1	Nature Microbiology, in review
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3	Nitrogen availability drives gene length of dominant prokaryotes
4	and diversity of genes acquiring Nitrogen-species in oceanic systems
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7	Short title: Gene length of marine prokaryotes
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9 10 11 12	Leon Dlugosch ¹ , Anja Poehlein ² , Bernd Wemheuer ² , Birgit Pfeiffer ² , Helge-A. Giebel ¹ , Rolf Daniel ² , Meinhard Simon ^{1,3} *
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23 Abstract

24 Nitrogen (N) is a key element for prokaryotes in the oceans and often limits phytoplankton primary 25 production. An untested option to reduce prokaryotic N-demand under N-limitation is to reduce 26 gene length. Here we show that in the sunlit Atlantic Ocean genes of the prokaryotic microbial 27 communities in the permanently stratified N-limited (sub)tropics are up to 20% shorter than in N-28 replete regions further south and north. Average gene length (AGL) of major pelagic prokaryotic 29 genera and two virus families correlated positively with nitrate concentrations. Further, the genomic 30 G+C content of 60% of the taxa was lower and the gene repertoire to acquire inorganic and organic 31 N-species higher in N-limited than in N-replete regions. A comparison of the N-demand by reducing 32 gene length or G+C content showed that the former is much more efficient to save N. Our findings 33 introduce a novel and most effective mode of evolutionary adaptation of prokaryotes to save 34 resources including N and energy. They further show an enhanced diversification of genes acquiring 35 N-species and -compounds in N-deplete relative to N-replete regions and thus add important 36 information for a better understanding of the evolutionary adaptation of prokaryotes to N-37 availability in oceanic systems.

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39 **Main**

40 Genome evolution in prokaryotes is largely driven by mutation and horizontal gene transfer (HGT) resulting in acquisition and deletion of genes $^{1-3}$. Whereas HGT leads to gain or loss of entire genes or 41 42 gene clusters, mutation initially leads to gene modification, either non-synonymous or synonymous, and possibly to deletion of codons or pseudogenes and eventually of genes^{1,4,5}. Gene length is thus 43 44 affected by mutational changes and reflected in the variation of AGL in different prokaryotes¹. However, it is unknown whether gene length is affected by evolutionary constraints such as growth 45 limitation by nutrients or elements such as N. Under relaxing growth conditions, evolving 46 47 prokaryotes increase their genomic G+C content to improve their fitness, driven by mutation bias and other, not fully understood selective forces^{3,6}. The genomic G+C content of the majority of auto-48 and heterotrophic bacterial classes and families is positively correlated with their genome size⁷, 49 50 implying that genome expansion by acquisition of beneficial traits via HGT increases the G+C content. 51 Despite this general trend, under strong environmental constraints genome size, the genomic G+C 52 content, and purifying selection towards a reduced genomic N-content of prokaryotes underlies 53 selective forces leading to a reduced G+C content and genome size to utilize limiting resources more efficiently. A consistently low ratio of nonsynonymous polymorphisms to synonymous 54 55 polymorphisms in the Tara Ocean prokaryotic gene set and the identification of nitrate as the strongest environmental variable correlating with this ratio indicates that purifying selection drives 56 the reduced genomic N-content of oceanic prokaryotes⁸. The relatively low G+C content and small 57 genomes of bacterial lineages in stratified oceans, in particular the abundant cyanobacterium 58 59 Prochlorococcus, the alphaproteobacterial Pelagibacteraceae/SAR11 and the gammaproteobacterial SAR86 clades, are the result of genome streamlining² and strong N-limitation^{4,9} because the 60 nucleobases G+C require one atom more N than A+T. This strong forcing by N-availability and 61 minimizing N-cost affects also the proteome of these pelagic bacterial lineages^{9,10}. Genes with a 62 63 lower G+C content encode amino acids with reduced N per amino acid residue side chain (N-ARSC) 64 even though the mass of amino acids concurrently expands, presumably as response to maintain

fitness and protein function^{10,11}. The strong N-limitation of phytoplankton primary production in the 65 ocean is restricted to the permanently stratified mixed layer of tropical and subtropical regions¹². In 66 other regions and below the mixed layer different environmental and biotic drivers such as limitation 67 by Carbon, other elements or temperature may control growth, the genomic G+C content and 68 genome size of prokaryotic lineages^{9,10,13}. However, there is no information available on the AGL, 69 70 genomic G+C content, and N-ARSC of pelagic prokaryotic communities over ocean-wide latitudinal 71 gradients with pronounced differences in N-availability and how they relate to nitrate 72 concentrations, i.e. N-limitation of primary production.

