Elemental Stoichiometry of Particulate Organic Matter across the Atlantic Ocean

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Abstract:

Recent studies show that stoichiometric elemental ratios of marine ecosystems are not static at Redfield proportions but vary systematically between biomes. However, the wider Atlantic Ocean is under-sampled for particulate organic matter (POM) elemental composition, especially as it comes to phosphorus (i.e., POP). Thus, it is uncertain how environmental variation in this region translates into shifts in C:N:P. To address this, we analyzed hydrography, genomics, and POM concentrations from 877 stations on the meridional transects AMT28 and C13.5, spanning the Atlantic Ocean. We observed nutrient-replete, high-latitude ecosystem C:N:P to be significantly lower than the oligotrophic gyres. Latitudinal and zonal differences in elemental stoichiometry were linked to overall nutrient supply as well as N vs. P stress. C:P and N:P were generally higher in the P-stressed northern region compared to southern hemisphere regions. We also detected a zonal difference linked to a westward deepening nutricline and a shift from N to P stress. We also evaluated possible seasonal changes in C:N:P across the basin and predicted these to be limited. Overall, this study confirms latitudinal shifts in surface ocean POM ratios but reveals previously unrecognized hemisphere and zonal gradients. This work demonstrates the importance of understanding how regional shifts in hydrography and type of nutrient stress shape the coupling between Atlantic Ocean nutrient and carbon cycles.

Plain language summary:
Climate change is predicted to influence the biological pump by altering phytoplankton nutrient distribution. In our research, we conducted comprehensive measurements of particulate matter concentrations during two large oceanographic field studies. We observed systematic variations in organic matter concentrations and ratios across the Atlantic Ocean, both latitudinally and longitudinally. Through statistical modeling, we determined that these variations are associated with differences in the availability of essential nutrients for phytoplankton growth. Our findings highlight the adaptive resource utilization among surface ocean plankton, which in turn modulates the interplay between the ocean's nutrient and carbon cycles.

Key points:

- There was systematic regional variation in POM concentrations and ratios across the Atlantic Ocean.
- Latitudinal variability in C:N:P is linked to the nutrient supply rate and N vs. P stress.
- Westward deepening isopycnals and nutricline and a shift from N to P stress correspond to zonal variability in C:N:P

1. Introduction

The efficiency of the biological pump is anticipated to be affected by climate change through alteration in phytoplankton nutrient allocation and the C:N:P ratio (Galbraith + Martiny, 2015). Nevertheless, the influence of ocean warming on this efficiency is still uncertain, carrying potential repercussions for the ecosystems and global carbon cycle (Kwon et al., 2022). Over the past few decades, studies have observed variability in marine plankton elemental composition and ecosystem elemental composition (Weber and Deutsch, 2010; Martiny et al., 2013b, a). Specifically, regions with nutrient–rich conditions have lower C:N:P ratios (equatorial, coastal, and temperate regions), and nutrient–poor conditions (subtropical gyre regions) have higher ratios (Martiny et al., 2013b, a). However, data compilations include variations in both sampling and analytical methodologies (Martiny et al., 2014) as well as have limited spatial coverage. Therefore, large-scale sampling efforts like Bio-GO-SHIP are quantifying ecosystem particulate organic matter (POM) concentrations and their elemental ratios utilizing consistent methodologies on a global scale (Tanioka et al., 2022; Clayton et al., 2022).

Studies focused on POM stoichiometry across ocean basins have been primarily limited to Bio-GO-SHIP cruises within the Indian Ocean (Garcia et al., 2018) and the Pacific Ocean (Lee et al., 2021). Both studies have observed high POM concentrations at higher latitudes and low concentrations within the gyres, with intermediate levels toward the equator. The stoichiometry had higher values in the gyres and lower values at high latitudes (Garcia et al., 2018; Lee et al., 2021). There have been two basins–wide transects across the Atlantic ocean that have been used in a global synthesis (Tanioka et al., 2022) but have not been used in a study focused solely on the Atlantic. Along with the strong relationship with latitude, there is also strong correlation with nutricline depth, used as a proxy for nutrient flux, in the global synthesis. Localized studies at the Bermuda Atlantic Time-series (BATS) site or short transects along the western North Atlantic Ocean show an N:P ratio between 40–50 and C:N near Redfield proportions (~6.6) (Michaels et al., 1994; Michaels and Knap, 1996; Steinberg et al., 2001; Babiker et al., 2004; Cavender-Bares et al., 2001). In contrast, POM dynamics and especially N:P and C:P ratios are less understood within the NE Atlantic Ocean and South Atlantic Ocean as a whole.

The Atlantic Ocean has a unique dynamic, being singularly/ co-limited by nitrogen and phosphorus respectively to the north of the equator and predominantly nitrogen limited south of the equator (Cotner et al., 1997; Mather et al., 2008; Browning and Moore, 2023). In phosphorus co-limited regions, N:P and C:P are often elevated from frugal phosphorus use, supported by the well sampled NW Atlantic Ocean (Galbraith and Martiny, 2015; Lomas et al., 2010, 2022). As a response to the nutrient limitation, phytoplankton can express specific genes that will allow for greater uptake of a nutrient. Gene expression and preferential uptake could influence cellular C:N:P within phytoplankton. Nitrogen limitation is more widespread in the South Atlantic Ocean, but no study has quantified ecosystem C:N:P here (Mather et al., 2008; Ustick et al., 2021). Temperature has been known to influence the concentration of cellular phosphorus in phytoplankton, with increasing in C:P with warmer temperatures, however C:N remains unchanged (Yvon-Durocher et al., 2015). The underlying mechanism for this relationship is not fully understood but hypothesized to be from either increase in carbon uptake over phosphorus, an increase in nutrient use efficiency, or translation compensation theory (few P-rich ribosomes are required for protein synthesis) (Tanioka and Matsumoto, 2020). The availability of nutrients

generally follow inverse patterns of C:N:P, with increasing nutrients leading to a decrease in C:N and C:P and vice-versa (Galbraith and Martiny, 2015; Tanioka and Matsumoto, 2017). However, such environmental variation in the Atlantic Ocean elemental stoichiometry remains largely unknown. Therefore, the broad environmental gradients in the Atlantic Ocean could result in significant regional ecosystem C:N:P shifts.

