- Differential global distribution of marine picocyanobacteria gene 1
- clusters reveals distinct niche-related adaptive strategies 2
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### Abstract

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The ever-increasing number of available microbial genomes and metagenomes provide new opportunities to investigate the links between niche partitioning and genome evolution in the ocean, notably for the abundant and ubiquitous marine picocyanobacteria Prochlorococcus and Synechococcus. Here, by combining metagenome analyses of the Tara Oceans dataset with comparative genomics, including phyletic patterns and genomic context of individual genes from 256 reference genomes, we first showed that picocyanobacterial communities thriving in different niches possess distinct gene repertoires. We then managed to identify clusters of adjacent genes that display specific distribution patterns in the field (CAGs) and are thus potentially involved in the adaptation to particular environmental niches. Several CAGs are likely involved in the uptake or incorporation of complex organic forms of nutrients, such as guanidine, cyanate, cyanide, pyrimidine or phosphonates, which might be either directly used by cells, for e.g. the biosynthesis of proteins or DNA, or degraded into inorganic nitrogen and/or phosphorus forms. We also highlight the frequent presence of CAGs involved in polysaccharide capsule biosynthesis in Synechococcus populations thriving in both nitrogen- and phosphorusdepleted areas, which are absent in low-iron regions, suggesting that the complexes they encode may be too energy-consuming for picocyanobacteria thriving in these areas. In contrast, Prochlorococcus populations thriving in iron-depleted areas specifically possess an alternative respiratory terminal oxidase, potentially involved in the reduction of Fe(III) into Fe(II). Together, this study provides insights into how these key members of the phytoplankton community might behave in response to ongoing global change.

### **Significance Statement**

Picocyanobacteria face various environmental conditions in the ocean and numerous studies have shown that genetically distinct ecotypes colonize different niches. Yet the functional basis of their adaptation remains poorly known, essentially due to the large number of genes of yet unknown function, many of which have little or no beneficial effect on fitness. Here, by combining comparative genomics and metagenomics approaches, we have identified not only single genes but also entire gene clusters, potentially involved in niche adaptation. Although being sometimes present in only one or a few sequenced strains, they occur in a large part of

the population in specific ecological niches and thus constitute precious targets for elucidating the biochemical function of yet unknown niche-related genes.

# **Main Text**

### Introduction

During the last two decades the sequencing of a large number of microbial genomes (more than 425,000 were available in Genbank in July 2022) has allowed tremendous advances in the delineation of core, accessory and unique gene repertoires within closely related organisms by building clusters of likely orthologous genes (CLOGs) based on sequence homology (1–4). Although this approach was tentatively used to identify the genetic basis of niche adaptation, relatively few genes were identified as being specific to particular ecotypes and thus potentially involved in niche adaptation (5–9). Various reasons may underpin this difficulty to identify niche-specific genes by a mere comparative genomics approach. These include the still fairly low number of genomes available given extensive known microbial genomic diversity (10), a lack of ecological representation due to cultivation biases, a limited knowledge of physiological traits of sequenced strains and/or the imprecise delineation of ecotypes and of the limits of their realized environmental niches *sensu* (11), especially for lineages present in low abundance in the field (12–14).

An alternative to comparative genomics to better decipher the link between niche partitioning and genome evolution consists of using the rapidly growing number of metagenomes. Besides triggering the generation of numerous metagenome-assembled genomes (MAGs), allowing to fill the gap for yet uncultured microbial taxa and/or ecotypes (15, 16), metagenome recruitment analyses using reference genomes have also allowed scientists to identify spatial or temporal niche-specific genes (17–19). In this context, due to their abundance and ubiquity in the field and the numerous available genomes, single amplified genomes (SAGs) and MAGs, marine picocyanobacteria constitute highly pertinent models for these metagenomic recruitment approaches. The *Prochlorococcus* and *Synechococcus* genera are indeed the two most abundant members of the phytoplankton community, *Prochlorococcus* being restricted to the 40°S-50°N latitudinal band, while *Synechococcus* distribution extends from the equator to subpolar waters (20, 21). Furthermore, physiological and environmental studies have allowed

scientists to decipher their genetic diversity and their main physiological traits as well as to delineate ecotypes or Ecologically Significant Taxonomic Units (ESTUs), i.e., genetic groups within clades occupying a given ecological niche, notably using *Tara* oceans metagenomic data at the global scale (22). While three major ESTU assemblages were identified for *Prochlorococcus* in surface waters, whose distribution was found to be mainly driven by temperature and iron (Fe) availability, eight distinct assemblages were identified for *Synechococcus* depending on three main environmental parameters (temperature, Fe and phosphate availability). Nevertheless, few studies have so far integrated our wide knowledge of ecotype distributions and the genetic and functional diversity of these organisms to identify niche- and/or ecotype-specific genes based on their relative abundance in the field (12, 23–26). Furthermore, most of these previous studies have focused on the abundance of individual genes, or more rarely, on a few genomic regions with known functions, e.g. involved in nitrogen or phosphorus uptake and assimilation (27, 28).

Here, by using a network approach to integrate metagenome analyses of the *Tara* Oceans dataset and synteny of individual accessory genes in 256 reference genomes, MAGs and SAGs, we managed to identify clusters of adjacent genes that display specific distribution patterns along the *Tara* Oceans transect. This led us to the unveil niche- and/or ecotype-specific genomic regions, including several previously unreported and sometimes only present in a few or even single genomes, potentially involved in the adaptation to the main ecological niches occurring in the marine environment (N, P and/or Fe-limited as well as cold *vs.* warm areas). Delineation of these gene clusters also led us to predict the putative functions of previously uncharacterized genes in these genomic regions based on genes functionally annotated in the same cluster. Altogether, this study provides unique insights into the functional basis of microbial niche partitioning and the molecular bases of fitness in key members of the phytoplankton community.