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74 Results and Discussion

75 Gene length of oceanic prokaryotes is a function of N availability

76 We assessed AGL, genomic G+C content and N-ARSC of the Atlantic Ocean Microbiome (AOM) over a 77 13,000 km transect from 62°S to 47°N covering regions of greatly varying N-availabilities (Fig. 1a-b, 78 Supplementary Table 1). The transect included the tropics and subtropics where primary production 79 is strongly N-limited (South Atlantic Gyre: SAG; North Atlantic Gyre: NAG), the temperate regions 80 with seasonally fluctuating N-availabilities (South Atlantic: SA; North Atlantic: NA) and the Southern Ocean (SO) with permanently high nitrate concentrations^{12,14}. Samples of the 0.2 to 3.0 µm-fraction 81 82 collected at 22 stations at a depth of 20 m were paired-end shotgun Illumina sequenced resulting in a total of 206 Gb with a sample mean of 8.9+5.3 Gb (Supplementary Table 2). After assembly (total 83 84 assembly length: >17.52 Gb), 12.05 million (M) gene sequences were predicted, and from these 85 sequences we reconstructed the AOM reference gene catalogue (AOM-RGC) containing 7.75 M nonredundant (nr) protein-coding sequences, of which 56.6% were taxonomically classified. For the 86 87 analysis of taxon resolved AGL, a subset of 3.67 M complete genes (55.7% taxonomically classified) 88 were used. The majority of classified genes (83.9%) affiliated to Bacteria whereas minor proportions 89 to Archaea, viruses and picoeukaryotes (16.1%). Prochlorococcus, Synechococcus, Pelagibacteraceae, 90 Rhodobacteraceae, the SAR86 and SAR92 clades and Flavobacteria constituted the AOM to large extends, but supplemented with other lineages and exhibiting distinct biogeographic patterns
(Supplementary Fig. 1). In total 38% percent of nr genes were functionally annotated by homology to
a KEGG ortholog (KO). N-acquisition pathways comprised 0.85±0.19% of mapped reads at each
station of which 54±6% encoded the glutamate synthase pathway. Amino acid transporters
constituted 0.66±0.11% of all mapped reads. For a complete gene list see Supplementary Table 3.

96 The AGL exhibited a significant bimodal correlation with latitude with highest values in the SO and 97 NA (Fig. 1c) and correlated also significantly with nitrate (Fig. 2e). A cluster analysis of normalized 98 AGL of the 117 major prokaryotic genera and two virus families with >50 genes and >10 kb occurring 99 at >50% of all stations showed two main AGL patterns over the transect (Supplementary Fig. 2). 100 Cluster C1 (72% of tested taxa) encompassed all taxa with a bimodal correlation of AGL and latitude 101 and exhibited a positive correlation with annual mean nitrate concentrations. AGL of taxa of this 102 cluster were particularly small in the N-depleted (sub)tropics and included the Cyanobacteria 103 Prochlorococcus and Synechococcus, the major alphaproteobacterial lineage Pelagibacter as well as 104 the virus families Podoviridae and Myoviridae (Fig. 2a,b). AGL of this cluster exhibited significant correlations with latitude (r^2 =0.141, p<0.001) and nitrate (linear; r^2 =0.164, p<0.001). Taxa of cluster 105 106 C2 (28% of tested taxa) exhibited no pronounced relationships with latitude (r²=0.04, p=0.001) or 107 nitrate (r²=0.02, p<0.001) and encompassed genera like *Polaribacter* of Flavobacteria, *Planktomarina* 108 of *Rhodobacteraceae* and the gammaproteobacterial SAR86 clade (Fig. 2c,d).

109 The number of prokaryotic genes and genome size over the entire size range of prokaryotic genomes 110 has been shown to be positively correlated². The prokaryotic AGL, however, has never been related 111 to genome size, number of genes and genomic G+C content and it is unknown whether it varies with 112 resource limitation. An analysis of these features of the 16,834 genomes available at NCBI (January 113 2020) yielded significant correlations between AGL, genome size and G+C content (Supplementary 114 Figure 3). In oceanic systems, concentrations of inorganic nutrients and in particular of nitrate, often limiting phytoplankton primary production, can vary by orders of magnitude¹². The positive 115 116 correlation of AGL with nitrate concentration of many major genera of pelagic prokaryotes and two 117 virus families of the AOM implies that N-availability or coupled growth constraints such as energy limitation drive the adaptive reduction in gene length with decreasing N-concentration. Hence, N-118 119 limitation appears to affect not only genome size, purifying selection towards a reduced genomic 120 G+C content and N-ARSC of many marine bacterial genera^{8–10} but also AGL thus further lowering the N-demand and energy costs of biosynthetic reactions and DNA-replication. To compare the effect of 121 122 saving N by reducing AGL, G+C content or N-ARSC we analyzed the theoretically reduced demand of 123 N atoms required for nucleotides and amino acids as a function of transcription and translation 124 cycles for these three variables in observed ranges occurring in marine prokaryotes (see above, Fig. 125 3). The outcome of this analysis demonstrates the dramatically higher effectiveness of reducing AGL than the genomic G+C content or N-ARSC in proteins for saving N. As transcription and translation 126 127 cycles of individual genes may vary greatly and possibly irrespective of the growth phase it is difficult 128 to exactly translate this effect of saving N to growth of individual prokaryotic lineages, but it 129 demonstrates the great potential of this mode of saving N. This effect is particularly important at 130 slow growth or during stationary phase at most severe resource limitations when maintenance 131 metabolism predominates. Such conditions regularly occur in the most nutrient limited permanently 132 stratified (sub)tropical oceanic gyres. Our results clearly show that reducing AGL is the most critical 133 and not yet considered evolutionary mode of prokaryotes to adapt to N-limitation. Interestingly, it 134 has been shown that an abundant marine prokaryote responds to N limitation also on the 135 transcriptional level. Under N-deplete conditions Prochlorococcus starts transcribing various genes 136 downstream of the transcriptional start site more frequently than under N-replete conditions leading to a reduced demand of N and other resource in the transcripts¹⁵. Such a reduction of the transcribed 137 138 gene regions may lead to reducing the gene length to a size ensuring the functionality of the encoded 139 protein as evolutionary adaptation to N-deprived conditions. .