Here, we quantified suspended particulate organic carbon, nitrogen, and phosphorus concentrations along two Bio-GO-SHIP meridional transects: AMT 28 and C13.5 (Fig. 1), covering large parts of the Atlantic Ocean. We addressed two questions: (1) What are meridional, hemispheric, and zonal differences in POM concentrations and stoichiometry? And (2) What is the relationship between environmental factors and C:N:P? We hypothesize that differences in total nutrient supply and temperature are primarily responsible for the latitudinal gradient in C:N:P. In contrast, the type of nutrient stress will be important for hemispheric and longitudinal C:N:P shifts.

2. Methods

2.1. Cruise Transects

AMT 28 started in Harwich, UK (49° 38´ N/5° 30´ W), and ended in Mare Harbour, Falkland Islands (48° 12´ S/52° 42´ W), departing the 25 September 2018, and ending the 27 October 2018. C13.5 started in Cape Town, South Africa (34° 22´ S/17° 18´ W), and ended in Norfolk, VA (36° 5´ N/74° 34´ W) (Fig. 1), departing the 21 March 2020, and ending the 16 April 2020. C13.5 was set to go 45° S and collect samples along the eastern boundary of the South Atlantic Ocean. Due to COVID-19 quarantine restrictions, it was redirected to a port in Virginia. Fortuitously, this redirect allowed sample collection across the eastern South Atlantic Ocean and the western North Atlantic Ocean.

2.2. Sample collection

Seawater for the POM was collected from the underway flow–through system for both cruises at a depth of approximately 5 m. This method involved initially passing water through a 30 µm nylon mesh to remove the stochastic presence of large particles from the samples (Lee et al., 2021). We then collected 3 to 8 L of filtered water in 8.5 L plastic polycarbonate carboys (Thermo Fisher Scientific, Waltham, MA). The carboys were placed at a 45° angle to prevent particles from settling below the nozzle. Next, particulate organic carbon (POC)/ nitrogen (PON), and phosphorus (POP) samples were filtered onto 25 mm pre-combusted GF/F (500° C for 5 hours)(nominal pore size of 0.7 µm) (Whatman, Florham Park, NJ) (POC/PON are on the same filter). POP filters were rinsed with 5 ml of 0.17 M Na_2SO_4 to remove traces of dissolved phosphorous from the filter. Finally, we stored all filters in pre-combusted aluminum packets and placed them in a -80° C freezer during the cruise, a -20° C cooler for shipping, and back to a -80° C freezer until analysis. Between sample collections, the carboys and tubing were rinsed with 30 µm filtered sample water just prior to collection.

We collected single samples of POC/PON and POP hourly for AMT 28. For the C13.5 transect, POC/PON and POP samples were collected in triplicate every 4 to 6 hours. Water collection for C13.5 was done at the peak and trough of the diel cycle, ~06:00 and ~20:00 LT, respectively, and with one to two collections in between those times.

2.3. Particulate organic matter determination

2.3.1. Particulate organic phosphorus (POP) assay

POP was analyzed using a modified ash-hydrolysis protocol (Lomas et al., 2010). Filters were placed into acid-washed/pre-combusted glass vials with 2 ml of 0.017 M $MgSO_4$ and covered with pre-combusted aluminum foil. The vials were placed in an incubator for 24 hours at 80 to 90° C and then combusted for 2 hours at 500° C. After cooling, 5 ml of 0.2 M HCl was added and incubated at 80 to 90° C for 30 minutes. The supernatant was collected, and the vials were rinsed with 5 ml of Milli-Q water. The rinse water was collected and added to the supernatant. 1 ml of mixed reagent (2:5:1:2 parts ammonium molybdate tetrahydrate (24.3 mM), sulfuric acid (5 N), potassium antimonyl tartrate (4.1 mM), and ascorbic acid (0.3 M) was added to the supernatant and left in the dark for 30 minutes. Samples were analyzed on a spectrophotometer at a wavelength of 885 nm using a potassium monobasic phosphate standard (1.0 mM-P). The detection limit for POP measurements was ~0.3 µg.

2.3.2. Particulate organic carbon/nitrogen (POC/PON) assay

POC/PON are measured using the same filter. The POC/PON samples were processed in the lab at UCI using a JGOFS protocol (Ducklow and Dickson, 1994). POC/PON samples were dried in an incubator at 55° C for 24 hours. They were then moved to a desiccator with concentrated HCl fumes for 24 hours to remove inorganic carbon. The samples were then re-dried at 55° C for 24 hours before being packaged into pre-combusted tin capsules (CE Elantech, Lakewood, NJ). The packaged filters were analyzed on a CN FlashEA 1112 Elemental Analyzer (Thermo Scientific, Waltham, MA) with atropine and acetanilide standards. POC and PON measurements had a detection limit of ~2.4 µg and ~3.0 µg. Settings for the FlashEA had an oxidative reactor temperature of 900° C, a reduction reactor temperature of 680° C, and an oven temperature of 50° C. Oxygen introduced to the oxidative reactor last seven seconds allowing temperatures to reach 1800° C for sample combustion. A leak test needed to fall below 5 ml min^{-1} before samples were analyzed to minimize sample loss.

2.4. Nutrient availability, biogeography, and biological properties

2.4.1. Nutricline depth

The nutricline depth was determined as the 1 µM nitrate depth horizon (Garcia et al., 2018; Cermeño et al., 2008). Nutricline depth was regarded as a proxy for nutrient supply to the surface, with a shallow nutricline representing a high flux of nutrients and vice versa for a deep nutricline. The nutricline depth with respect to the 1/16 µM phosphate depth horizon was also investigated but found to be nearly identical to that of nitrate. For AMT28, nitrate concentrations were quantified as previously described from CTD casts along the transect (Swift, 2019). Nitrate concentrations were then interpolated using DIVA implemented in Ocean Data View (v5.5.2) (Schlitzer, 2019). For C13.5, we used the seasonal average nitrate depth profiles from 2018 of the World Ocean Atlas at one degree spatial resolution to determine nutricline depths. This approach was necessary as the logistical issues related to COVID quarantine restrictions prevented us from collecting onboard CTD measurements. Linear interpolation for each profile within the one degree was performed to estimate the nutricline depth.

2.4.2. Delineation of Regions

The regions under consideration for this study are the Eastern Temperate North Atlantic (ETNA) [Lat. 49.6˚N-43.2˚N] Western North Atlantic Gyre (WNAG) [Lat. 34.5˚N-19.8˚N], Eastern North Atlantic Gyre (ENAG) [Lat. 43.0˚N-18.1˚N], Western Equatorial (WEQ) [Lat. 17.9˚N-5.9˚S], Eastern Equatorial (EEQ) [Lat. 17.8˚N-5.9˚S], Western South Atlantic Gyre (WSAG) [Lat. 6.0˚S-34.0˚S], Eastern South Atlantic Gyre (ESAG) [Lat. 6.2˚S-33.0˚S], Western Temperate South Atlantic (WTSA) [Lat. 34.1˚S-48.2˚S], and Eastern Temperate South Atlantic (ETSA) [Lat. 33.9˚S-41.5˚S] (Fig. 1). These boundaries are determined using inflection points along the nutricline depth and the temperature profile.

