1 2	In-situ estimates of net primary production in the Western North Atlantic with Argo profiling floats
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21	Key Points:
22 23	• Net primary production derived from Argo-based bio-optical measurements was comparable and complementary to <sup>14</sup> C incubation and satellite estimates
24 25	• Both Carbon based Productivity Model and Photoacclimation Productivity Model have their own advantages and limitations
26 27 28	• NPP profiles showed varying seasonal NPP distribution patterns along a North-South transect in the Western North Atlantic Ocean

#### 29 Abstract

The <sup>14</sup>C incubation method for Net Primary Production (NPP) has limited 30 spatial/temporal resolution, while satellite approaches cannot provide direct information at depth. 31 With chlorophyll-a and backscatter measurements from BGC-Argo floats, we quantified year-32 round NPP in the western North Atlantic Ocean using both the Carbon-based Productivity Model 33 (CbPM) and Photoacclimation Productivity Model (PPM). Comparison with NPP profiles from 34 <sup>14</sup>C incubation measurements showed advantages and limitations of both models. CbPM 35 36 reproduced the magnitude of NPP in most cases. However, in the summer the CbPM-based NPP had a large peak in the subsurface, which was an artifact from the subsurface chlorophyll 37 maximum caused by photoacclimation. PPM avoided the artifacts from photoacclimation, but the 38 magnitude of PPM-derived NPP was smaller than the <sup>14</sup>C result. Different NPP distribution 39 patterns along a North-South transect in the Western North Atlantic Ocean were observed, 40 including higher winter NPP/lower summer NPP in the south, timing differences in NPP 41 seasonal phenology, and different NPP depth distribution patterns in the summer months. Using 42 a 6-month record of concurrent oxygen and bio-optical measurements from two Argo floats, we 43 also demonstrated the ability of Argo floats to obtain estimates of the net community production 44 (NCP) to NPP ratio, ranging from 0.3 in July to -1.0 in December 2016. Our results highlight the 45 utility of float bio-optical profiles and indicate that environmental conditions (e.g. light 46 availability, nutrient supply) are major factors controlling the seasonality and spatial (horizontal 47

48 and vertical) distributions of NPP in the western North Atlantic Ocean.

#### 49 **1 Introduction**

Biological productivity by upper-ocean phytoplankton communities is central to marine 50 biogeochemistry, carbon cycling, and ecosystem health. Phytoplankton net primary production 51 (NPP), defined as gross photosynthetic carbon fixation minus the carbon respired by 52 phytoplankton themselves, is a key metric of biological productivity. Traditional methods for 53 NPP measurements rely on ship-based discrete sampling and bottle incubations (e.g., <sup>14</sup>C 54 incubation), which introduce potential artifacts and limit the spatial and temporal coverage of the 55 global ocean. Over the past several decades, the establishment of operational ocean-observing 56 satellite networks made it possible to make reasonable estimates of large-scale ocean NPP 57 patterns. The global distribution of NPP has been estimated using satellite observations with the 58 59 Vertically Generalized Production Model (VGPM, Behrenfeld and Falkowski, 1997) and Carbon-based Productivity Model (CbPM, Behrenfeld et al., 2005; Westberry et al., 2008). 60 However, the satellite remote sensing approach cannot provide direct information at depth, and 61 also lacks coverage in regions with high solar zenith angles or obscured by clouds. 62