### **Results and Discussion**

# Different picocyanobacterial communities exhibit distinct gene repertoires

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To analyze the distribution of Prochlorococcus and Synechococcus reads along the Tara Oceans transect, metagenomic reads corresponding to the bacterial size fraction were recruited against 256 picocyanobacterial reference genomes, including 178 whole genome sequences (WGS), and a selection of 48 SAGs and 30 MAGs, primarily representative of still uncultured lineages (e.g. Prochlorococcus HLIII-IV, Synechococcus EnvA or EnvB). This yielded a total of 1.07 billion recruited reads, of which 87.7% mapped onto Prochlorococcus genomes and 12.3% onto Synechococcus ones, which were then functionally assigned by mapping them on the manually curated Cyanorak v2.1 CLOG database (29). In order to identify picocyanobacterial genes potentially involved in niche adaptation, we analyzed the distribution across the oceans of flexible genes (i.e., non-core genes in Cyanorak Prochlorococcus and Synechococcus reference genomes). Tara Oceans stations were first clustered according to the relative abundance of flexible genes. This clustering resulted in three well-defined clusters for Prochlorococcus (left tree in Fig. 1A), which matched quite well those obtained when stations were clustered according to the relative abundance of Prochlorococcus ESTUs, as assessed using the highresolution marker gene petB, encoding the cytochrome  $b_6$  (right tree in Fig. 1A; see also (22)). Only a few discrepancies can be observed between the two trees, including stations TARA-070 that displayed one of the most disparate ESTU compositions and TARA-094, dominated by the rare HLID ESTU (Fig. 1A). For Synechococcus, there was also a good consistency between dendrograms obtained from flexible gene abundance and relative abundance of ESTUs (Fig. 1B). Of the eight assemblages of stations discriminated based on the relative abundance of ESTUs (Fig. 1B), most were retrieved in the clustering based on flexible gene abundance, except for a few intra-assemblage switches between stations, notably those dominated by ESTU IIA (Fig. 1B). Despite these few variations between Synechococcus trees, four major clusters can be clearly delineated in both trees, corresponding to four broadly defined ecological niches, namely i) cold, nutrient-rich, pelagic or coastal environments (blue and light red in Fig. 1B), ii) Fe-limited environments (purple and grey), iii) temperate, P-depleted, Fe-replete areas (yellow) and iv) warm, N-depleted, Fe-replete regions (dark red). This correspondence between taxonomic and functional information was also confirmed by the high congruence between distance matrices based on ESTU relative abundance and on CLOG relative abundance (p-value < 10<sup>-4</sup>, mantel test r=0.84 and r=0.75 for *Synechococcus* and *Prochlorococcus*, respectively; dataset 1-4). Altogether, this indicates that distinct picocyanobacterial communities, as assessed based on a single taxonomic marker, also display different gene repertoires. As previously suggested for *Prochlorococcus* (30), this strong correlation between taxonomy and gene content strengthens the idea that, in both genera, the evolution of the accessory genome mainly occurs by vertical transmission, with a relatively low extent of lateral gene transfer.

### Distribution of flexible genes is tightly linked to environmental parameters and ESTUs

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In order to reduce the amount of data and better interpret the global distribution of picocyanobacterial gene content, a correlation network of genes was built for each genus based on relative abundance profiles of genes across Tara Oceans samples. Its analysis emphasized four main modules of genes for Prochlorococcus (Fig. S1A) and five main modules for Synechococcus (Fig. S1B), each gene module being abundant in a different set of stations. These modules were then associated with the available environmental parameters (Figs. 2A-B) and to the relative abundance of *Prochlorococcus* or *Synechococcus* ESTUs at each station (Figs. 2C-D). For instance, the Prochlorococcus brown module was strongly correlated with nutrient concentrations, particularly nitrate and phosphate, and strongly anti-correlated with Fe availability (Fig. 2A). This module thus corresponds to genes preferentially found in Fe-limited high-nutrient low-chlorophyll (HNLC) areas. Indeed, the brown module eigengenes (Fig. S1A), representative of the abundance profiles of genes of this module at the different Tara Oceans stations, showed the highest abundances at stations TARA-100 to 125, localized in the South and North Pacific Ocean, as well as at TARA-052, a station located close to the northern coast of Madagascar and likely influenced by the Indonesian throughflow originating from the tropical Pacific Ocean (22, 31). Furthermore, the correlation of the Prochlorococcus brown module with the relative abundance of ESTUs at each station showed that it is also strongly associated with the presence of HLIIIA and HLIVA (Fig. 2C), previously shown to constitute the dominant Prochlorococcus ESTUs in low-Fe environments (22, 32, 33) but also the LLIB ESTU, found to dominate the LLI population in these low-Fe areas (22). Altogether, this example and analyses of all other Prochlorococcus and Synechococcus modules (SI Text1) show that the communities colonizing cold, Fe-, N- and/or P-depleted niches possess specific gene repertoires potentially involved in their adaptation to these peculiar environmental conditions.

### Identification of individual genes potentially involved in niche partitioning

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In order to identify flexible genes related to particular environmental conditions and to specific ESTU assemblages, we correlated relative abundance profiles of each gene to the eigengene vector of its corresponding module in order to identify the most representative genes of each module and thus the genes specifically present (or absent) in a given set of stations (Dataset 5, Figs. 3 and S2). Most genes retrieved this way encode proteins of unknown or hypothetical function (85.7% of 7,485 genes). Still, among the genes with a functional annotation (Dataset 6), a large fraction seems to have a function related to their realized environmental niche (Figs. 3 and S2). For instance, many genes involved in the transport and assimilation of nitrite and nitrate (nirA, nirX, moaA-C, moaE, mobA, moeA, narB, M, nrtP; all part of the same genomic island: Pro\_Gl004; (9)) as well as cyanate, an organic form of nitrogen (cynA, B, D, S; part of Pro\_GI033), are enriched in the Prochlorococcus blue module, which is correlated with the HLIIA-D ESTU and to low inorganic N, P and Si levels and anti-correlated with Fe availability (Fig. 2A-C). This is consistent with previous studies showing that while few *Prochlorococcus* strains in culture possess the nirA gene and even less the narB gene, natural Prochlorococcus populations inhabiting N-poor areas do possess one or both of these genes (34–36). Similarly, numerous genes among the most representative genes of Prochlorococcus brown, red and turquoise modules are related to adaptation of HLIIIA/IVA, HLIA and LLIA ESTUs to Fe-limited, cold Plimited and cold, mixed waters, respectively (Fig. 3), and comparable results were obtained for Synechococcus, although the niche delineation was fuzzier than for Prochlorococcus at the module level (Fig. S2). These results therefore constitute a proof of concept that this network analysis was able to retrieve niche-related genes from metagenomics data.