2.4.3. Cell size

Cell size was determined by the conversion of cell count, collected during CTD casts (AMT28) at the top 200 m of the water column. . Flow cytometry samples (63 stations, 755 samples) were co-collected with the POM samples used in this study. Cell count was determined using two methodologies. The first method was collected without a filter and utilized an inverted microscope to estimate cell abundance and phytoplankton species composition (Utermöhl, 1958). This allowed for the estimates of diatoms, dinoflagellates, and coccolithophores. The second method measured cells using a Becton Dickinson FACSort flow cytometer to measure *Prochlorococcus, Synechococcus,* and pico-eukaryotes. Combining these two methods of collection allowed for a complete survey of phytoplankton groups.

Conversion of cell count to biomass (fg C cell) was done following the methodology from Moreno et al., 2022. Photoautotrophs were categorized into *Prochlorococcus, Synechococcus,* pico-eukaryotes, nano-eukaryotes, *Coccolithophore*, and *Cryptophytes*. Each cell type had a specific conversion factor in determining its biomass. Using a Monte Carlo approach, 95% confidence interval around cell size was determined using a normal distribution based on the mean and standard deviation. Then, a randomly chosen conversion factor was applied to each type. Allowing for 1000 runs, we estimate a 95% confidence interval (Moreno et al., 2022).

2.4.4. Metagenomics-informed nutrient stress

Metagenomically informed nutrient stress utilizes a subset of data from Ustick et al., 2021, utilizing the genome content of *Prochlorococcus* from the Atlantic Ocean. These metagenomic samples (276) were co-collected with the POM samples, across both transects, used in this study. Based on variation in *Prochlorococcus* population gene content, this study identified genes associated with nitrogen and phosphorus nutrient stress types. The severity of nutrient stress was quantified by calculating the frequency of nutrient acquisition genes within *Prochlorococcus* single-copy core genes and attributes the frequency to the genetic adaptation for overcoming nutrient stress type and severity. Moving forward the use of nitrogen/phosphorus gene index will refer to this calculation of nutrient stress. Although based on *Prochlorococcus*, there is a significant overlap between this genetic index of nutrient stress and both Earth System Models and whole community nutrient addition assays (Ustick et al., 2021).

Ustick et al., 2021 associated *Prochlorococcus* gene occurrences with different environmental nutrient stress conditions. They separated the genes by nutrient type (nitrogen, phosphorus, and iron) and nutrient stress severity (low, medium, and high). Our study utilizes the high stress severity for nitrogen and phosphorus. Iron has a more indirect influence on the C:N:P,

than nitrogen and phosphorus, which is why it will be omitted from this study. The stress severity associated with medium or low stress either followed the same pattern as the high nutrient stress or had no pattern at all, respectively, which is why this is also omitted. The function of the genes associated with high gene index are *focA*, *moaA-E, moeA*, *napA, narB, nirA (*for nitrogen) and *phoA, phoX* (for phosphorus). The functions of these genes are for the assimilation and uptake of nitrite and nitrate, and production of alkaline phosphatase.

2.4.5 N Derivation*

The derivation from Redfield nutrient concentration (N*) at a depth of 200 m was calculation:

$$N^*_{200} = [NO_3]^{-1}_{200} - 16[PO_4]^{-3}_{200}$$

A negative/ declining value would be indicative of nitrogen stress, while a positive/ increasing value would indicate phosphorus stress.

2.5. Data analysis

Data analysis was conducted using Matlab R2021b (MathWorks). An ANOVA analysis with a posthoc Tukey test was used to determine the relationship between the selected regions for environmental conditions and POM. The C:N:P ratios underwent a log transformation to achieve a normal distribution before the ANOVA analysis (Isles, 2020). Using R ver. 4.1.2 (R Core Team, 2021), we used generalized additive models (GAM) with package *mgcv* (v1.8) (Wood, 2017) to explain the strength of four variables in determining C:N:P (temperature, nutricline depth, nitrogen gene index, and phosphorus gene index).