63 The development of instruments/sensors on underway and autonomous platforms provides a complementary approach to ship-based <sup>14</sup>C incubation and satellite remote sensing 64 methods. As an example of the application of underway surface measurements, Burt et al., 65 [2018] combined underway bio-optical measurements and mass spectrometry to study spatial 66 distributions of NPP, net community production (NCP), and the NCP to NPP ratio in subarctic 67 Northeast Pacific surface waters during the spring/summer growth season (May to July). As for 68 69 previous depth-resolved studies using in-situ autonomous platforms, the 2008 North Atlantic Bloom Experiment (NAB08) used Lagrangian floats and a Seaglider to obtain high-resolution 70 measurements within a single phytoplankton patch in the subarctic North Atlantic (59° N to 62° 71 N) during the spring bloom from April to May [Alkire et al., 2012]. During the NAB08 72 73 experiment, phytoplankton biological carbon production was studied in the context of NPP (derived from bio-optical measurements [Briggs et al., 2018]), particulate organic carbon (POC, 74 derived from bio-optical measurements [Alkire et al., 2012]), and NCP (derived from oxygen and 75 nitrate mass balance [Alkire et al., 2012]). A similar experiment with autonomous floats was 76 conducted later in the subtropical North Atlantic near Bermuda Atlantic Time-Series (BATS) 77 stations from 2013 to 2014, in which a modified CbPM model was used for NPP estimation 78 79 [Estapa et al., 2019].

The western North Atlantic Ocean is an area with one of the most significant, open-ocean 80 phytoplankton seasonal blooms in the global ocean. From 2015 to 2018, a time-series study was 81 conducted in this region during the North Atlantic Aerosols and Marine Ecosystems Study 82 (NAAMES, https://naames.larc.nasa.gov/) funded by the National Aeronautics and Space 83 Administration (NASA). The objective of NAAMES was to study the key processes controlling 84 ocean system function, their influences on atmospheric aerosols, and their implications for 85 climate [Behrenfeld et al., 2019]. Four research cruises were conducted from 2015 to 2018, with 86 comprehensive shipboard sampling and measurements of biological production (including <sup>14</sup>C 87 incubation experiments for NPP). Biogeochemical Argo (BGC-Argo) floats were deployed 88 during these campaigns, thereby providing a unique opportunity for comparisons between 89 shipboard measurements and Argo float measurements. In our previous work, we used the 90 NAAMES BGC-Argo data to analyse the phytoplankton phenology in the context of 91 92 phytoplankton growth rate and carbon accumulation rate [Yang et al., 2020]. In this work, we use the BGC-Argo data to derive depth-resolved NPP with two different bio-optical models. The

Argo-based NPP is first evaluated against  $^{14}$ C incubation NPP data from the NAAMES cruises,

- followed by an analysis of the spatial and temporal distributions of NPP in the western North
- Atlantic. We also demonstrate the possibility of obtaining in-situ seasonal NCP to NPP ratios,
- 97 using a six-month concurrent record of bio-optical and oxygen measurements from two Argo
- 98 floats.

## 99 **2 Methods**

## 100 2.1 Research area

This study utilized field data from the NASA North Atlantic Aerosol and Marine
Ecosystem Study (NAAMES, *Behrenfeld et al.*, [2019]). Our research area, located in the North
Atlantic Ocean between 39° N to 54° N and 36° W to 46° W (Figure 1), was divided into
northern (more temperate) and southern (more subtropical) regions with the partition at 47° N,
roughly following the categorization by *Della Penna and Gaube* [2019].

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# 107 2.2 In-situ bio-optical measurements

Chlorophyll-a concentration (*Chl*), phytoplankton carbon biomass ( $C_{phyto}$ ), salinity (S), 108 temperature (T), and pressure (P) data used for NPP calculation were obtained from five BGC-109 Argo floats (n0572, n0849, n0850, n0851, n0852, WMO number 5902460, 5903106, 5903107, 110 111 5903108, and 5903109) deployed by the University of Maine (Figure 1). These five floats were chosen because each of them had several profiles nearby NAAMES cruise stations where ship-112 based <sup>14</sup>C NPP incubations were conducted, so that the performance of Argo float estimates of 113 NPP could be evaluated. Chl was estimated from fluorometers on BGC-Argo floats, where the 114 fluorometers were calibrated against discrete HPLC samples collected during NAAMES cruises. 115 Float-measured particulate backscattering coefficients at 700 nm (bbp 700) were first converted 116 to bbp at 470 nm using a power-law function with an exponent of 0.78 following Boss et al., 117 [2013] and assuming the particulate backscattering ratio to be wavelength invariant. And then 118  $C_{phyto}$  was calculated using bbp 470 with the algorithm from *Graff et al.* [2015]. It should be 119 noted that a drawback of such approach is that a portion of the scattered light is due to non-algal 120 particles. The floats operated with a profiling frequency from 1 to 5 days and had a depth 121 resolution of ~2 m in the upper 500 m and ~4 m from 500 m to 1000 m. The BGC-Argo float 122

data and documentation are available at <u>http://misclab.umeoce.maine.edu/floats/</u>.