# Identification of CAGs potentially involved in niche partitioning

In order to better understand the function of niche-related genes, notably the numerous ones encoding conserved hypothetical proteins, we then integrated these data with knowledge on the gene synteny in reference genomes using a network approach (Datasets 7 and 8). This led us to identify clusters of adjacent genes in reference genomes, several not previously reported in the literature, encompassing genes with similar distribution and abundance *in situ* and thus

potentially involved in the same metabolic pathway (Figs. 4, S3 and S4; Dataset 6). Hereafter, these ecologically representative clusters of adjacent genes will be called 'CAGs'.

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Regarding nitrogen, the well-known nitrate/nitrite gene cluster involved in uptake and assimilation of inorganic forms of nitrogen (see above) is present in most Synechococcus genomes (Dataset 6) and expectedly not restricted to a particular niche in natural Synechococcus populations, as shown by its quasi-absence from Weighted Correlation Network Analysis (WGCNA) modules. In Prochlorococcus, this cluster is separated into two CAGs, most genes being included in ProCAG 002, present in only 13 out of 118 Prochlorococcus genomes, while nirA and nirX form an independent CAG (ProCAG 001) due to their presence in many more genomes. Both CAGs are particularly enriched in Prochlorococcus populations thriving in low-N areas (Fig. S5A-B), as previously demonstrated by several authors (34–36). In Prochlorococcus, the quasi-core ureA-G/urtB-E genomic region was also found as a CAG (ProCAG\_003) since it was comparatively impoverished in low-Fe compared to other regions (Fig. S5C-D) in agreement with its presence in only two out of six HLIII/IV genomes. In addition, we also uncovered several other Prochlorococcus and Synechococcus CAGs that seem to be involved in the transport and/or assimilation of more unusual and/or complex forms of nitrogen, including guanidine, cyanate, cyanide and possibly pyrimidine, which might either be degraded into elementary N, P or Fe molecules or possibly directly used by the cells for e.g. the biosynthesis of proteins or DNA. Indeed, we detected in both genera a CAG (ProCAG\_004 and SynCAG\_001; Figs. S6A-B, Dataset 6) that encompasses speB2, an ortholog of Synechocystis PCC 6803 sll1077, previously annotated as encoding an agmatinase (23, 37) and which was recently characterized as a guanidinase that degrades guanidine rather than agmatine to urea and ammonium (38). Interestingly E. coli, and likely other microorganisms as well, produce guanidine under nutrient-poor conditions, suggesting that guanidine metabolism is biologically significant and prevalent in natural environments (38, 39). Furthermore, the ykkC riboswitch candidate, which was shown to specifically sense guanidine and to control the expression of a variety of genes involved in either guanidine metabolism or nitrate, sulfate, or bicarbonate transport, is located immediately upstream of this CAG in Synechococcus reference genomes, all genes of this cluster being predicted by RegPrecise 3.0 to be regulated by this riboswitch (Fig. S6C; (39, 40)). The presence of hypA and B homologs within this CAG furthermore suggests that, in the presence of guanidine, the latter could be involved in the insertion of Ni<sub>2</sub><sup>+</sup>, or another metal

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cofactor, in the active site of guanidinase. Additionally, we speculate that the next three genes encoding an ABC transporter, similar to the TauABC taurine transporter in *E. coli* (Fig. S6C), could be involved in guanidine transport in low-N areas. Of note, the presence of a gene encoding a putative Rieske Fe-sulfur protein (CK\_00002251), downstream of this gene cluster in most *Synechococcus/Cyanobium* genomes possessing this CAG, seems to constitute a specificity compared to its homologs in *Synechocystis* sp. PCC 6803 and might explain why this CAG is absent from picocyanobacteria thriving in low-Fe areas, while it is present in a large proportion of the population in most other oceanic areas (Figs. S6A-B).

As concerns compounds containing a cyano radical (CIN), the cyanate transporter genes (cynABD) are scarce in both Prochlorococcus (present only in two HLI and five HLII genomes) and Synechococcus genomes (mostly in clade III strains; (9, 41, 42)). In the field, a small proportion of the Prochlorococcus community possesses the corresponding CAG (ProCAG 005; Fig. S7A-B), also including the conserved hypothetical gene CK 00055128, in warm, Fe-replete waters, while these genes were not included in a module, and thus not in a CAG, in Synechococcus (Dataset 6; Fig. S7C). Interestingly, we also uncovered a 7-gene CAG (ProCAG 006 and SynCAG 002), encompassing a putative nitrilase gene (nitC), which also suggests that most Synechococcus cells and a more variable proportion of the Prochlorococcus population could use nitriles or cyanides in warm, Fe-replete waters and more particularly in low-N areas such as the Indian Ocean (Fig. 5A-B). The whole operon (nitHBCDEFG; Fig. 5C), called Nit1C, was shown to be upregulated in the presence of cyanide and to trigger an increase in the rate of ammonia accumulation in the heterotrophic bacterium Pseudomonas fluorescens (43), suggesting that like cyanate, cyanide could constitute an alternative nitrogen source in marine picocyanobacteria as well. Yet, given the potential toxicity of these CNN-containing compounds, we cannot exclude that these CAGs could also be devoted to cell detoxification (39, 41), as it is the case for arsenate and chromate (44, 45), which act as analogs of phosphate and sulfate respectively, and are toxic to marine phytoplankton (46).