As AGL of the genera of the *Pelagibacteraceae* (Fig. 2a,b) is particularly small this indicates that genome streamlining of this prominent oceanic family does not only lead to a reduction in gene number^{2,4} but also in gene length. Our findings have most interesting evolutionary implications. 143 Mutation, purifying selection, HGT and gene loss are well known mechanisms of the adaptive 144 evolution of genes and genome streamlining enhancing metabolic efficiency of the evolving populations at the prevailing environmental conditions⁴. Reduction of gene length, does not only 145 146 occurring in prokaryotes but also in bacteriophages, presumably in their state as prophage, is a novel 147 mechanism of genome reduction but its mode of action is unknown. We speculate that it may act by 148 non-synonymous or synonymous mutation and subsequent codon deletion, deletion of a gene 149 fragment downstream of the transcriptional start site or replacement of genes by homologs of 150 reduced size via HGT while maintaining the metabolic efficiency of the encoded protein at an optimal 151 or sub-optimal but acceptable level as a trade-off. An important follow-up question is to examine 152 whether different genes underlie similar constraints of reducing their size and whether this is taxon-153 specific or a general feature. Future work is needed to mechanistically understand the molecular 154 basis of evolutionary reduction of gene length in prokaryotes and phages under environmental 155 constraints of N-availabilities and possibly energy limitation.

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157 G+C content and N-ARSC of the AOM

The G+C content of all genes and the proteomic N-ARSC exhibited also bimodal latitudinal patterns (Fig. 1d,e). Lowest values consistently occurred in the permanently stratified SAG and the highest values in the SO and NA. The G+C content correlated positively with annual mean nitrate and N-ARSC with measured nitrate concentrations and total particulate N (Fig. 2e). G+C content and N-ARSC correlated also positively (Pearson correlation 0.84, p <0.001), in line with a global trend including all prokaryotic genomes (Supplementary Fig. 3).

The analysis of the normalized genetic G+C content of marine prokaryotes and several virus families over the transect yielded four distinct patterns grouped into clusters (Fig. 4a-d). Clusters C1 (41.1 % of all taxa) and C2 (19.3%) showed a general increase of G+C with ambient nitrate concentration. Both showed highest G+C values in the SO and SA and a decrease in the (sub)tropics. In contrast to 168 cluster C2, C1 exhibited a minor G+C increase in the NA. Both clusters encompassed mainly Alpha-169 and Gammaproteobacteria (Fig. 4i) but also other major genera such as Prochlorococcus, indicating a 170 subclass-specific adaptation strategy. Cluster C3 (16.4%) showed an inverse G+C distribution with high values in the N-depleted SAG and NAG and low values in the SO; it included Synechococcus and 171 172 the SAR116 clade and other genera of generally low or distinct regional abundance (Fig. 4e,f, 173 Supplementary Fig. 1). G+C of genera belonging to cluster C4 (23.2%) did not show a consistent 174 relationship with ambient nitrate concentration but exhibited two distinct peaks in the SA/SAG and 175 NAG (Fig. 4g,h). C4 consisted mainly of Flavobacteriia (Fig. 4i) as well as genome-streamlined genera 176 of Pelagibacteraceae with an overall low G+C content. These data indicate that lineages known to be active players of prokaryotic communities in various oceanic regions¹⁶⁻²¹ have a relatively low G+C 177 178 content in SAG and NAG. All of them, however, exhibit the highest G+C content in SO where growth 179 is usually not N-limited. These patterns, exhibited by the majority of taxa, are consistent with the concept of an adaptive evolution towards a reduced G+C content under N-limiting conditions^{9,13} even 180 181 though the mechanisms involved remain unclear. Mutation bias towards a reduced G+C content and purifying selection but other not fully understood selective forces^{3,8} seem to be involved. The fact 182 that the selective forces act preferentially on actively transcribed protein coding genes⁶ may explain 183 184 why predominantly the more prominent and active players of the prokaryotic communities exhibit 185 these patterns. The lineages with a permanently low G+C content underlie other selective processes, genome streamlining as they exhibit the smallest genomes² and AGL (see above). However, as the 186 187 genome size is positively correlated with the G+C content in the larger phylogenetic groups to which 188 the major lineages of marine pelagic prokaryotes affiliate⁷ and also when considering all available 189 genomes (Supplementary Fig. 3), genome streamlining appears to be inherently associated with 190 reducing the G+C content. The other lineages with no reduced G+C content in the most strongly N-191 limited SAG presumably underlie other evolutionary constraints than N-limitation. They are either 192 minor components of the microbial communities with generally little activity and thus a presumably low adaptive evolutionary forcing towards a reduced G+C content⁶. Or they underlie other forces 193 194 when they dwell predominantly in less N-depleted regions than SAG, such as Synechococcus, or

occupy niches with no N-limitation, such as Planktomycetes and Verrucomicrobia, on N-rich particles
 and Carbon limitation^{5,13,22,23}.