# 125 2.3 NPP calculation

126 2.3.1 Carbon based productivity model (CbPM)

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127 The first NPP model used in this study is the original CbPM model [*Behrenfeld et al.*,

128 2005]. In the CbPM, mixed layer NPP was calculated as the product of phytoplankton carbon 129 ( $C_{phyto}$ , mg C m<sup>-3</sup>) and phytoplankton specific growth rate ( $\mu$ , d<sup>-1</sup>) in the mixed layer:

$$NPP_{mld}^{CbPM} = C_{phyto} \cdot \mu \qquad \qquad \text{mg C m}^{-3} d^{-1} \qquad (1)$$

130 where  $\mu$  was calculated using the equation modified CbPM [*Westberry et al.*, 2008]:

$$u = \frac{2 \cdot Chl/C_{phyto} \cdot (1 - exp^{-5I_g})}{0.022 + (0.045 - 0.022) \cdot exp^{-5I_g}}$$
 d<sup>-1</sup> (2)

- and where Chl is the chlorophyll concentration (mg m<sup>-3</sup>),  $I_g$  is the median daily light level (mol
- photons m<sup>-2</sup> h<sup>-1</sup>) in the mixed layer. The value of  $I_g$  was estimated using satellite-derived surface
- photosynthetically active radiation (*PAR*) at the ocean surface ( $I_0$ ) following:

$$I_g = I_0 \cdot exp^{-K_{PAR} \cdot MLD/2} \qquad \text{mol photon m}^{-2} d^{-1} \qquad (3)$$

- 134 where the mixed layer depth (*MLD*) (m) was defined by a density offset from the value at 10 m
- with a threshold of 0.03 kg m<sup>-3</sup> [*deBoyer Montégut et al.*, 2004] using float-measured S and T.
- 136  $K_{PAR}$  is the diffuse attenuation coefficient of PAR, which was calculated using Equations 4a and 137 4b [*Morel et al.*, 2007].

$$K_{PAR} = 0.0864 + 0.884 \cdot K_{490} - 0.00137 \cdot K_{490}^{-1}, when MLD \le K_{490}^{-1}$$

$$K_{PAR} = 0.0665 + 0.874 \cdot K_{490} - 0.00121 \cdot K_{490}^{-1}, when MLD > K_{490}^{-1}$$
(4a)
(4b)

 $K_{PAR} = 0.0665 + 0.874 \cdot K_{490} - 0.00121 \cdot K_{490}, \text{ when MLD} > K_{490}$ (40) where  $K_{490}$  is the 490 nm diffuse attenuation coefficient (m<sup>-1</sup>), calculated from float-measured chlorophyll-a concentration [*Morel and Maritorena*, 2001]:

$$k_{490} = 0.0166 + 0.07242 \cdot Chl^{0.68955} \qquad \text{m}^{-1} \qquad (5)$$

140 It should be noted that for depth-resolved NPP, the CbPM calculation was performed using the 141 full Argo *Chl* and  $C_{phyto}$  profiles, and the actual light level at each depth ( $I_z$ ).

$$I_z = I_0 \cdot exp(-K_{PAR} \cdot Z) \qquad \text{mol photon } \text{m}^{-2} \text{ d}^{-1} \qquad (6)$$

142

143 2.3.2 Photoacclimation productivity model (PPM)