Also noteworthy is the presence of a CAG encompassing asnB, pyrB2 and pydC (ProCAG\_007, SynCAG\_003, Fig. S8), which could contribute to an alternative pyrimidine biosynthesis pathway and thus provide another way for cells to recycle complex nitrogen forms. While this CAG is found in only one fifth of HLII genomes and in quite specific locations for

Prochlorococcus, notably in the Red Sea, it is found in most *Synechococcus* cells in warm, Fereplete, N and P-depleted niches, consistent with its phyletic pattern showing its absence only from most clade I, IV, CRD1 and EnvB genomes (Fig. S8; Dataset 6). More generally, most Nuptake and assimilation genes in both genera were specifically absent from Fe-depleted areas, including the *nirA/narB* CAG for *Prochlorococcus*, as mentioned by Kent et al. (30) as well as guanidinase and nitrilase CAGs. In contrast, picocyanobacterial populations present in low-Fe areas possess, in addition to the core ammonium transporter *amt1*, a second transporter *amt2*, also present in cold areas for *Synechococcus* (Fig. S9). Additionally, *Prochlorococcus* populations thriving in HNLC areas also possess two amino acid-related CAGs that are quasi-core in *Synechococcus*, the first one involved in polar amino acids N-II transport system (ProCAG\_008; *natF-G-H-bgtA*; (47); Fig. S10A-B) and the second one (*leuDH*, *soxA*, CK\_00001744, ProCAG\_009, Fig. S10C-D) that notably encompasses a leucine dehydrogenase, able to produce ammonium from branched-chain amino acids. Thus, the primary nitrogen sources for picocyanobacterial populations dwelling in Fe-limited areas seem to be ammonium and amino acids.

Adaptation to phosphorus depletion has been well documented in marine picocyanobacteria showing that while in P-replete waters Prochlorococcus and Synechococcus essentially rely on inorganic phosphate acquired by core transporters (PstABC), strains isolated from low-P regions and natural populations thriving in these areas additionally contain a number of accessory genes related to P metabolism, located in specific genomic islands (9, 25-28, 48). Here, we indeed found that virtually the whole Prochlorococcus population in the Mediterranean Sea, the Gulf of Mexico and the Western North Atlantic Ocean, which are known to be P-limited (26, 49), contained the *phoBR* operon (ProCAG\_010, Fig. S11A-B) that encodes a two-component system response regulator, as well as the ProCAG 011, including the alkaline phosphatase phoA. By comparison, in Synechococcus, we only identified the phoBR CAG (SynCAG 005, Fig. S11C) that is systematically present in warm waters whatever their limiting nutrient, in agreement with its phyletic pattern in reference genomes showing its specific absence from cold thermotypes (clades I and IV, Dataset 6). Furthermore, although our analysis did not retrieve them within CAGs due to the variability of the content and order of genes in this genomic region, even within each genus, several other P-related genes were enriched in low-P areas but interestingly partially differed between Prochlorococcus and Synechococcus (Figs. S11,

3, S2 and Dataset 6). While the genes putatively encoding a chromate transporter (ChrA) and an arsenate efflux pump ArsB were present in both genera in different proportions, a putative transcriptional phosphate regulator related to PtrA (CK\_00056804; (50)) was specific to *Prochlorococcus*. *Synechococcus* in contrast harbors a large variety of alkaline phosphatases (PhoX, CK\_00005263 and CK\_00040198) as well as the phosphate transporter SphX (Fig. S11).

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A second alternative P form are phosphonates, i.e. reduced organophosphorus compounds containing C-P bonds, which constitute up to 25% of the high-molecular-weight dissolved organic P pool in the open ocean (51). Indeed, the quasi-totality of the *Prochlorococcus* population of the most P-limited areas of the ocean possess, additionally to the core phosphonate ABC transporter (phnD1-C1-E1), a second previously unreported putative phosphonate transporter (phnC2-D2-E2-E3; ProCAG 012; Fig. 6A), while these genes are only present in a few Prochlorococcus (including MIT9314) and no Synechococcus genomes. Furthermore, as previously mentioned in several studies (52-54), a fairly low proportion of Prochlorococcus populations thriving in low-P areas also possess a gene cluster encompassing the phnYZ operon, involved in C-P bond cleavage, the putative phosphite dehydrogenase ptxD as well as the phosphite and methylphosphonate transporter ptxABC (ProCAG 0013, Dataset 6, and Fig. 6B, (54-56)). Compared to these previous studies that mainly reported the presence of these genes in Prochlorococcus cells from the North Atlantic Ocean, here we show that they actually occur in a much larger geographic area, including the Mediterranean Sea, the Gulf of Mexico and the ALOHA station (TARA 132) in the North Pacific, and are also present in an even larger proportion of the Synechococcus population (Fig. S12, Dataset 6). Interestingly, Synechococcus cells from the Mediterranean Sea, dominated by clade III, seem to lack phnYZ, in agreement with the phyletic pattern of these genes in reference genomes, showing the absence of this two-gene operon in the sole clade III strain that possesses the ptxABDC gene cluster. In contrast, the presence of the complete gene set (ptxABDC-phnYZ) in the North Atlantic and at the entrance of the Mediterranean Sea as well as in several clade II reference genomes rather suggests that it is primarily attributable to this specific clade. Altogether, our data indicate that at least part of the natural populations of both Prochlorococcus and Synechococcus would be able to assimilate phosphonate and phosphite as alternative P-sources in low-P areas using the ptxABDC-phnYZ operon. Yet, the fact that no picocyanobacterial genome except P. marinus RS01

(Fig. 6C) possesses both *phnC2-D2-E2-E3* and *phnYZ*, raises the question of how the phosphonate taken up by the *phnC2-D2-E2-E3* transporter is metabolized in these cells. Finally, although the Mediterranean Sea is not known to be N-limited, all reference clade III genomes possess a complete set of genes involved in the assimilation of organic nitrogen (Dataset 6), suggesting that at least part of these organic nutrients might also be a source of organic phosphorus.

