencing were described by Sunagawa *et al.* [17] for the *Tara* Oceans Project and Acinas *et al.* [18]

for the Malaspina Expedition. For the assembled contigs used as references for mapping of the *Tara*

Oceans metagenomes, we downloaded (website) 10 existing co-assembled metagenomes from the

10 oceanic provinces [19]. For the reference contigs of the Malaspina metagenomes, we downloaded

(website) the co-assembled metagenome of all 58 samples [18]. We mapped the raw reads of each of

the *Tara* Oceans metagenomes to the co-assembly from their corresponding provinces, and all raw

reads of each of the Malaspina metagenomes to one co-assembled metagenome using Bowtie2 [46]

(v2.2.9; paired-end alignment with default parameters). We calculated pN/pS using anvi'o [47] with

the script "anvi-script-calculate-pn-ps-ratio" with the "--min-coverage" flag set to 20.

Calculating pN/pS ratios for individual metagenomes. The co-assembled *Tara* Oceans

metagenomes merged samples of all depths in an oceanic province [19]. To analyze pN/pS at

different depths, we selected 10 individual *Tara* Oceans metagenomes from each of the surface,

DCM, and mesopelagic zone, and 30 individual metagenomic assemblies (Table S4) were

downloaded from ENA. We also separately assembled 20 individual metagenomes (Table S4) from

the Malaspina Expedition using MEGAHIT (v1.1.3; paired-end assembly with default parameters).

We doubled the number of samples because bathypelagic assemblies yielded fewer ORFs than those

from the *Tara* Oceans. Using the same procedures to calculate pN/pS in co-assembled

metagenomes, we calculated the pN/pS ratios in individual metagenomes, except that reads in each

sample mapped back only to its own assembly.

Determination of MAG's depth and lifestyles. MAGs that originated from co-assemblies in a

specific province in the *Tara* Oceans dataset (*e.g.*, Red Sea), as in Tully *et al.* [19], were used to recruit

reads from all *Tara* Oceans samples (n = 180) using Bowtie2 (default parameters). Each province

was performed separately. SAM files were converted to BAM files using samtools [48] and used to

determine RPKM (reads per kilobase pair MAG per Million pair metagenome) as in Graham et al.

[49].

To assign the depth origin of a MAG from the *Tara* Oceans metagenomes, we summed up

its RPKM in surface, DCM, and mesopelagic samples (3 groups, separately). The layer with the

highest sum RPKM was the depth of that MAG. All Malaspina MAGs belonged to the bathypelagic

layer.

To assign the lifestyle of a *Tara* Oceans MAG, we calculated its sum RPKM in samples of

0.2-1.6 μm and 0.2-3 μm size fractions (2 groups, separately). A MAG was designated as *particle-*

associated if its sum RPKM in 0.2-3 μm samples was >2x greater than that in 0.2-1.6 μm samples. A

MAG was *planktonic* if its sum RPKM in 0.2-1.6 μm samples was >2x greater than that in 0.2-3 μm

samples. MAGs that were not particle-associated or planktonic were designated as *mixed.* Malaspina

samples (n = 58) had size-fractions of 0.2-0.8 μm and 0.8-2 μm, but the same method was used to

determine the lifestyle of Malaspina MAGs.

Integron and cassette sequences detection. We used Integron Finder (v2) [11] to identify

cassette sequences from the *Tara* Ocean and Malaspina metagenomes. Integron Finder uses

HMMER to locate the integron-integrase *intI*, which is conserved for most integrons. Then, cassette

sequences are identified with the near-palindromic flaking regions. Anvi'o [47] was used to identify

and annotate ORFs on metagenomic contigs using the script 'anvi-run-ncbi-cogs.' If the anvi'o ORF

calls from Prodigal [50] were within 100bps (start and stop) of the Integron Finder's cassette calls,

the anvi'o COG annotations were used for those cassette ORFs.

Statistical analysis

We used two-tailed *t*-tests to compare the differences between means of two variables, and statistical

significance was assumed $P < 0.05$. The metagenomic/metatranscriptomic abundances, pN/pS

ratios, and RNA/DNA ratios were log transformed before any statistical analysis. All analyses were

performed using base R packages (v4.0.2).

Code and data availability.

All Python, R scripts, code explanation, and raw data for analysis are publicly accessible on GitHub at https://github.com/carleton-spacehogs/transposase-deep-ocean.

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Competing Interest

The authors declare that they have no financial or non-financial competing interests.