- 144 The second model used in this study is the Photoacclimation Productivity Model (PPM)
- developed during the NAAMES project [*Fox et al.*, 2020]. Similar to the CbPM, this second
- approach computes depth-resolved NPP using an estimate of phytoplankton growth rate and
- biomass (Equation 1), but it also uses the photoacclimation model of *Behrenfeld et al.* [2016] to
- 148 account for nuances of chlorophyll synthesis caused by dynamic exposure to light and darkness 149 in the mixed layer. Accordingly,  $\mu$  was calculated as:

$$\mu = \left[ \left( \frac{1}{\theta_{DM}} \left( -16.80 \right) + 1.57 \right) \cdot \left( \frac{1}{\theta_{PaM}} \left( 47.03 \right) + 0.0125 \right) \right] \cdot \left[ 1 - e^{(-5 \cdot I_z)} \right] \qquad d^{-1} \qquad (7)$$

- 150 where  $\theta_{DM}$  represents a deep-mixing term that accounts for molecular signals regulating
- 151 chlorophyll synthesis during exposure to darkness, such that chlorophyll synthesis abates:

$$\theta_{DM} = 19 \cdot e^{(0.038 \ I_0^{0.45}/k_{PAR})} \tag{8}$$

# and $\theta_{PaM}$ implements a shallow-mixing correction for mixed layers less than 6 optical depths:

$$\theta_{PaM} = 19 \cdot e^{(0.038 \ I_0^{0.45}/k_{PAR})} \cdot \frac{1 + e^{(-0.13I_0)}}{1 + e^{(-3I_g)}}$$
(9)

153 The PPM assumes that dark conditions occur at depths greater than 6 optical depths and that the

- 154 value of  $\theta_{PaM}$  for mixing depths greater than this horizon are described by  $\theta_{DM}$ . For depths below
- the mixed layer the shallow-mixing term is not applied in the second component of Equation 7
- (i.e.  $\theta_{DM}$  is used instead of  $\theta_{PaM}$ ). The final term in Equation 7 describes the reduction in growth
- rate resulting from decreasing ambient light, which is estimated iteratively with depth. This
- decrease reflects the strength of the light limitation effect on  $\mu$  and is characterized by the
- exponent (-5) [Westberry et al., 2008]. As with the CbPM,  $I_z$  in equations 7-9 is the PAR value at
- 160 depth of Z (m), which was estimated from surface PAR using Equation 6.
- 161

## 162 **2.4 Evaluation of Argo-derived NPP with <sup>14</sup>C incubation result**

- 163 Ship-based <sup>14</sup>C NPP incubation results are still the gold standard of NPP measurements in 164 the field, recognizing that there might be some artifacts from <sup>14</sup>C incubation experiments [*Morán* 165 *et al.*, 2007; *Westberry et al.*, 2012] as well as potential uncertainties here from the
- temporal/spatial mismatches of Argo and incubation data. The <sup>14</sup>C NPP data from nine stations
- 167 (black stars in Figure 1) on three NAAMES cruises were used to evaluate the performance of the
- bio-optical-measurement-based Argo NPP estimates. Evaluations are presented in the context of

surface NPP (Section 3.1.1) and depth-resolved NPP (Section 3.1.2), respectively. When there
 were multiple Argo profiles during the same 24-hour incubation experiment, the Argo-derived
 NPP values were averaged and then compared with the <sup>14</sup>C incubation result. Type II linear
 regression was used for the evaluation because both Argo-based NPP and <sup>14</sup>C-based NPP are

- regression was used for the evaluation because both Argo-based NPP and <sup>14</sup>C-based NPP are measured parameters with uncertainties and dependent on the same environmental conditions
- and biological/physical processes.
- 175 NPP data from <sup>14</sup>C incubation experiments during NAAMES 1 to NAAMES 4 cruises

176 (stations shown in Figure 1) are available at <u>https://seabass.gsfc.nasa.gov/experiment/NAAMES</u>.