3. Results

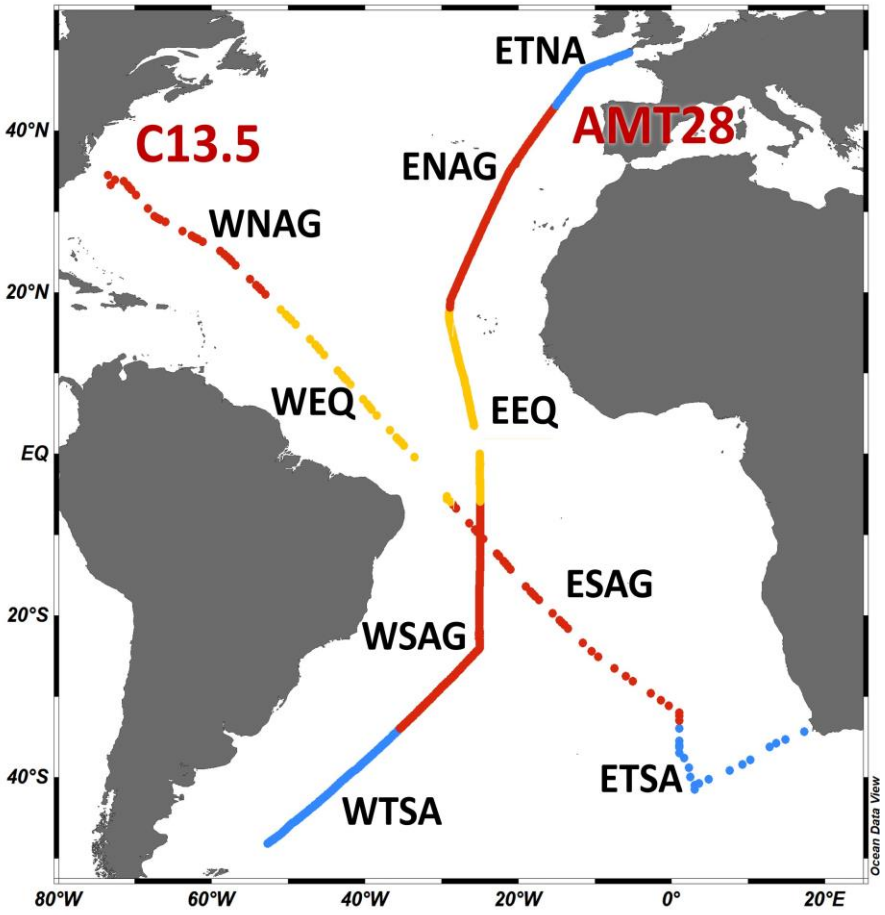

Figure 1. Map of oceanographic cruise transects AMT 28 (September 25 to October 27, 2018, n = 765) and C13.5 (March 21 to April 16, 2020, n = 112). Different oceanographic regions are separated using nutricline and temperature profiles (WTSA = Western Temperate South Atlantic, ETSA = Eastern Temperate South Atlantic, WSAG = Western South Atlantic Gyre, ESAG = Eastern South Atlantic Gyre, WEQ = Western Equatorial, EEQ = Eastern Equatorial, WNAG = Western North Atlantic Gyre, ENAG = Eastern North Atlantic Gyre, ETNA = Eastern Temperate North Atlantic). Colors delineate temperate (blue), subtropical (red), and equatorial upwelling regions (yellow).

POM concentrations, temperature, and nutricline profiles exhibited unique characteristics to each oceanographic region. Between the two transects, POC, PON, and POP concentrations were strongly correlated ($r = 0.68$, 0.71, and 0.70, respectively; $p < 0.001$) (Fig. 2a and S1). All POM pools had peak concentrations at high latitudes, troughs in the subtropical gyres, and intermediate concentrations at the equator. In high latitude temperate regions (WTSA, ETSA, and ETNA), POC (and overall POM) was significantly elevated (4.6 to 5.3 µM; $p < 0.05$) compared to all other regions (Equatorial: 2.8 µM, Gyre: 1.6 to 2.1 µM) (Fig. 2a, Fig. S2). POM concentrations also showed a zonal difference. There were higher concentrations of POM in the western regions compared to the eastern region of the Temperate South Atlantic, whereas the opposite was seen in the subtropical gyres (Fig. 2a and Fig. S2). At ~10˚ S, C13.5 and AMT 28 cross paths, we used a 1° cell centered on the intersection (using 9 samples), to find the difference between the POC, PON, and POP of the two cruises was 0.2%, 5.7%, and 10.6% respectively, indicating that seasonal variability between the had the greatest impact on POP. However, one sample is the cause of most of the error, within PON and POP, removing the

sample the difference becomes 2.9%, and 2.1% respectively. Temperature peaked equatorially (~ 28° C) for both transects and declined with increasing latitudes (Fig. 2b). We observed minor variation in the meridional temperature profile linked to the difference in the seasonal timing for each cruise leading to a slight southward shift in peak temperature during C13.5. Nutricline profiles for both transects were similar, with the deepest nutricline in the gyres and shallowest at high latitudes and the equator (Fig. 2c). Zonal variability in the nutricline depth was apparent, with the deepest values in the western side (135 to 150 m) compared to the eastern side of the gyres (114 to 116 m) (Fig. S2). Thus, we observed a robust meridional gradient in POM concentrations and environmental conditions but also a zonal gradient in nutricline depth in the oligotrophic subtropical gyres.

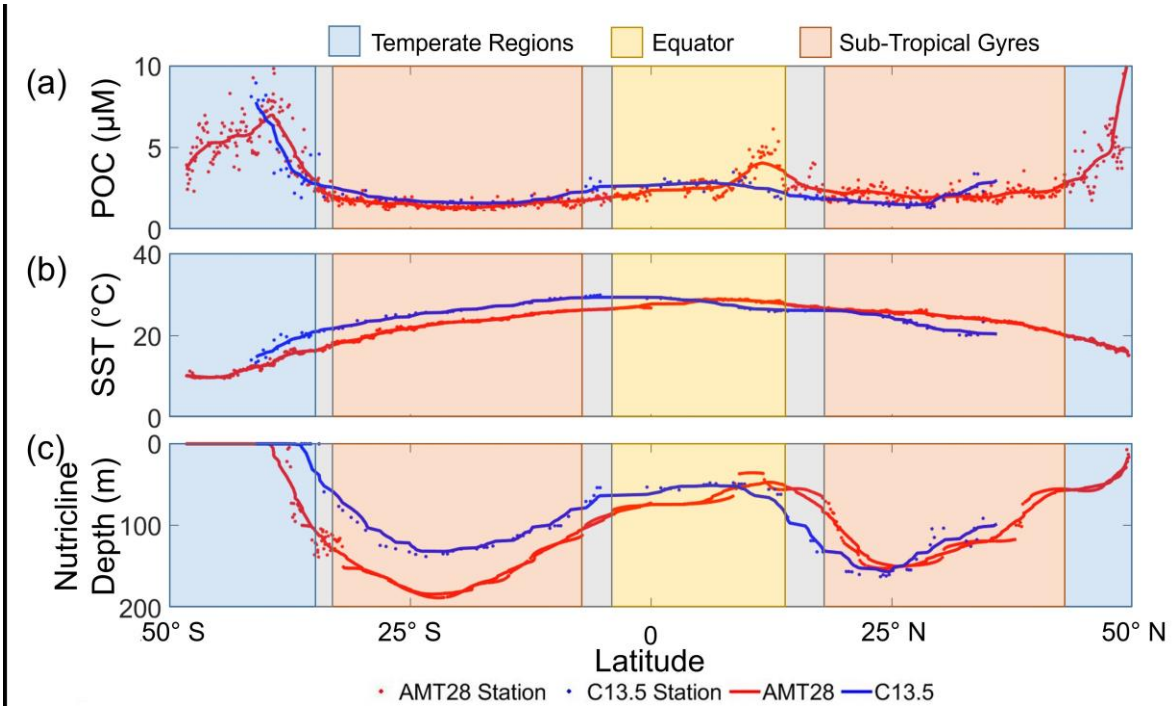

Figure 2. Meridional variability in POC concentrations and environmental conditions for AMT28 (boreal fall) and C13.5 (boreal spring). (a) Averaged surface POC concentrations, (b) surface temperature, and (c) nutricline depth presented as $Z_{nitrate} > 1$ μM. The trend lines represent the moving average of samples for AMT28 (red/ n=50) and C13.5 (blue/ n=20) transects. Background colors indicate broad oceanographic regions separated by latitude (blue = Temperate, red = Subtropical, yellow = Equatorial upwelling regions). Grey spaces between regions represent the difference in boundaries between the two transects.