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198 Diversity and patterns of genes involved in N-acquisition

199 As availability of N is crucial for oceanic prokaryotes and the evolution of their genomic structure 200 (see above) an important and related question is in which forms N is available to prokaryotes under 201 various nutrient regimes. Besides oxidized inorganic forms and neutral gas a variety of reduced N 202 containing compounds exist (e.g. oligopeptides, amino acids, urea). These are the preferred N-203 sources of heterotrophic prokaryotes because reduction of the oxidized forms is energy-costly (Fig. 204 5a). Break down products of proteins originating predominantly from phytoplankton such as 205 oligopeptides, dipeptides and free amino acids are major N-sources of heterotrophic and partly of 206 autotrophic pelagic prokaryotes (Fig. 6a). Ammonium and urea act as important metabolites of the amino acid and pyrimidine metabolism and can be important N-sources^{24–28}. Other reduced organic 207 N-species including cyanate may be available as well²⁹ (Fig. 5a). There is some information on the 208 209 genetic potential and proteomic spectrum of pelagic prokaryotes to acquire inorganic and organic Nspecies in pelagic ecosystems^{9,17,18,29,30}. However, we still lack a comprehensive and detailed insight 210 211 into the genetic potential of pelagic prokaryotic communities to acquire potentially available 212 inorganic and organic N-species on a global or ocean-basin scale including regions with and without 213 strong N-limitation of phytoplankton primary production. This is particularly important considering 214 the utmost relevance of N in shaping genomic traits of prokaryotes in oceanic systems under N-215 limitation (see above) and strong competition for and exploitation of available N-sources. Therefore, 216 we screened the AOM for key genes involved in the acquisition of the entire range of N-species. The 217 AOM harbors a large variety of genes encoding transporters of oligo- and dipeptides, various amino 218 acids, alkylamines, ammonium, cyanate, formamide, nitriles and the metabolism of urea and oxidized 219 N-species (Fig. 6a,b). Richness and effective number of these genes was lowest in the N-replete SO 220 (Supplementary Fig. 6). The other N-depleted regions exhibited some variations but no distinct 221 patterns. Although many pathways showed only very low abundances, biogeographic patterns as 222 well as phylogenetic affiliations were visible. Glutamate synthase, leading to the final step of 223 intracellular ammonium transfer for further metabolic reactions, comprised 54±6% of the N-224 acquisition genes and was highly abundant in the stratified SAG and NAG. Transporters of branched 225 chain and general amino acids, glycine betaine/proline, octopine/nopaline, oligopeptides, 226 ammonium, urea and urease and glutamate synthase constituted the great majority of these genes 227 (Fig. 6a). Genes encoding transporters of general amino acids, urea and ammonium and urease 228 exhibited highest abundances in SAG whereas those encoding transport of oligopeptides were most 229 abundant in SO. Genes encoding transporters of glycine betaine/proline, branched chain amino acids 230 and glutamate synthase showed a more patchy or rather even distribution over the transect (Fig. 6a). 231 Among the less abundant genes cyanate lyase and nitrilase showed highest abundances in the SO 232 (Fig. 5b). In general, Alphaproteobacteria exhibited the largest variety of N-acquisition genes, 233 followed by Gammaproteobacteria (Fig. 6b). Several prokaryotic classes dominated or were distinct 234 for specific N-acquisition genes: Gammaproteobacteria for transporters of oligopeptides and several 235 individual acids, Betaproteobacteria for denitrification and transporters amino of 236 glutamate/aspartate, Bacteroidetes/Flavobacteria for nitrilase, Synechococcaceae for assimilatory 237 nitrate and nitrite reduction and Prochloraceae for urea transporters and urease (Fig. 6b, 238 Supplementary Fig. 7). Hence, the latitudinal distribution of these phylogenetic groups was closely 239 linked to that of the respective genes. Distribution of genes encoding amino acid transporters among 240 Alphaproteobacteria reflected the relative abundances of the various families (Supplementary Fig. 8). 241 However, genes encoding transporters of dipeptides, ammonium transporters and urease were 242 specifically dominated by distinct families with variation in the different regions (Supplementary Figs. 243 7,8).

The results demonstrate that the AOM's repertoire of genes acquiring N-containing compounds is very diverse thus enabling its different members to occupy many niches to exploit the large spectrum of potentially available N-species. The highest diversity of these genes existed in regions with strong 247 N-limitation, presumably driving this diversification because of the high competition for this very 248 precious element The different patterns of N-acquisition genes in the various prokaryotic families 249 indicate that overlap of different families to exploit N-containing compounds was rather limited thus 250 emphasizing different strategies and niches for the acquisition of N among free-living bacteria, 251 presumably reducing functional redundancy. This notion is in line with a recent concept of reduced functional redundancy due to these auxiliary genetic features not considered in KO categories³¹. 252 253 Whereas most N-acquisition genes and their affiliation to phylogenetic groups were expected based on previous findings^{17,18,29} it was unexpected to find genes encoding cyanate lyase affiliated to quite 254 255 different bacterial phylogenetic groups. Concentrations of cyanate in pelagic systems are in the nM range and incorporation can meet up to 10% of total N-demand³². So far, use of cyanate has been 256 attributed mainly to ammonium-oxidizing prokaryotes²⁹ but our finding of genes encoding cyanate 257 258 lyase along the transect suggests that cyanate is used as an N-source for biosynthetic requirements 259 by other phylogenetic lineages but needs to be tested. It was also surprising to find 260 optopine/nopaline transporter-like sequences, especially in *Pelagibacteraceae*. Both are derivatives 261 of the amino acids glutamate, arginine and alanine and their transport systems are known from Agrobacterium tumefaciens. Both compounds are produced by the host plants after infection by the 262 263 virulence plasmid to promote growth of tumors and the production of secondary metabolites³³. 264 Genes encoding these transporters have not been described in marine prokaryotes. Whether our 265 finding is based on incorrect gene annotation or indicates that these transporters may also mediate 266 uptake of other similar compounds needs to be tested.