177 In brief, water collected by Niskin bottles pre-dawn were spiked with <sup>14</sup>C-bicarbonate and

incubated for 24 hours (dawn-to-dawn) at different light levels (corresponding to the sample
depth) in on-deck incubators to provide depth-resolved NPP (full details are provided in *Fox et*

180 *al.*, [2020]). 181

## 182 **2.5 Auxiliary data**

For comparison purposes, satellite-based estimates of surface NPP were compiled from 183 Moderate Resolution Imaging Spectroradiometer (MODIS) products (Chl, b<sub>bp</sub>, T, PAR, 184 http://sites.science.oregonstate.edu/ocean.productivity/1080.by.2160.8day.inputData.php) and 185 using the same CbPM algorithm described in section 2.3.1. The MODIS dataset used here had a 186 spatial resolution of 0.167 by 0.167 degrees and a temporal resolution of 8 days. The Chl product 187 188 was derived using the Garver-Siegel-Maritorena model (GSM) algorithm [Maritorena et al., 2002]. The gridded satellite product was interpolated to match the float data. A 1D interpolation 189 in time was applied first to match the time steps of Argo measurements and then a 2D 190 interpolation in space was applied to interpolate the gridded satellite data to the Argo location. 191 We also used MODIS derived surface *PAR* as  $I_0$  for Argo NPP calculations because there were 192 no reliable Argo-based PAR data for NPP calculations. Monthly nitrate data used in our analysis 193 was taken from a 1 degree gridded global nitrate field from the World Ocean Atlas 2013 [Garcia 194 *et al.*, 2013], presented as the area mean of each region (northern region:  $46 - 36^{\circ}W$ ,  $47 - 54^{\circ}N$ ; 195 southern region:  $46 - 36^{\circ}$ W,  $39 - 47^{\circ}$ N). 196

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## 198 **2.6 In-situ oxygen measurement and NCP calculation**

Oxygen data from the five NAAMES BGC-Argo floats lacked sufficient in-situ 199 calibration to assure adequate accuracy required for air-sea gas calculations as the floats did not 200 201 measure oxygen in air [Bittig et al., 2018]. Therefore, the oxygen data used for NCP calculations were obtained from a nearby Special Oxygen Sensor Argo float (9764, WMO number 5704770) 202 (Figure 1), together with the corresponding salinity, temperature, and depth data. Only 6-months 203 of data (from July to December 2016) were utilized for calculating NCP-to-NPP ratios, 204 corresponding to when the trajectory of SOS-Argo f9764 was close to the BGC-Argo n0572. It 205 should be noted that using NCP and NPP estimates from two different floats introduces more 206 207 uncertainties (e.g. spatial offsets) into the NCP-to-NPP ratio estimate. Oxygen was measured using the air-calibrated Aanderaa optode  $O_2$  sensors on the SOS-Argo float, with an accuracy 208 better than  $\pm 0.2$  % [Bushinsky et al., 2016]. The profiling float operated at an interval of 5 days, 209 covering depths from the surface to ~ 1900 m. The vertical resolution in the top 200 m (where 210 most of the carbon production occurs) was 3-5 m. The SOS-Argo float data are available at 211

212 <u>https://sites.google.com/a/uw.edu/sosargo/home</u>.

NCP was calculated using a one-dimensional mixed layer O<sub>2</sub> mass-balance model, simplified from a multi-layer model used in our previous studies [*Bushinsky and Emerson*, 2015;

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- 215 *Yang et al.*, 2018, 2019]. Briefly, the time rate of change in the mixed layer oxygen inventory
- 216  $(dh[O_2]/dt, \text{ mol } O_2 \text{ m}^{-2} \text{ d}^{-1}, \text{ where } h \text{ is the mixed layer depth}) \text{ is the result of gas exchange } (F_{A-W}),$
- vertical advection ( $F_w$ ), entrainment ( $F_E$ ), diapycnal eddy diffusion ( $F_{Kz}$ ) at the base of the mixed layer, and net biological oxygen production ( $F_{NCP}$ ):

$$\frac{dh[O_2]}{dt} = F_{A-W} + F_W + F_E + F_{KZ} + F_{NCP} \qquad \text{mmol } \text{m}^{-2} \text{ d}^{-1} \qquad (10)$$