We observed distinct latitudinal, zonal, and hemispheric C:N:P variability (Fig. 3). First, we detected peak ratios in the subtropical gyres, troughs in the high latitudes, and intermediate values at the equator for C:N, C:P, and N:P, matching patterns seen globally (Martiny et al., 2013b). In the subtropical gyres, averaged C:N values were noticeably elevated (7.0 to 7.6) compared to the other regions (Temperate: 6.0 to 7.2, EQ: 6.6 to 6.8) (Fig. 3a). C:P followed the same trend as C:N, with subtropical gyre regions being higher (148 to208) than the other regions (Temperate: 122 to 158, EQ: 136 to 161) (Fig. 3b). N:P showed parallel changes to C:P except the South Atlantic Gyre showed a N:P range encompassing those of all other regions (20.1 to 29.2) (Fig. 3c). Second, a zonal gradient was detected, whereby C:N was higher in the eastern

side of the South Atlantic Ocean compared to the western side (Fig. 3D). However, this zonal gradient was not observed in other regions. C:P also showed an opposite zonal trend with higher values on the western side, albeit only significantly different in the northern hemisphere (Fig. 3e). N:P showed the highest zonal variation. This ratio was significantly higher on the western (21.4) compared to the eastern side (17.1) of the South Atlantic Subtropical Gyre (Fig. 3f), converging at ~10˚ S and again elevated on the western side (29.2) compared to the eastern side (24.8) of the North Atlantic Subtropical Gyre (Fig. 3f). Again, using the 1° cell centered on this intersection, we determined C:N, C:P, and N:P had a 5.8%, 12.1%, and 5.9% difference, respectively, between the two cruises. One sample is the cause of a majority of the error, with its removal the difference becomes 2.6% for C:N and 1% for the rest. Third, there was also a hemisphere bias, whereby C:P, and N:P were elevated in the northern hemisphere and C:N somewhat higher in the southern hemisphere. In summary, we saw clear latitudinal, zonal, and hemisphere gradients in C:N:P across the Atlantic Ocean.

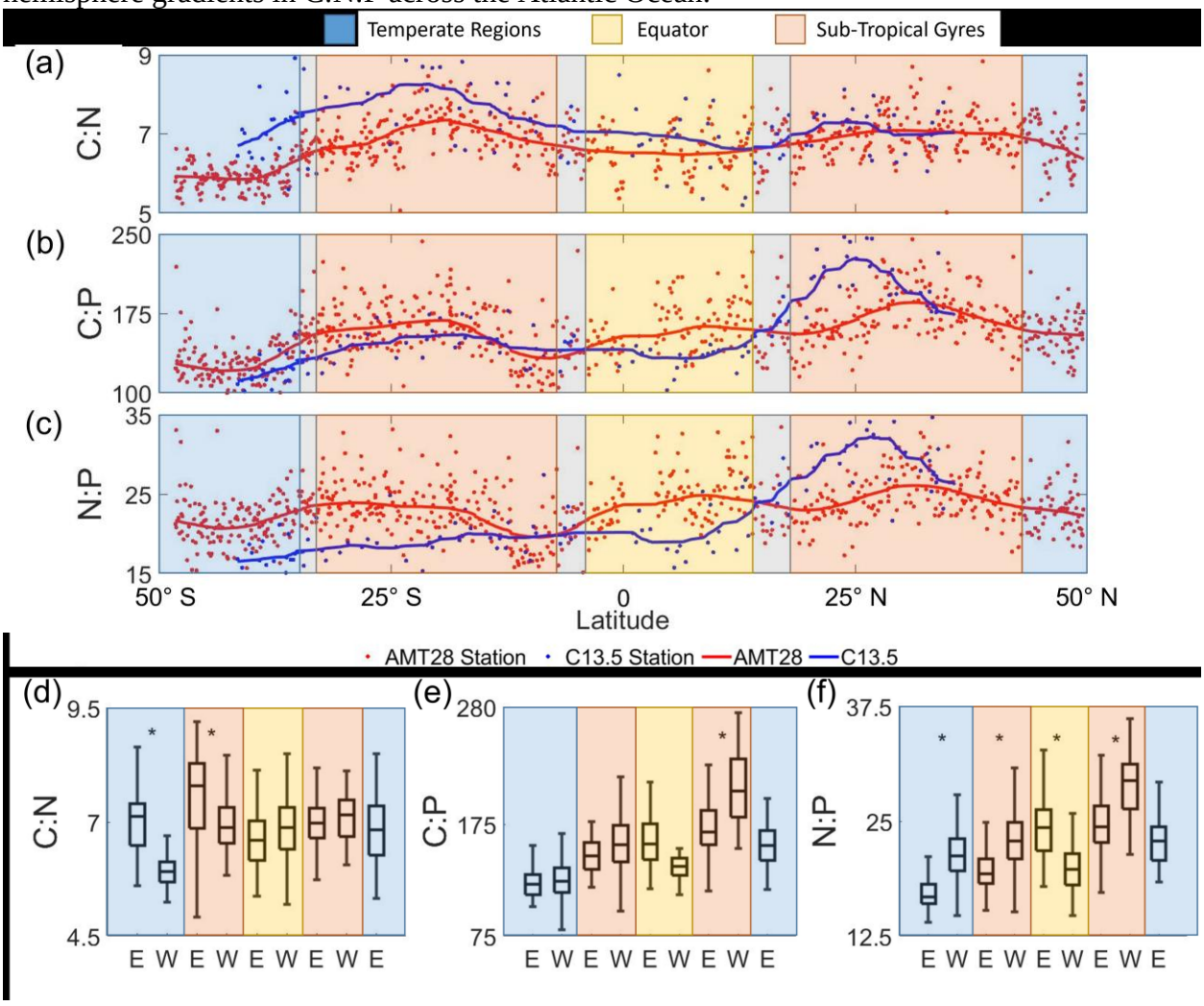

Figure 3. Latitudinal and regional shifts in POM stoichiometry. (a-c) Averaged observed surface C:N, C:P, and N:P. The trend lines represent the moving average of samples for AMT28 (red) and C13.5 (blue) transects. Linear regression line representative of all samples along the transects (black). (d-f) Regional C:N, C:P, and N:P represented by boxplots, where data were separated by latitude and longitude (E = East. W = West). Significant zonal (east-west) differences are denoted with * above plot based on Tukey posthoc significant difference test (p = 0.05). For all boxplots, a central black bar of the box represents the median value. The whiskers signify the range (min, max) of values excluding outliers.