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268 Conclusion

Our investigation shows that availability of N in the form of nitrate and related biogeochemical effects such as limitation of phytoplankton primary production have fundamental effects on shaping genomic and proteomic traits of the microbiome of the sunlit Atlantic Ocean. Shifts in community wide AGL and G+C content were not caused by a changing community structure but were evident for 273 many and in particular major phylogenetic groups which exhibited respective variation in the 274 genomic G+C content, N-ARSC and as a completely novel finding AGL. AGL has the greatest effect on 275 reducing the N-demand and can vary by approximately 20% within a narrow phylogenetic range. In 276 response to the sparse availability of N in particular in the N-depleted regions a highly diverse 277 repertoire of N-acquisition genes in the different prokaryotic families is present which enables the 278 AOM to maximize N-acquisition. The discovery that AGL is affected by N-availability presumably is 279 not restricted to oceanic prokaryotic communities but may be a consequence of N-deficiency also in 280 other N-limited prokaryotic communities.

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282 Methods, along with any additional Extended Data display items and Source Data and related 283 references, are available in the online version of the paper.

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285 Acknowledgements

286 We thank the master, his crew and the principal scientists (M. Lucassen, K. Bumke) of cruises ANT 287 XXVIII/4 and -/5 of RV Polarstern, T.H. Badewien, A. Gavrilov, S. Rackebrandt, T. Remke, J. Vollmers, 288 M. Wietz, I. Wagner-Döbler and M. Wurst for cruise support, M. Heinemann, B. Kuerzel, R. Weinert 289 and C. Lehners for technical laboratory assistance. Constructive suggestions by S. Biller on an earlier 290 version of this manuscript are gratefully acknowledged. This work was funded by Deutsche 291 Forschungsgemeinschaft within the Collaborative Research Center Roseobacter (TRR51) and the 292 Graduate Research training group "The Ecology of Molecules" (EcoMol) supported by the Lower 293 Saxony Ministry for Science and Culture.

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295 Author contribution

LD carried out the bioinformatics and statistical analyses and wrote the draft of the publication; AP and BP carried out the metagenomics sequencing and quality control of the raw sequences; BW carried out sampling and sample filtration; HAG analyzed nitrate concentrations; RD supervised the 299 metagenomics sequencing and contributed to reviewing the manuscript; MS designed the study, 300 supervised the bioinformatics and statistical analyses and finalized the draft manuscript. All authors 301 reviewed the manuscript.

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303 Methods

304 Twenty-two stations between 62°S and 47°N were visited during cruises ANT XXVIII/4, 13 March-9 305 April 2012, and ANT XXVIII/5, 10 April–15 May 2012, with RV Polarstern. For exact locations of the 306 stations see Table S1. Samples were collected at 20 m depth with 12 I-Niskin bottles mounted on a 307 Sea-Bird Electronics SBE 32 Carousel Water Sampler equipped with a temperature, salinity, depth 308 probe (SBE 911 plus probe), a chlorophyll fluorometer (Wet Labs ECO – AFL/FL) and transmissometer 309 (Wet Labs C-Star). Nitrate concentration was analyzed in prefiltered (0.2 µm, isopore membrane 310 filter, EMD Millipore Corporation, USA) and HgCl2-preserved and frozen (-20°C) subsamples in the 311 home lab after thawing using a microtiter plate reader (FLUOstar Optima, BMG Labtech, Germany) following established procedures for N oxides (NOx)³⁴. For the analysis of total particulate N (TPN), 1– 312 4 l of seawater were filtered through Whatman GF/F filters and stored at -20°C until analysis in the 313 home lab. POC and TPN were analyzed as described previously³⁵. For metagenomics analysis, water 314 315 of several bottles was pooled in an ethanol-rinsed polyethylene barrel to a total volume of 40 l. Within 60 min after collection the sample was prefiltered through a 10-µm nylon net and a filter 316 317 sandwich consisting of a glass fiber filter (47 mm diameter, Whatman GF/D; Whatman, Maidstone, 318 UK) and 3.0-µm polycarbonate filter (47 mm diameter, Nuclepore; Whatman). Picoplankton was 319 harvested on a filter sandwich consisting of a glass fiber filter (47 mm diameter, Whatman GF/F; 320 Whatman) and 0.2-µm polycarbonate filter (47 mm diameter, Nuclepore; Whatman). All filters were 321 immediately frozen in liquid N and stored at -80°C until further processing. Environmental DNA was 322 extracted from the filter sandwich and subsequently purified employing the peqGOLD gel extraction kit (Peqlab, Erlangen, Germany) as described previously³⁶. Illumina shotgun libraries were prepared 323 324 using the Nextera DNA Sample Preparation kit as recommended by the manufacturer (Illumina, San 325 Diego, USA). To assess quality and size of the libraries, samples were run on an Agilent Bioanalyzer 2100 using an Agilent High Sensitivity DNA kit as recommended by the manufacturer (Agilent Technologies, Waldbronn, Germany). Concentrations of the libraries were determined using the Qubit[®] dsDNA HS Assay Kit as recommended by the manufacturer (Life Technologies GmbH, Darmstadt, Germany). Sequencing was performed by using the HiSeq2500 instrument (Illumina Inc., San Diego, USA) using the HiSeq Rapid PE Cluster Kit v2 for cluster generation and the HiSeq Raid SBS Kit (500 cycles) for sequencing in the paired-end mode and running 2x250 cycles.