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As for macronutrients, it has been hypothesized that the survival of marine picocyanobacteria in low-Fe regions was made possible through several strategies, including the elimination from the genomes of genes encoding proteins that contain Fe as a cofactor, the replacement of Fe by another metal cofactor, and the acquisition of genes involved in Fe uptake and storage (24, 25, 30, 33, 57). Accordingly, several CAGs encompassing genes encoding proteins interacting with Fe were found in the present study to be anti-correlated with HNLC regions in both genera. These include three subunits of the (photo)respiratory complex succinate deshydrogenase (SdhABC, ProCAG 014, SynCAG 006, Fig. S13; (58)) as well as Fecontaining proteins encoded in most of the abovementioned CAGs involved in N or P metabolism, such as the guanidinase CAG (Fig. S6), the NitC1 CAG (Fig. 5), the pyrB2 CAG (Fig. S8), the phosphonate CAGs (Figs. 6 and S12) and the urea and inorganic nitrogen CAGs (Fig. S5). Most Synechococcus cells thriving in Fe-replete areas also possess the sodT/sodX CAG (SynCAG 007, Fig. S14A-B) involved in nickel transport and maturation of the Ni-superoxide dismutase (SodN), these three genes being in contrast core in *Prochlorococcus*. Additionally, Synechococcus from Fe-replete areas, notably from the Mediterranean Sea and the Indian Ocean, specifically possess two CAGs (Syn CAG\_008 and 009; Fig. S14C-D), involved in the biosynthesis of a polysaccharide capsule that appear to be most similar to the E. coli groups 2 and 3 kps loci (59). These extracellular structures, known to provide protection against biotic or abiotic stress, were recently shown in Klebsiella to provide a clear fitness advantage in nutrientpoor conditions since they were associated with increased growth rates and population yields (60). Yet, while these authors suggested that capsules may play a role in Fe uptake, the significant reduction of the relative abundance of kps genes in low-Fe compared to Fe-replete areas (t-test p-value < 0.05 for all genes of the Syn CAG 008 and 009 except CK 00002157; Fig. S14C) and their absence in CRD1 strains (Dataset 6) rather suggests that these capsules may be too energy-consuming for some picocyanobacteria thriving in this peculiar niche, while they may have a meaningful and previously overlooked role in their adaptation to low-P and low-N niches.

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A number of CAGs were in contrast found to be enriched in populations dwelling in HNLC dominated by *Prochlorococcus* HLIIIA/HLIVA/LLIB and *Synechococcus* environments, CRD1A/EnvBA ESTUs (Fig. 2). For Prochlorococcus, this includes the abovementioned natFGH (ProCAG 008) and leudH/soxA (ProCAG 009) CAGs, involved in amino acid metabolism (Fig. S10), while a large proportion of the Synechococcus populations in these areas possess i) a large CAG involved in glycine betaine synthesis and transport (SynCAG 010, Fig. S15A-B; (9, 61)), almost absent from low-N areas, ii) a CAG encompassing a flavodoxin and a thioredoxin reductase (SynCAG 011, Fig. S15C-D), mostly absent from low-P areas, as well as iii) the nfeDfloT1-floT2 CAG (SynCAG 012, Fig. S16A-B) involved in the production of lipid rafts, potentially affecting cell shape and motility (9, 62). Both Prochlorococcus and Synechococcus thriving in low-Fe waters also possess the TonB-dependent siderophore uptake operon (fecDCAB-tonBexbBD, Dataset 6). The latter gene cluster, which is found in a few picocyanobacterial genomes and was previously shown to be anti-correlated with dissolved Fe concentration (24, 25, 57), is indeed systematically present in a significant part of the Prochlorococcus and Synechococcus population in low-Fe areas (ProCAG 015 and SynCAG 013-014, Fig. S17). However, it is also present in a small fraction of the populations thriving in the Indian Ocean, consistent with its occurrence in two Prochlorococcus HLII and one Synechococcus clade II genomes (Dataset 6). The most striking result in this category is that the vast majority of *Prochlorococcus* cells thriving in low-Fe regions possess a CAG encompassing the ctaC2-D2-E2 operon, also found in 85% of all Synechococcus reference genomes, including all CRD1 (Fig. 7; Dataset 6). This CAG encodes the alternative respiratory terminal oxidase ARTO, a protein complex that has been suggested to be part of a minimal respiratory chain in the cytoplasmic membrane, potentially providing an additional electron sink under Fe-deprived conditions (63, 64). Furthermore, a Synechocystis mutant in which the ctaD2 and ctaE2 genes had been inactivated was found to display markedly impaired Fe reduction and uptake rates as compared to wild-type cells, suggesting that ARTO is involved in the reduction of Fe(III) into Fe(II) prior to its transport through the plasma membrane via the Fe(II) transporter FeoB (65). Thus, the presence of the ARTO system appears

to represent a major and previously unreported adaptation for *Prochlorococcus* populations thriving in low-Fe areas.

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Besides genes involved in nutrient acquisition and metabolism, several *Prochlorococcus* and Synechococcus CAGs were found to be correlated with low-temperature waters. A closer examination of *Prochlorococcus* CAGs however, shows that their occurrence is not directly related to temperature adaptation but mainly explained by the prevalence at high latitude of either i) the HLIA ESTU (Fig. 2A, C and Fig. 4), the red module encompassing most of the abovementioned CAGs involved in P-uptake and assimilation pathways, or ii) the LLIA ESTU, present in surface waters at vertically-mixed stations, the turquoise module mainly gathering Prochlorococcus LL-specific genes, such as Pro\_CAG\_017, involved in phycoerythrin-III biosynthesis (ppeA, cpeFTZY, unk13) or ProCAG 018, encoding the two subunits of exodeoxyribonuclease VII (XseA-B). As concerns Synechococcus, although a fairly high number of CAGs were identified in the tan module associated with ESTUs IA and IVA-C (Fig. 2B, D and Fig. S4), only very few are conserved in more than two reference strains and/or have a characterized function (Dataset 6). Among these, at least one CAG is clearly related to adaptation to cold waters, the orange carotenoid protein (OCP) operon (ocp-crtW-frp; SynCAG\_016). Indeed, this operon is involved in a photoprotective process (66) and was recently shown to provide cells with the ability to deal with oxidative stress under cold temperatures (67). In agreement with the latter study, our data shows that Synechococcus populations colonizing mixed waters at high latitudes or in upwelling areas all possess the ocp CAG (Fig. S18), highlighting the importance of this photoprotection system in Synechococcus populations colonizing cold and temperate areas. Synechococcus populations thriving in cold waters also appear to be enriched in CAGs involved in gene regulation. This includes transcriptional regulators involved in the regulation of the CA4-A form of the type IV chromatic acclimation process (fciA-B; SynCAG 017), consistent with the predominance of Synechococcus CA4-A cells in temperate or cold environments (68–70)(Dataset 6) as well as the hidABC operon (SynCAG 018), involved in the synthesis of a secondary metabolite (hierridin C; (71)). Altogether, the fairly low number of 'strong' CAGs associated with temperature supports the hypothesis that adaptation to cold temperature is not mediated by evolution of gene content but rather of protein sequences (8, 9, 30, 72).