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Figure Legends:

Fig. 1: Samples from the deep ocean and the particle-associated size fraction have higher transposase abundance. The abundance of transposase ORFs in metagenomic samples from the *Tara* Oceans and Malaspina Expedition, separated by depth and filter size fraction. SRF: surface; DCM: deep chlorophyll maximum; MES: mesopelagic zone; BAT: bathypelagic zone. For *Tara* Oceans metagenomes, the *particle-associated* size fraction was 0.22-3.0 μm, and *planktonic* was 0.22-1.6 μm. For Malaspina metagenomes, the particle-associated size fraction was 0.8-20 μm, and planktonic was 0.2-0.8 μm. The widths of the boxplots reflect the sample count in each category (counts were shown on the right).

Fig. 2: The gene potential (DNA) and transcript abundance (RNA) of transposases correlates with those of biofilm genes in all depths except the bathypelagic zone. **A** The correlation between the abundance of transposases and biofilm-associated ORFs in metagenomes (n = 236), separated by depths. **B** The same correlation in metatranscriptomes (n = 181).

Table 1: Multiple Stepwise Regression for log-transformed transposase abundance, *log(%-transposase)*, of 1562 previously generated MAGs. An ANOVA test was performed on each newly added covariate. ***depth:taxon**: the interaction term between depth and taxonomy. ***gsize***:* the estimated complete genome size of a MAG.

Fig. 3: Deep-sea and particle-associated microbial populations tend to have larger genomes, which correlate with high transposase abundance in those populations. **A** The estimated complete genome size of MAGs (complete genome size = number of base pairs in a MAG / % completeness),

grouped by depth. Numbers on box plots indicated the count of MAGs in each group. **B** The

estimated complete genome size of MAGs, grouped by depth and lifestyle. The boxplot's width

reflects the number of MAGs in each group. **C** The transposase abundance in MAGs, grouped by

depth and complete genome size. **D,E** Individual classes of MAGs grouped by depth and lifestyle.

See Methods for the determination of depth and lifestyle of a MAG.

Fig. 4: The co-occurrence of relaxed selection pressure and high transposase abundance in deep

ocean microbial communities does not support a correlation between the two at a genome-resolved

basis. **A** The pN/pS ratio of ORFs in metagenomes, grouped by depth and whether this ORF was a

transposase. The number on the right denotes the count of ORFs in each group. **B** The relationship

between the selection pressure (median pN/pS) and the transposase abundance of a MAG,

separated by depth. Only MAGs with $\geq 100 \, pN/pS$ were computed for median pN/pS.

Fig. 5: Cassette sequences include high proportions of defense mechanism genes, which are more

abundant in microbial communities that rely heavily on biofilms. **A** The distribution of COG

functional categories in cassette and metagenome ORFs. *TM: transport and metabolism. 1951

cassette ORFs with COG function calls were identified from the 10 co-assembled *Tara*

metagenomes, and 359 from the co-assembled Malaspina metagenome. 5 million ORFs with COG

function calls were then sampled from the *Tara* Oceans and Malaspina metagenomes according to

the ratio of identified cassettes described above. **B** The correlation between the abundance of

biofilm-associated and defense mechanism ORFs, separated by depth.

Fig. 6: The pN/pS for non-cassette ORFs and different categories of cassette ORFs. 2-tailed *t*-tests

were performed on log-transformed pN/pS. *** $P < 0.001$, **** $P < 0.0001$.

Fig. 7: Genes related to biofilm and defense mechanisms are upregulated in the mesopelagic zone, but transposases are not. **A, B, C** Median metagenomic and metatranscriptomic abundance of biofilm-associated, defense mechanism, and transposase ORFs in each depth. Error bars reflect the 25 and 75 percentiles. Each sample had its metagenome and metatranscriptome sequenced. **D** Log-transformed RNA/DNA ratios of target genes in each sample, separated by depth. 2-tailed *t*-tests were performed on log-transformed RNA/DNA ratios. * $P < 0.05$, ** $P < 0.01$, *** $P < 0.001$.

Fig. 8: Linking a particle-associated lifestyle to the high abundance of transposons in the deep ocean.

Table 1. Multiple Stepwise Regression for log-transformed transposase abundance in MAGs.

Explanatory Variable(s)	P for F-test	Cumulative R^2
depth	2.2×10^{-16}	0.291
depth + genome size (gsize)	2.2×10^{-16}	0.473
depth + lifestyle	2.2×10^{-16}	0.371
depth + gsize + lifestyle	6.7×10^{-8}	0.486
(as above) + taxon	2.2×10^{-16}	0.593
(as above) + depth:taxon	0.00016	0.622
(as above) + gsize^2	1.3×10^{-8}	0.633