The variability of C:N:P across regions can be partially explained when investigating N* at 200 m for AMT 28. Across the transect, N* has a positive value from 10° N to 50° N, with the remaining regions having a negative value (Fig. S3). As N* decreases from north to south indicating that the environment is becoming more nitrogen stressed. When comparing N* and N:P directly, there is only a weak correlation ($r = 0.48$, $p < 0.001$). Beyond the general increasing value of both N* and N:P from the south to the north, the features of the two plots do not line up directly. Rather it would appear that the peaks in N* more closely align with the troughs in N:P and vice versa.

Using flow cytometry cell counts, we were able to determine the concentration and total biomass of separate species of photoautotrophs at each station for AMT 28. From this, *Prochlorococcus* was determined to make up > 93% of the community in the subtropical gyres and equator, and over 50% of the total biomass. 67% of the northern temperate region community consisted of *Prochlorococcus* but only 10% of the biomass, and the South Temperate Atlantic Ocean was the only region without *Prochlorococcus* being the most abundant at 12% of the community and 1% of the biomass (Fig. S4). With the fractional biomass of the six phytoplankton size groups, we used a linear regression model to link to C:P along the transect. The regression model was able to describe the general characteristics of the in situ samples but failed to capture the detailed transitions ($R^2 = 0.23$ $p < 0.05$) (Fig. S5). While only being able to capture the general characteristics of the in situ samples and the dominant biomass of *Prochlorococcus* across the Atlantic, we found that the use of gene specific nutrient stress of *Prochloroccus* to be an acceptable driver of the variability of C:N:P within GAM.

The influence of phytoplankton composition, temperature, nutricline depth, and metagenomically assessed nitrogen and phosphorus stress (gene index) were tested as drivers of stoichiometry using a general additive model (GAM) (Fig. 4). Using GAM, we determined temperature and the nutrient gene indices captured 67% and 56% of the total deviance for C:P and N:P, respectively. For C:P, nutricline depth and phosphorus gene index accounted for 52.5% of the total (31.3% and 21.2%, respectively). For N:P, nutricline depth and phosphorus gene index accounted for 45% of the total (24.6% and 20.7%, respectively). We could only explain 30% of the total deviance for C:N, with the temperature being the most significant contributors (13% and 11%, $p < 0.001$ and $p < 0.01$ respectively). For C:N:P, nutricline depth was the dominant contributor to the latitudinal variability for two of the three ratios, being the second most dominant in the third, when investigating the entire basin (Fig. 4). When dividing the Atlantic Ocean into eastern and western boundaries, the four drivers tested were able to explain the variability of C:P and N:P more accurately in the western side (81% and 63% respectively) and C:P in the eastern side (38%) (Fig. S7 and S8, Table S2). From this division the dominant drivers remained nutricline depth and temperature for C:P and N:P, and became the dominant driver of C:N. While the drivers for C:N individually have a maximum of 7% difference between each other on either side of the Atlantic Ocean, regional focus is able to interpret changes in drivers that an ocean wide analysis would determine to be different.

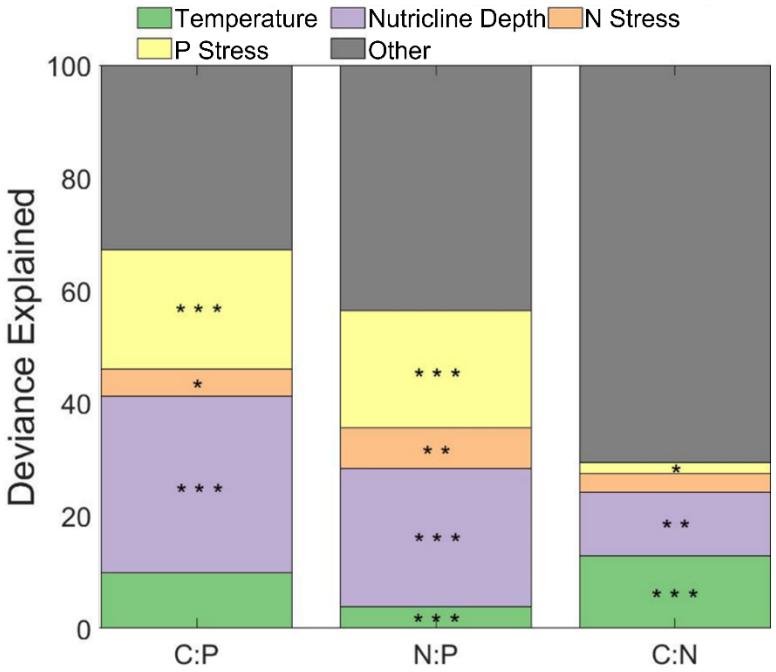

Figure 4. Influence of environmental factors on stoichiometry. Stars indicate the significance of smooth terms used for Generalized Additive Models (GAM). *** = $p < 0.001$, ** = $p < 0.01$, * = $p < 0.05$. Green represents the influence of temperature, purple represents the influence of nutricline depth, orange represents the nitrogen stress, yellow represents the phosphorus stress, and grey represents the remaining factors of influence on the variability of C:N:P. N and P stress are reflective of the nutrient gene index, which is quantified by calculating the frequency of the nutrient acquisition genes within *Prochlorococcus* single-copy core genes. The frequency is attributed to the genetic adaptation for overcoming nutrient stress type and severity.

A zonal gradient in nutricline depth and metagenomically assessed nitrogen and phosphorus stress matched C:N:P shifts (Fig. 3d–f). Nutricline depth was significantly deeper ($p < 0.05$) in the western part of subtropical gyres in both hemispheres (Fig. S2). Furthermore, there was a westward shift from nitrogen towards phosphorus stress (Fig. S6). This zonal shift in nutrient availability corresponds to a similar increase in C:P from 174 to 207 and N:P from 24.8 to 29.2 towards the western side of the oligotrophic gyres (Fig. 3e, f). In parallel, C:N showed the opposite trend declining from 7.6 on the eastern to 7.0 on the western side, matching a shift from nitrogen to phosphorus stress (Fig. 3D). GAM analyses conducted separately for western and eastern basins corroborated these observations highlighting that the relative importance of shifting nutrient stress (Fig. S7–9). In summary, zonal variability in nutrient stress, described by a westward deepening nutricline and increased phosphorus gene index, may regulate a zonal change in C:N:P.