Annual mean nitrate concentrations. Annual mean nitrate concentrations at 20 m depth of each station were extracted from the 1° World Ocean Atlas 2009, provided by the National Oceanic and Atmospheric Administration (<u>https://www.nodc.noaa.gov/cgi-bin/OC5/woa18f/</u>).

335 Metagenomic assembly and gene prediction. Illumina reads were quality checked and low-quality regions as well as adaptor sequences were trimmed using Trimmomatic 0.36³⁷ (ADAPTER:2:30:10 336 SLIDINGWINDOW:4:25 MINLEN:100). The high quality (HQ) reads were assembled using metaSPAdes 337 $3.11.1^{38}$. Contigs smaller than 210 bp and average coverage <2 were discarded. Gene-coding 338 339 sequences of the assembled contigs were predicted using Prodigal 2.6.2 in meta-mode³⁹. Genes shorter than 210 bp and longer than 4,500 bp were discarded to account for prokaryotic and 340 341 eukaryotic gene length. This resulted in 8.38 M partial and 3.67 M complete unique gene sequences 342 (supplementary table S2).

Taxonomic classification of gene sequences. Gene sequences were taxonomically classified using Kaiju 1.6⁴⁰ (*-greedy* mode with 5 allowed substitutions and e-value 10e-5) and the NCBI nr database (downloaded on 2018-05-29) including prokaryotic, eukaryotic and viral sequences as well as the proGenomes database⁴¹ (downloaded on 2019-07-26). Gene taxonomy was compared between both approaches and last known ancestor was inferred from the highest available phylogenetic resolution. In total 63.4% of all unique genes and 55.7% of complete genes were taxonomically classified.

Gene catalogue generation. To generate a non-redundant (nr) gene catalogue, gene sequences were clustered at 95% identity using USEARCH 10.0.24⁴² (*-cluster_fast-id 0.95*). The resulting 7.75 M cluster centroids were used as representative AOM gene sequences. Genes were taxonomically classified as described above. Gene functions were assigned using the Kyoto Encyclopedia of Genes and Genomes (KEGG) online annotation tool GhostKOALA⁴³ (<u>https://www.kegg.jp/ghostkoala/</u>) using the prokaryotic, eukaryotic and viral KEGG gene database (release 86) and default settings. In total, 59% of genes were taxonomically classified and 39% of all sequences were assigned to a KEGG orthologue (KO).

Illumina read abundance and normalization. To acquire gene abundance data, HQ Illumina reads 357 longer than 75 bp were mapped to the AOM gene sequences using bowtie2⁴⁴ 2.3.5 (--very-sensitive-358 359 *local* mode). SAMtools⁴⁵ version 1.9-58-gbd1a409 was used to convert the SAM alignment file to read 360 abundance tables. Reads that did not map to any nr sequence were discarded. To account for 361 different sequencing depth and gene length, counts from each station were normalized by dividing 362 read counts by gene length in kb to obtain reads per kilobase (RPK). Subsequently scaling factors 363 were calculated for each sample by dividing the sum of RPKs by one million. The scaling factors were used to normalize the RPKs of each sample to counts per million (CPM)⁴⁶ 364

365 Determination of G+C, N/C-ARSC, molecular protein weight and gene length. To determine G+C 366 content, Nitrogen/Carbon content of amino acid residual side chains (N/C-ARSC) genes predicted 367 from individual stations were classified as described above. G+C content of each predicted gene was 368 determined by dividing the total amount of G and C bases by the total gene length. To determine N-369 and C-ARSC, nucleotide sequences were translated to amino acids. Average N and C content of amino 370 acid side chains was calculated for every gene according to sum formula of each amino acid. The same approach of gene prediction and determination of genomic traits was applied to 16,834 371 372 complete bacterial reference genomes downloaded from NCBI GenBank (January 2020).

373 **Statistical analysis.** All statistical evaluations were performed in R (version 3.6.0; <u>https://www.r-</u> 374 project.org/) using the additional packages $vegan^{47}$ (v2.5-6), ape^{48} (v5.3), and $cluster^{49}$ (v2.0.8). AGL, G+C content, and N-ARSC. Patterns of AGL were analyzed on the level of complete genes of prokaryotic genera and virus families. For a similar analysis of the G+C content also incomplete genes were included. Only taxa with more 50 genes (min. 10kb) in \geq 50% of all samples were considered. Stations with less than 50 genes were excluded in the analysis of each taxon.