- The net biological  $O_2$  production ( $F_{NCP}$ ) is evaluated as the difference between the measured  $O_2$
- time rate of change  $(d[hO_2]/dt)$  and the calculated fluxes  $(F_{A-W}, F_W, F_E \text{ and } F_{K_z})$ , and then
- converted to carbon production (NCP) with a constant oxygen to carbon molar ratio of 1.45
- [*Hedges et al.*, 2002]. The dominant term in the oxygen mass balance (other than  $F_{NCP}$ ) is the airsea gas exchange ( $F_{A-W}$ ), which was derived with the Argo-measured O<sub>2</sub> and satellite-measured wind speed (U<sub>10</sub>, from the advanced scatterometer, ASCAT,
- 225 <u>http://apdrc.soest.hawaii.edu/las/v6/</u>) using an air-sea gas exchange model developed by *Liang et*
- *al.*, [2013] and improved by *Emerson et al.*, [2019].
- 227

#### 228 **3 Results and Discussion**

#### 229 **3.1 Evaluation of Argo-derived NPP**

230 3.1.1 Evaluation of Surface NPP

For surface NPP comparisons, <sup>14</sup>C NPP data with sample/incubation depths shallower than 5 m were chosen and compared with the corresponding Argo NPP results. The CbPM model yielded surface NPP values close to the <sup>14</sup>C NPP values (Figure 2a, with the slope of type II regression = 0.80, R = 0.93, RMSD = 0.41 mmol m<sup>-3</sup> d<sup>-1</sup>). The regression line for PPM NPP was further from the 1:1 line (grey solid line), with a slope of 0.44 (Figure 2b, R = 0.88, RMSD = 0.29 mmol m<sup>-3</sup> d<sup>-1</sup>).

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#### 238 3.1.2 Evaluation of Depth-resolved NPP

A type II linear regression (Figure 3j, the green dotted line) showed good agreement 239 between the CbPM-based Argo approach and  $^{14}$ C measurements of depth-resolved NPP (R = 240 0.90, RMSD = 0.51 mmol m<sup>-3</sup> d<sup>-1</sup>), and the slope of 0.99 showed that the CbPM model 241 performed well in reproducing the magnitude of NPP. The largest discrepancy between the <sup>14</sup>C 242 NPP and CbPM-based Argo NPP occurred at mid-depths during the NAAMES 3 cruise 243 (September 2017, yellow triangles in Figure 3j). The mid-depth NPP maximum indicated by the 244 Argo data (also consistent with the mid-depth Chl-a maximum, Figure S6) was not found in most 245 of the <sup>14</sup>C incubation profiles (except for the slightly elevated NPP at N3S2 around 50 m, see 246 below), the most likely explanation for such a mismatch being elevated chlorophyll levels from 247 subsurface photoacclimation. In the summer or early fall when surface and upper-ocean light 248 249 intensity is high, phytoplankton decrease the concentration of light-harvesting pigments such as chlorophyll a, while the same pigments increase at mid-depth as the light level decreases. This 250 cellular process likely causes the subsurface peak of Chl-a (Figure S6) observed in the 251 September 2017 data. Because the CbPM model has limited capacity to account for 252 photoacclimation below the mixed layer depth, the subsurface peak of Chl-a also led to artifacts 253 of subsurface maximum in NPP (Figures 3e to 3h). 254 The correlation coefficient R and RMSD for PPM-based NPP were 0.81 and 0.37 mmol 255

 $m^{-3} d^{-1}$ , respectively (Figure 4j). However, compared to the CbPM approach, the regression line (green dotted line in Figure 4j) between depth-resolved PPM-based NPP and <sup>14</sup>C was also further

from the 1:1 line, with a slope of 0.50 (similar to the regression result in the surface: slope = 258 259 0.44, Figure 2b). There are several possible explanations for the underestimated NPP from PPMbased Argo approach. First, it is possible that the above mentioned temporal/spatial mismatches 260 of the Argo and cruise data and the potential artifacts from <sup>14</sup>C incubation affected the 261 comparison of <sup>14</sup>C-based NPP and CbPM/PPM-based NPP. Second, the PPM algorithm used for 262 Argo NPP calculation might have some systematic biases that are not, as of yet, fully understood. 263 The PPM model used modeled  $\theta_{PaM}$  rather than the measured Chl/C used in CbPM. Therefore, 264 the PPM model is less vulnerable to the high Chl/C caused by photoacclimation during the 265 summer months. As a result, the PPM-based Argo NPP did not have any large subsurface NPP 266 maximum for the NAAMES 3 cruise in September 2017 (Figures 4e to 4h). However, the PPM 267 result did show slightly elevated subsurface NPP (N3S1 near 30 m, N3S2 near 40 m, N3S3 and 268