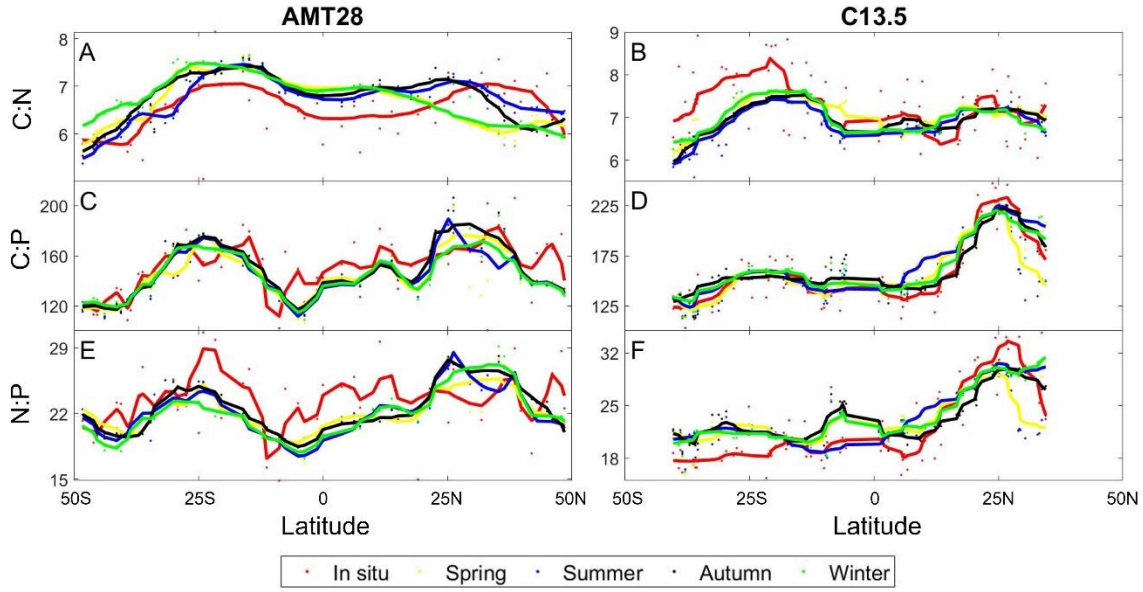

Figure 5. Predicted seasonal variability of stoichiometry across the Atlantic Ocean. Observed compared to predicted seasonal C:N for AMT28 (A) and C13.5 (B). Observed compared to predicted seasonal C:P for AMT28 (C) and C13.5 (D). Observed compared to predicted seasonal N:P for AMT28 (E) and C13.5 (F). Dots are discrete samples and the lines are moving averages over ten samples. AMT28 occurred during the fall 2018 and C13.5 during the spring 2020. In situ samples are red, predicted Spring is yellow, predicted Summer is blue, predicted Autumn is black, and predicted Winter is green.

We assessed the potential impact of seasonal environmental changes for C:N:P across the Atlantic Ocean. Seasonal environmental changes were characterized as shifts in nutricline depth and temperature, while assuming a stable biogeography of nitrogen vs. phosphorus stress (Fig. 5). This assumption is the result of only having gene stress information from the season samples were collected in. As a control, we saw a significant correlation between the observed and predicted C:N:P for the season matching the cruise occurrence (Table S3). However, the statistical model did not predict high C:N in the eastern South Atlantic Ocean and overestimated N:P in the equatorial and western South Atlantic Ocean. C:N:P ratios were predicted to be mostly stable across seasons. Although we detected shifts in C:N near the north sub-tropical convergence zone (~18° C) reflecting an expansion and contraction of oligotrophic conditions (Fig. 5a). The introduction of more dynamic biogeography of nutrient stress will be necessary to predict a more accurate seasonal variability of C:N:P across the Atlantic Ocean. However, from data available our statistical model predicted a mostly stable, seasonal C:N:P across the Atlantic Ocean.

4. Discussion

There was clear latitudinal variability in POM concentrations and stoichiometry across the Atlantic Ocean. We detected a high POM concentration and low C:N:P at higher latitudes, low POM concentrations and high ratios in the subtropical gyres, and intermediate values near the equator. This meridional gradient in POM concentrations and ratios corresponded to parallel changes in nutricline depth and thus likely linked to the overall nutrient supply. Similar gradients in concentrations and ratios have been detected in the Indian Ocean (Garcia et al., 2018), the Pacific Ocean (Lee et al., 2021), and in a global synthesis (Martiny et al., 2013b). Thus, our

observations add further support to systematic biome shifts in C:N:P across major ocean basins. Despite having similar gradients, the North Atlantic Ocean appears to be relatively unique with higher C:P and N:P ratios in the northern hemisphere compared to the south. Both the North Atlantic and the Indian Ocean's Bay of Bengal have comparable aerolian iron inputs, however, North Atlantic Ocean has an increase in N_2–fixation, which increases the N:P nutrient supply ratio, leading to widespread phosphorus stress (Capone, 2014; Schlosser et al., 2014; Ussher et al., 2013). The Bay of Bengal does not have significant N_2–fixation nor a significant change in C:P or N:P ratios (Garcia et al., 2018; Löscher et al., 2020). This lack of N_2–fixation is possibly the result of stress from another micronutrient for N_2–fixers.

Focusing on the influence of P stress, there is an increase in phytoplankton elemental C:P and, to a lesser extent, N:P throughout much of the North Atlantic Ocean. POP has a minimum concentration in the western North Atlantic Ocean (Fig. S1), suggesting that the parallel changes in N:P and C:P are caused by lower POP concentrations. Iron inputs decrease across the North Atlantic Ocean from east to west, with a majority of the POP concentrations following the same trend (Mahowald et al., 2005). While there is an increase in POP concentrations for C13.5, part of this is attributed to coastal upwelling. Had C13.5 continued North it is possible that the POP concentrations observed in the lower half of the North Atlantic gyre would have continued. Proposed explanations of this zonal difference results from a combination of vertical iron supply and lateral circulation across the Atlantic Ocean (Martiny et al., 2019). In the South Atlantic Ocean, aeolian iron inputs are significantly lower, as most dust is washed out at the Intertropical Convergence Zone (Capone, 2014). N_2–fixation is hence suppressed (Wang et al., 2019), allowing most of the southern hemisphere to display elevated N stress. This rise in nitrogen stress likely causes the depressed PON concentrations (Fig. S1) and elevated C:N but depressed N:P in much of the South Atlantic Ocean. Thus, the hemisphere deviation in C:N:P is hypothesized to be driven by a causal link between iron inputs, N_2–fixation, and shifts between the nitrogen and phosphorus gene index (Martiny et al., 2019).