To compare trends across genera, AGL and G+C content were normalized to values between 0 and 1 (formula: x-min(x)/max(x)-min(x)). Euclidean distances of G+C and AGL profiles were calculated and subsequently clustered using minimal variance Ward.D2 clustering. Linear/non-linear model fitting was used to determine a relationship between G+C and AGL to annual mean nitrate concentration for each resulting cluster. Correlations between AGL, G+C, and N/C-ARSC and environmental parameters were calculated from all stations where data with environmental data were available (Table S1). P-values ≤0.05 were considered significant.

To analyse geographic distribution patterns, abundances of genes involved in N-acquisition (Supplementary Table 3) were normalised to values between 0 and 1 (see above). Effective number of the same genes was calculated after Jost 2006⁵⁰.

Data availability. Sequence data were deposited under the INSDC accession number PRJEB34453 in the European Nucleotide Archive (ENA) using the data brokerage service of the German Federation for Biological Data⁵¹ (GFBio), in compliance with the Minimal Information about any (X) Sequence (MIxS)⁵² standard. Environmental data of the stations and depth collected during cruises ANTXXVIII/4 and -/5 are available at https://doi.pangaea.de/10.1594/PANGAEA.906247.

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Figures:

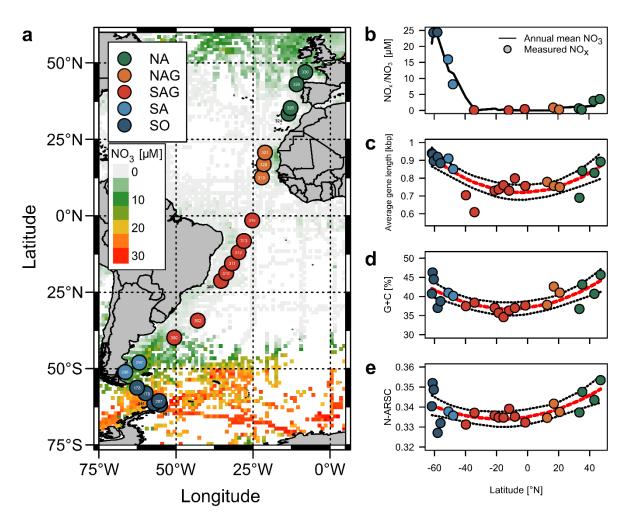


Figure 1

Stations and nitrate in the Atlantic and Southern Ocean visited during cruises ANTXXVIII/4 and -/5 with RV Polarstern and N-related genomic features of the Atlantic Ocean Microbiome (AOM). a, station location in the biogeographic regions SO, SA, SAG, NAG and NA (for abbreviations see text and for station details Table S1). Numbers of station are given in the circles and overlayed on a map with annual mean surface concentrations of nitrate (https://www.nodc.noaa.gov/OC5/woa18f/index.html). b, annual mean and ambient surface concentrations of nitrate and NO_x (nitrate+nitrite) in the biogeographic regions along the transect. ce, distribution of AGL, genomic G+C content and N-ARSC in the biogeographic regions and their Spearman correlations (red line) and 95% confidence intervals (black dotted line) with latitude (AGL: r²: 0.58, p<0.001; G+C: r²: 0.46, p=0.001; N-ARSC: r²: 0.34, p=0.007).

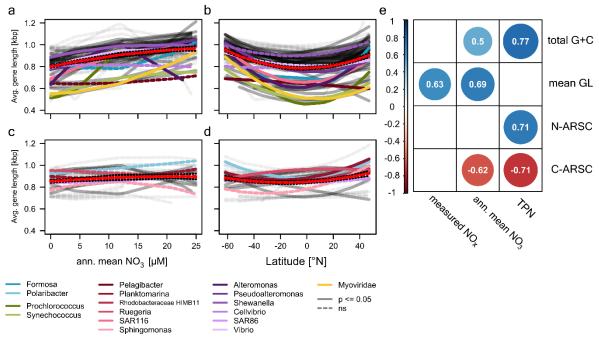


Figure 2

Correlation of AGL and genomic G+C content and N-ARSC of the AOM with latitude, nitrate and total particulate nitrogen (TPN). a-d, Correlations of AGL of clusters C1 and C2 encompassing major prokaryotic genera and virus families (see legend) with nitrate and latitude. Patterns were determined by using unimodal models. e, Correlation coefficients of Pearson correlations ($p \le 0.05$) of AGL, genomic G+C content and N-ARSC with ambient and annual mean surface nitrate concentrations and TPN.

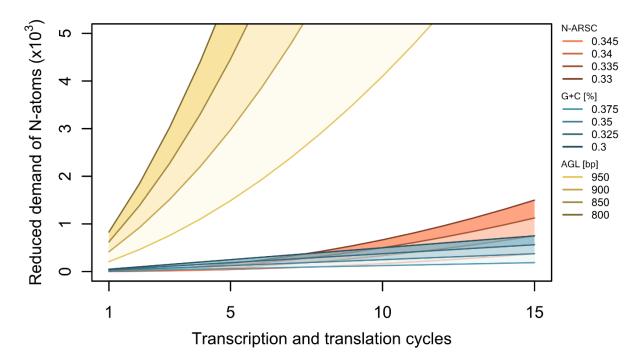


Figure 3

Reduction of N demand for given ranges of gene length, genomic G+C content and N-ARSC over increasing numbers of transcription and translation cycles. Numbers of N atoms saved were calculated for the given values of N-ARSC, G+C content and gene length for nucleotides needed for the transcription and translation cycles and amino acids produced for protein synthesis based on a reference gene length of 1000 bp, G+C content of 40% and an N-ARSC of 0.35. These reference values were in the range of values occurring in N-replete regions of our data set.