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In conclusion, our analysis of Prochlorococcus and Synechococcus gene distributions at the global scale using the deeply sequenced metagenomes collected along the Tara Oceans expedition transect revealed that each community has a specific gene repertoire, with different sets of accessory genes being highly correlated with distinct ESTUs and physicochemical parameters. As previously suggested for *Prochlorococcus* (30), this strong correlation between taxonomy and gene content strengthens the idea that, in both genera, genome evolution mainly occurs by vertical transmission and selective gene retention, with a fairly low extent of lateral gene transfer between clades. By combining information about gene synteny in 256 reference genomes with the distribution and abundance of these genes in the field, we further managed to delineate suites of adjacent genes likely involved in the same metabolic pathways that may have a crucial role in adaptation to specific niches. These analyses confirmed previous observations about the niche partitioning of individual genes and a few genomic regions involved in nutrient uptake and assimilation (24, 25, 27, 30, 34, 36). Most importantly, this network approach unveiled several novel genomic regions that could confer cells a fitness benefit in particular niches and also highlighted that some previously detected individual genes are part of larger genomic regions. It notably revealed the potential importance of the uptake and assimilation of organic forms of limiting nutrients, which might either be directly used by the cells, e.g. for the biosynthesis of proteins or DNA, or be degraded into inorganic N and/or P forms. Consistently, many CAGs potentially involved in the uptake and assimilation of complex compounds, such as guanidine, CIN-containing compounds or pyrimidine were present in both N- and P-depleted waters, and might constitute an advantage in areas of the world ocean colimited in these nutrients (26). In contrast, most of these CAGs were specifically absent from N and/or P-rich, Fe-poor areas ((30); this study). Adaptation to Fe-limitation seemingly relies on specific adaptation mechanisms including reduction of Fe<sup>3+</sup> to Fe<sup>2+</sup> using ARTO, Fe storage, Fe scavenging using siderophores as well as reduction of the iron quota and of energy-consuming adaptation mechanisms, such as polysaccharide capsule biosynthesis. Altogether, this study provides unique insights into the functional basis of microbial niche partitioning and the molecular bases of fitness in key members of the phytoplankton community. A future challenge will clearly consist of biochemically characterizing the function of the different genes, including many unknown, gathered in the above-mentioned CAGs (Datasets 5 and 6), which are sometimes present only in a few or even a single strain but can occur in a large part or even the whole *Prochlorococcus* and/or *Synechococcus* population *in situ*, and which likely all contribute to the same complex and/or metabolic pathway.

#### **Materials and Methods**

# Tara Oceans dataset

A total of 131 bacterial-size metagenomes (0.2-1.6  $\mu$ m for stations TARA\_004 to TARA\_052 and 0.2-3 $\mu$ m for TARA\_056 to TARA\_152), collected in surface from 83 stations along the *Tara* Oceans expedition transect (73), were used in this study. Briefly, all metagenomes were sequenced as Illumina overlapping paired reads of 100-108 bp and paired reads were merged and trimmed based on quality, resulting in 100-215 bp fragments, as previously described (22). All metagenomes and corresponding environmental parameters were retrieved from PANGAEA (www.pangaea.de/) except for Fe and ammonium concentrations that were modeled and the Fe limitation index  $\Phi_{\text{sat}}$  that was calculated from satellite data, as previously described (22).

### Recruitment and taxonomic and functional assignment of metagenomic reads

Metagenomic reads were first recruited against 256 reference genomes, including the 97 genomes available in the information system Cyanorak *v2.1* (www.sb-roscoff.fr/cyanorak; (28)) as well as 84 additional WGS, 27 MAGs and 48 SAGs retrieved from Genbank (Dataset 9). Recruitment was made using MMseqs2 Release 11-e1a1c (76) with maximum sensitivity (mmseqs search -s 7.5) and limiting the results to one target sequence (mmseqs filterdb --extract-lines 1). Using the same MMseqs2 options, the resulting reads were then mapped to an extended database of 978 genomes, including all picocyanobacterial reference genomes complemented with 722 outgroup cyanobacterial genomes downloaded from NCBI. Reads mapping to outgroup sequences or having less than 90% of their sequence aligned were filtered out and the remaining reads were taxonomically assigned to either *Prochlorococcus* or *Synechococcus* according to their best hit. Reads were then functionally assigned to a cluster of likely orthologous genes (CLOGs) from the information system Cyanorak *v2.1* based on the position of their MMseqs2 match on the genome, the coordinates of which correspond to a particular gene in the database. More precisely, a read was functionally assigned to a gene if at least 75% of its size was aligned to the reading frame of this gene and if the percentage identity

of the blast alignment was over 80%. Finally, read counts were aggregated by CLOG and normalized by dividing read counts by L-l+1, where L represents the average gene length of the CLOG and I the mean length of recruited reads. Only environmental samples that contained at least 2,500 and 1,700 distinct CLOGs for *Synechococcus* and *Prochlorococcus*, respectively, were kept, corresponding roughly to the average number of genes in a *Synechococcus* and a *Prochlorococcus* HL genome, respectively. After this filtration step, a CLOG was kept if it showed a gene-length normalized abundance higher than 1 (i.e., a gene coverage of 1) in at least 2 of the selected environmental samples. Then, large-core genes, as previously defined (9), were removed to keep only accessory genes. The resulting abundance profiles were used to perform co-occurrence analyses by weighted genes correlation network analysis, as detailed below (WGCNA, (74)).