An additional zonal gradient in C:N:P may be linked to the westward deepening of the nutricline and a parallel shift from primarily nitrogen stress towards an increase in phosphorus stress. Phosphorus stress is detected throughout the central North Atlantic Ocean based on both the gene index and N* (Ustick et al., 2021), however both C:P and N:P are significantly higher on the western side. Using the nutricline depth as proxy of nutrient supply, the nutrient supply appeared greater on the eastern side, in addition, aeolian nutrient inputs could relieve nutrient stress towards the east, suppressing C:P and N:P ratios (Kremling and Streu, 1993; Mills et al., 2004; Garcia et al., 2018; Neuer et al., 2004). The South Atlantic Ocean also has the east–west variability for C:N:P, C:N having the largest gradient. From the nutrient gene index and N*, the South Atlantic Ocean is predominantly nitrogen stressed. Zonal shifts in C:N:P can be explained by shallower nutricline depth and a higher nitrogen gene index in the eastern part and higher phosphorus gene index in the western part of the South Atlantic Ocean (Ustick et al., 2021; Martiny et al., 2019). Thus, we observe zonal variability in POM concentrations and their stoichiometric ratios, superimposed on the larger meridional and hemisphere gradients.

Nitrogen and phosphorus stress are assessed based on genomic changes and adaptation in *Prochlorococcus* populations (Ustick et al., 2021). With *Prochlorococcus* being the most abundant phytoplankton and that it forms most of the phytoplankton biomass in the gyres and equatorial regions, and northern temperate population, it is likely closely linked to the bulk phytoplankton community physiological status (Fig. S4) (Marañón et al., 2000; Zwirglmaier et al., 2007). Additionally, *Prochlorococcus* and *Synechococcus* express nearly identical responses

across a transect with regions of different nutrient stress (i.e. when *Prochlorococcus* had a high phosphorus gene index, *Synechococcus* had a high phosphorus gene index as well) (Garcia et al., 2020). Within the South Atlantic Ocean, the use of bioassays and deficiency calculations agree with *Prochlorococcus* gene stress, being primarily nitrogen stressed, yet disagree within the North Atlantic Ocean (Browning and Moore, 2023). While previous bottle experiments of nutrient stress in the North Atlantic Ocean describe it as being dominantly or co-stressed by nitrogen and phosphorus, respectively, the gene index describes the North Atlantic as dominantly phosphorus stressed. This suggests that there is a significant difference between the different assays in determining the nutrient stresses phytoplankton experience. This study focused on factors that had direct influence on C:N:P, we then chose to forgo using co-stressors of nutrients or the use of iron stress. Along with direct influence, these samples match one to one with the POM samples collected on the cruises.

It was determined through the use of GAM, that nutricline depth, phosphorus stress, and temperature were the main drivers in the variability of C:N:P. These finding are similar to those of a global synthesis that determined nutricline and gene index were the dominant drivers of C:N:P variability within the tropical and subtropical regions (Tanioka et al., 2022). While their pole–wards assessment determined that temperature was the dominant driver, the samples used in this study fall primarily within tropical/ subtropical bounds (49 of 877 samples are outside of this range). C:P and N:P generally agreed with this global model assessment, but C:N temperature had a smaller influence globally than for the Atlantic Ocean. With the relatively small amount of variance determined for C:N, it is possible that the northern most samples had a major impact on the determination of temperatures influence, as seen with Tanioka et al., 2022, in which temperature was determined to be the most significant driver for the variance of C:N. With respect to the other section of the GAM analysis, the factors with a more indirect relationship to C:N:P could have a significant role, especially with C:N (i.e. the influence of iron stress or light availability).

The predicted restricted changes in seasonal values of C:N:P were able to fall in the middle to lower range of the observed seasonal averages of those observed at BATS, representing the fall and winter seasons better than spring and summer (Singh et al., 2015). It is worth noting that while the values were able to capture the lower range, the ratios measured during C13.5 closest to BATS, were lower than the measured monthly averages. Since C13.5 was unable to take CTD measurements, the nutricline depth from WOA might not accurately represent the actual nutricline depth during the transect, leading to potential changes in the predictive seasonal values. The intersection point of the two transects (~10˚ S) also indicates minimal seasonal influence as the POM and stoichiometric values despite collection occurring in opposite seasons. Using the values predicted by GAM for the same parameters, there was less than a 2% difference in C:N:P between fall and spring indicating that some of the assumptions made with the predictors weakened the sensitivity of the model. Without this sensitivity, the predictive model suggests that the observed biogeography of C:N:P is stable in most of the central Atlantic Ocean,. In summary, we detect clear meridional, hemisphere, and zonal gradients in elemental stoichiometry that corresponds to changes in nutrient supply and stress type, but additional factors may also provide a significant influence on regional shifts in C:N:P across the Atlantic Ocean.

Our observations from the Atlantic Ocean have implications for predicting future changes to the ocean carbon cycle. Recent models have suggested that C:N:P variability can ‘buffer’ the effects of stratification and reduced nutrient supply on primary productivity and carbon

sequestration (Kwon et al., 2022, Tanioka and Matsumoto, 2017). Such models of C:N:P variability have so far been tied to surface phosphate concentrations (Galbraith and Martiny, 2015). However, our observations from the Atlantic Ocean indicate that subtle shifts between nitrogen and phosphorus stress can have additional impacts on the elemental stoichiometry. N_2–fixation in the North Atlantic Ocean is likely responsible for part of the shift in nutrient stress type. The hemispheric variability of nutrient stress suggests an additional role of iron supply in regulating C:N:P. Thus, climate change may alter future patterns of C:N:P as the perturbation of air–sea dynamics can modulate the strengths of boundary currents, the slope of a westward nutricline (Kelly et al., 2010), or the aeolian deposition of iron (Krishnamurthy et al., 2010). Such shifts in C:N:P could, in turn, have large impacts on global nitrogen fixation, primary production, or carbon sequestration.

Conflict of interest

The authors declare no conflicts of interest relevant to this study.

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Data availability statement

The AMT data set presented here is publicly hosted by the British Oceanographic Data Centre (https://doi.org/10.5285/b5900384-89f0-3a38-e053-6c86abc0409d). Hydrographic data from the AMT28 transect are available (https://cchdo.ucsd.edu/cruise/74JC20180923). The particulate organic matter data from the C13.5 transect are available here (https://www.bco-dmo.org/dataset/868908). Hydrographic data from C13.5 data are available (https://cchdo.ucsd.edu/cruise/33RO20200321). Nutricline depth for C13.5 is calculated from gridded annual mean nitrate data from World Ocean Atlas 2018 (https://www.ncei.noaa.gov/data/oceans/woa/WOA18/DATA/).

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