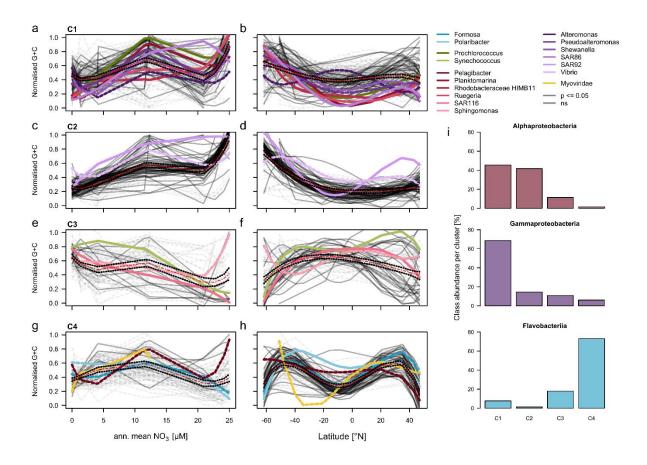


Figure 4

Patterns of the genomic G+C content of the AOM. a-h, Correlations of the normalized G+C content of four clusters (C1, C2, C3, C4) of major prokaryotic genera and virus families (see legend) in the Atlantic and Southern Ocean in correlation to annual surface nitrate concentration and latitude. Patterns were determined by using non-linear models. Fit significance of each genus is indicated by a solid line (for further details see legend). **i**, Affiliation of major classes of prokaryotes to clusters C1 to C4 of the G+C correlation patterns.

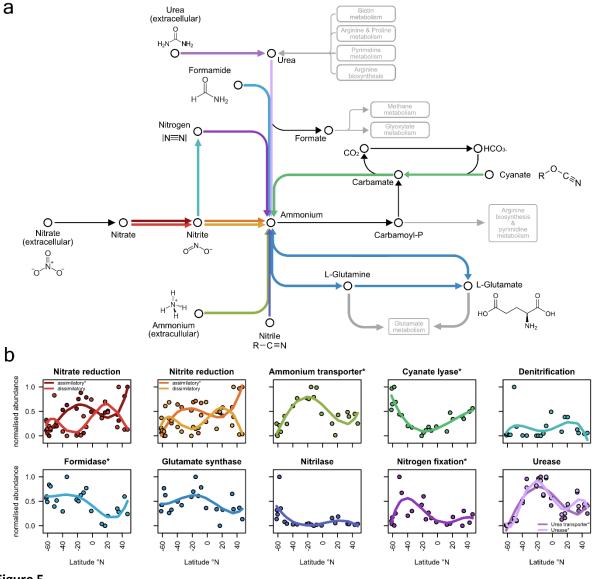


Figure 5

N-acquisition genes and their distribution along the Atlantic Ocean transect. a, pathways of N-acquisition genes leading to intracellular ammonium. **b**, normalised distribution of N-acquisition genes along the transect.

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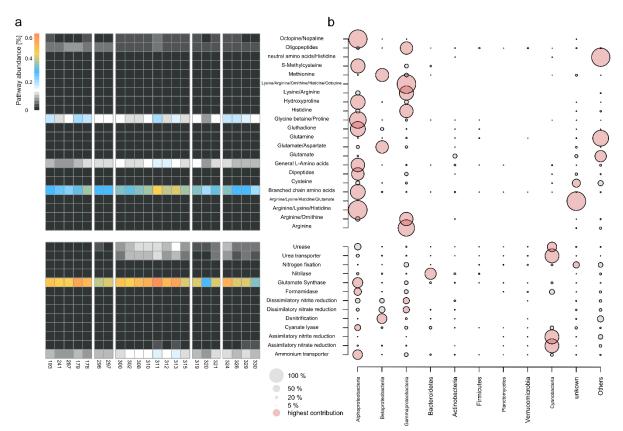


Figure 6

N-acquisition genes along the transect and their distribution among the prokaryotic groups of the AOM a, relative abundance of genes encoding transporters of amino acid-related and other organic N-compounds at stations along the transect. **b**, relative distribution pathways and transporters among prokaryotic phyla and classes. For higher phylogenetic resolution of major lineages see supplementary Fig. S7, S8.

Supplementary Material

Tables

Table S1 Station details, hydrography, nitrate, G+C, AGL and N/C-ARSC-data

Table S2 Sequencing and assembly statistics of the Atlantic Ocean Metagenomes

Table S3 List of genes encoding proteins of N-acquisition and AA-transport

Figures

Figure S1: Heatmap of Relative abundances of prominent taxa in the Southern and Atlantic Ocean

Figure S2: Heatmap of taxonomically resolved AGL data and clusters

Figure S3: Correlation of genome size and G+C content, genome size and G+C content (NCBI-data of available genomes).

Figure S4: Dendrogram based on patterns of G+C distribution among prokaryotic genera and virus families

Figure S5: Heatmap of taxonomically resolved G+C data

Figure S6: Richness and EN of N-acquisition genes

Figure S7: Taxonomically resolved abundances of N-acquisition pathways

Figure S8: Taxonomically resolved abundances of amino acid transport systems