N3S4 near 20 m), which was also captured by  ${}^{14}$ C NPP profiles (i.e. N3S2 and N3S3, Figures 4f and 4g) and was most likely due to the surface nutrient depletion (Figures S7, e-h).

Overall, our analysis showed that both the CbPM and PPM models generally performed 271 well in reproducing the NAAMES NPP data estimated with the state-of-the-art <sup>14</sup>C incubation-272 based NPP measurements, with their own advantages and limitations. The CbPM model 273 274 reproduced the magnitude of NPP but had some artifacts when subsurface photoacclimation was significant. The PPM model accounts for effects of subsurface photoacclimation, but the model-275 estimated NPP was much lower than the <sup>14</sup>C NPP estimates. Our result indicates that it is critical 276 to choose an appropriate model for Argo-based NPP calculations under different circumstances 277 and that more efforts need to be invested to improve NPP estimates from bio-optical 278 279 measurements from profiling floats.

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#### **3.2 Spatial and Temporal distribution of NPP in the Western North Atlantic**

282 3.2.1 Spatial and Temporal distribution of Surface NPP

First, we analyzed the spatial and temporal distribution of NPP in the western North Atlantic in the context of an annual climatology of surface NPP derived from Argo float data. The Argo results from the CbPM model (blue line in Figures 5a and 5c) were used here, because our evaluation showed no artifacts of photoacclimation in the surface NPP with the CbPM model and the magnitude of NPP from CbPM model agreed better with the <sup>14</sup>C NPP results.

- For the northern region (Figure 5a), NPP was low (~ 1 mmol  $m^{-3} d^{-1}$ ) for the first three 288 months of the year (January - March), due to the lower light level (red line, Figure 5b) in the 289 wintertime. Phytoplankton concentrations notably increased from April forward, with NPP 290 increasing substantially through the spring and summer, reaching the peak of 17 mmol  $m^{-3} d^{-1}$  in 291 mid-May. By mid-June, NPP started decreasing toward a relatively low value around 1.3 mmol 292  $m^{-3} d^{-1}$  in mid-August, which could have been due to nutrient limitation (grey bar in Figure 5b), 293 and over-grazing. These factors could also have explained the increasing NPP after mid-August 294 and a plateau with NPP of 3 mmol  $m^{-3} d^{-1}$  observed from late September to late November, as the 295 increasing mixed layer depth could have helped relieve stresses from nutrient limitation (by 296 mixing with nutrient-rich deep water) and grazing (by reducing the encounter rate of 297 phytoplankton and grazers). After late November, with worsening light condition, NPP 298 299 decreased fast and reached near-zero values by the end of the year, which aligned well with the observations in January. Overall, this seasonal pattern of NPP was consistent with the 300
- phytoplankton phenology reported in our previous work [*Yang et al.*, 2020] and can be explained
- by the disturbance recovery hypothesis (DRH, [*Behrenfeld and Boss*, 2018]).

For the southern region, the overall seasonal pattern was similar but with several distinct 303 304 characteristics (Figure 5c). First, the timing for each stage of the NPP phenology was different. In the southern region, the significant increase in NPP started in March (Figure 5c), about 1 305 month earlier than that in the northern region (Figure 5a), which could be related to the better 306 light condition. On the other hand, after the summer peak, NPP quickly dropped below 1 mmol 307  $m^{-3}$  by the end of June in the southern region as surface nutrients were quickly depleted (Figure 308 5d), indicating that the difference in nutrient supply of the Northern and Southern Regions is also 309 an important factor that controls phytoplankton phenology. The low NPP values continued until 310 late September (much longer than that in the northern region), consistent with the depleted 311 nutrients shown in Figure 5d and indicating that nutrient limitation may have played a more 312 important role in the southern region. Second, NPP in January and February was higher in the 313 southern region, because the light condition was better at lower latitude in the winter (Figure 5b 314 and 5d). 315