# Station clustering and ESTU analyses

In order to cluster stations displaying similar CLOG abundance patterns, the abundance of a given CLOG in a sample was divided by the total CLOG abundance in this sample to obtain relative abundance profiles per sample. Bray-Curtis similarities were calculated from these profiles and used to cluster *Tara* Oceans stations with the Ward's minimum variance method (75). The same normalization method was applied to picocyanobacterial ESTUs that were defined based on the *petB* marker gene at each station using a similar approach as in Farrant *et al.* (2016) but using a Ward's minimum variance method (75) to be consistent with the clustering of CLOG profiles. In order to check whether the Bray-Curtis distances between stations based on *petB* picocyanobacterial communities and based on gene content were significantly correlated, a mantel test was performed between the distance matrices, as implemented in the R package *vegan* v2.5 with 9,999 permutations (76).

### Gene co-occurrence network analysis

A data-reduction approach based on WGCNA, as implemented in the R package WGCNA v1.51 (77), was used to build a co-occurrence network of CLOGs based on their relative abundance in *Tara* Oceans stations and to delineate modules of CLOGs (i.e., subnetworks). The WGCNA adjacency matrix was calculated in 'signed' mode (i.e., considering correlated and anti-correlated CLOGs separately), by using the *Pearson* correlation between pairs of CLOGs (based

on their relative abundance in every sample) and raising it to the power 12, which allowed to obtain a scale-free topology of the network. Modules were identified by setting the minimum number of genes in each module to 100 and 50 for *Synechococcus* and *Prochlorococcus*, respectively, and by forcing every gene to be included in a module. The *eigengene* of each module (representative of the relative abundance of genes of a given module at each *Tara* Oceans station) was then correlated to environmental parameters and to the relative abundance of ESTUs. Finally, genes in each module with the highest correlation to the *eigengene* (a measurement called 'membership'), were extracted in order to identify the most representative genes of each module.

# Identification of differentially distributed clusters of adjacent genes (CAGs)

Results on individual niche-related genes identified by WGCNA were then integrated with knowledge on gene synteny in reference genomes (Datasets 7 and 8). For each WGCNA module, we defined CAGs by searching adjacent genes of the module in the 256 reference genomes. In order to be considered as belonging to the same CAG, two genes of the same module must be less than 6 genes apart in 80% of the genomes in which these two genes are present. This led us to identify clusters of adjacent genes in reference genomes, comprising genes displaying a similar distribution pattern, called CAGs. A network of CAGs was then built for each WGCNA module, taking into account the number of genomes in which these genes are adjacent (Figs. 4, S3 and S4). An unweighted, undirected graph was drawn for each module according to the Fruchterman-Reingold layout algorithm implemented in the R package igraph. This is a force-directed algorithm, meaning that node layout is determined by the forces pulling nodes together and pushing them apart. In other words, its purpose is to position the nodes of a graph so that the edges of more or less equal length are gathered together and to avoid as many crossing edges as possible.

Data sharing plans: All genomic and metagenomic data used in this study are publicly available

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# **Figure Legends**

 Figure 1. Comparison of clustering based on relative abundance profiles of ecologically significant taxonomic units (ESTUs) and of flexible genes for both picocyanobacteria. A. *Prochlorococcus*. B. *Synechococcus*. Leaves of the trees correspond to stations along the Tara Oceans transect that are colored according to the code shown at the bottom of the trees, corresponding to ESTU assemblages as determined by Farrant et al. (2016) by clustering stations exhibiting similar ESTU relative abundance profiles shown here on the right of each tree. ESTUs were colored according to the palette below each panel. Dotted lines in dendrograms indicate discrepancies between tree topologies. Accessory genes correspond to all genes except those defined as large-core genes in a previous study (9). Of note, due to a slightly different clustering method (cf. materials and methods), assemblage 7 (dark grey stations in 1B), which was discriminated from assemblage 6 in the Farrant et al. (2016) now clusters with this assemblage. Abbreviations: IO, Indian Ocean; MS, Mediterranean Sea; NAO, North Atlantic Ocean; NPO, North Pacific Ocean; RS, Red Sea; SAO, South Atlantic Ocean; SO, Southern Ocean.

**Figure 2. Correlation of picocyanobacterial module eigengenes to physico-chemical parameters and ESTU abundance.** A, B. Correlation of module eigengenes to physico-chemical parameters for *Prochlorococcus* (A) and *Synechococcus* (B). C, D. Correlation of module eigengenes to relative abundance profiles of ESTUs *sensu* (Farrant et al., 2016). Pearson (A, B) and Spearman (B, D) correlation coefficient (R²) is indicated by the color scale. Each module is identified by a specific color and the number between brackets specifies the number of genes in each module. The *eigengene* is representative of the relative abundance of genes of a given module at each *Tara* Oceans station. Non-significant correlations (Student asymptotic p-value > 0.01) are marked by a cross. Φsat: index of iron limitation derived from satellite data. PAR30: satellite-derived photosynthetically available radiation at the surface, averaged on 30 days. DCM: depth of the deep chlorophyll maximum.

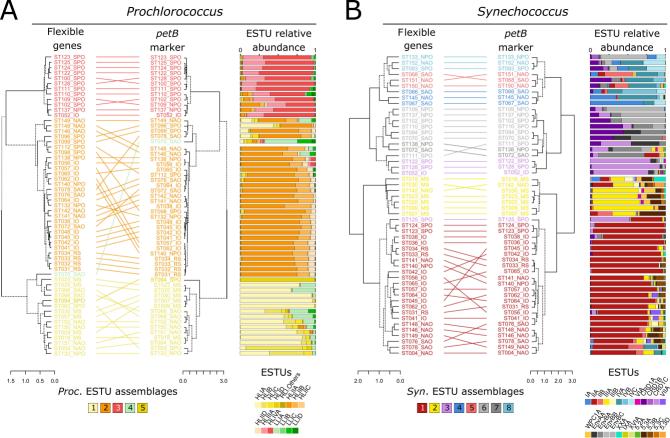
Figure 3. Violin plots highlighting the most representative genes of each *Prochlorococcus* module. For each module, each gene is represented as a dot positioned according to its correlation with the eigengene for each module, the most representative genes being localized on top of each violin plot. Genes mentioned in the text and/or in Dataset 6 have been colored according to the color of the corresponding module, indicated by a colored bar above each module. The text above violin plots indicates the most significant environmental parameter(s) and/or ESTU(s) for each module, as derived from Fig. 2.

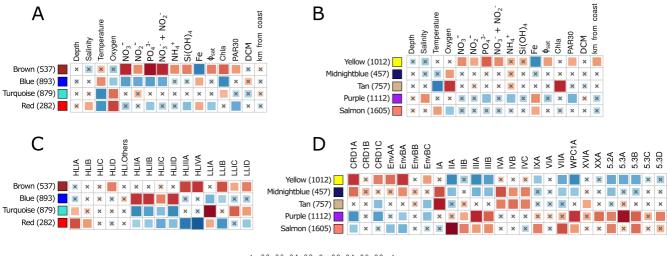
Figure 4. Delineation of *Prochlorococcus* CAGs, defined as a set of genes that are both adjacent in reference genomes and share a similar *in situ* distribution. Nodes correspond to individual genes with their gene name (or significant numbers of the CK number, e.g. 1234 for CK\_00001234) and are colored according to their WGCNA module. A link between two nodes indicates that these two genes are less than 5 genes apart in at least one genome. The bottom insert shows the most significant environmental parameter(s) and/or ESTU(s) for each module, as derived from Fig. 2.

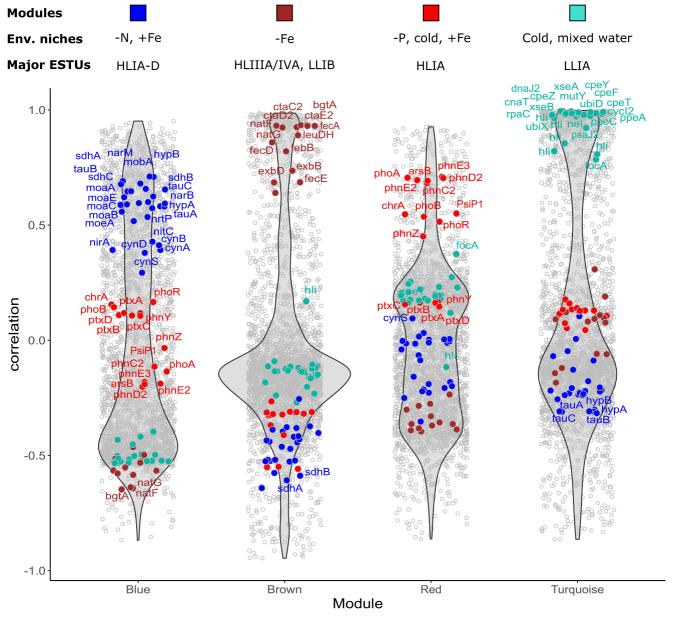
**Figure 5. Global distribution map of CAG involved in nitriles or cyanides transport and assimilation.** (A) Prochlorococcus (ProCAG\_006) and (B) Synechococcus SynCAG\_002. (C) Genomic region in Prochlorococcus marinus MIT9301. The size of the circle is proportional to relative abundance of Prochlorococcus as estimated based on the single-copy core gene petB gene and this gene was also used to estimate the relative abundance of other genes in the population.

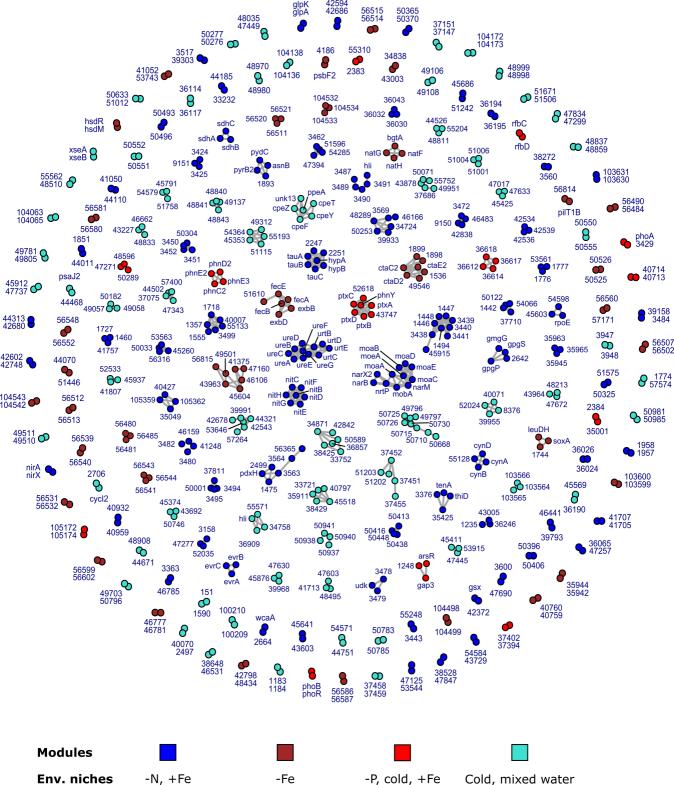
**Figure 6. Global distribution map of CAGs putatively involved in phosphonate and phosphite transport and assimilation.** *Prochlorococcus* (*A*) ProCAG\_012 putatively involved in phosphonate transport, (*B*) ProCAG\_013, involved in phosphonate/phosphite uptake and assimilation and phosphonate C-P bond cleavage, (*C*) The genomic region encompassing both *phnC2-D2-E2-E3* and *ptxABDC-phnYZ* specific to *P. marinus* RS01. The size of the circle is proportional to relative abundance of *Prochlorococcus* as estimated based on the single-copy core gene *petB* and this gene was also used to estimate the relative abundance of other genes in the population.

Figure 7. Global distribution map of the *Prochlorococcus* CAGs involved in the biosynthesis of an alternative respiratory terminal oxidase (ARTO). (A) *Prochlorococcus* ProCAG\_016, (B) *Synechococcus* SynCAG\_015. The size of the circle is proportional to relative abundance of *Prochlorococcus* as estimated based on the single-copy core gene *petB* and this gene was also used to estimate the relative abundance of other genes in the population.









Major ESTUs HLIA-D HLIIIA/IVA, LLIB HLIA LLIA