On the other hand, the summer NPP maximum (~ 10 mmol  $m^{-3} d^{-1}$ ) was lower in the 316 southern region than in the northern region. Surface PAR at the southern region NPP climax 317 (close to 2 mol photon  $m^{-2} h^{-1}$ , Figure 5d) was higher than that of the northern region NPP climax 318 (below 1.5 mol photon m<sup>-2</sup> h<sup>-1</sup>, Figure 5b). Based on climatology, surface nutrient levels were 319 low, but not zero, during the climax for the southern region (Figure 5d). A possible explanation 320 for the lower NPP climax levels in the southern region is that the southern region has a weaker 321 322 over all bloom, due to the lower wintertime nutrient supply or summer macro- or micro-nutrient limitation. Although NPP from October to January was slightly lower in the southern region than 323 that in the northern region, it actually represented a larger contribution to annual production, 324 since the summer NPP in the southern region was not as high as that in the northern region. 325

NPP estimates from satellite-based Chl and  $C_{phyto}$  (yellow line in Figures 5a and 5c) were also compared to the Argo float results. For most of a year, the Argo and satellite estimates of NPP were comparable. The largest differences occurred in the late spring and summer months when NPP was high (Figures 5e and 5f), consistent with the fact that the Argo estimates of Chl and  $C_{phyto}$  were also higher than satellite estimated for those months (Figure S8). Such mismatch could be the result of spatial/temporal mismatch of Argo and satellite data and/or the systematic offsets between the Argo and satellite measurements.

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334 3.2.2 Spatial and Temporal distribution of Depth-resolved NPP

For the analysis of depth-resolved NPP, we present monthly climatologies of NPP from the PPM model (Figure 6) because the PPM model did not have photoacclimation-related artifacts (large subsurface NPP peak) in the summer. Although the NPP from the PPM model might have underestimated the magnitude of NPP (as shown in section 3.1.2), this bias should not affect the analysis on seasonal NPP variations. Monthly climatologies of nitrate concentration ([NO<sub>3</sub><sup>-</sup>], Figure 8) and photosynthetically active radiation (PAR, Figure 7) were also created to help with our analysis.

For the northern region (Figure 6, upper panel), the NPP profiles showed an exponentiallike shape with NPP decreasing with depth, similar to the PAR profiles (Figure 7, upper panel). Such patterns indicate that the light condition was likely the major control of NPP distributions at depth in the northern region. The seasonal pattern of depth-resolved NPP in the northern region was similar to the seasonal pattern of surface NPP (Figure 5a), with NPP increasing from spring to summer, NPP climax in June, low NPP in August, a second NPP peak in September and October, and decreasing NPP in November and December.

For the southern region, the seasonal pattern of depth-resolved NPP (Figure 6, lower 349 panel) was also similar to the seasonal pattern of the surface NPP (Figure 5c). For most of the 350 year, the depth distribution of NPP in the southern region also followed an exponential-like 351 pattern similar to the PAR distribution, with the exception in the summer months (July, August, 352 and September). For these three summer months, the NPP profile was almost a straight line from 353 the surface to 15-40 m and was far from the exponential-like pattern of PAR (Figure 7), 354 indicating that the light condition was not the sole control of such NPP depth distribution. On the 355 other hand, nitrate was depleted from the surface to about 20 m and started increasing below 20 356 m (Figure 8), which likely explained the low NPP in the shallow water, and the slightly elevated 357 subsurface NPP observed by Argo float (July to September, lower panel of Figure 6) and the <sup>14</sup>C 358 result from NAAMES 3 (i.e. N3S2 and N3S3, Figures 4f and 4g). Overall, the depth-resolved 359 NPP revealed similar differences between the northern and southern region as suggested by the 360 surface NPP, including the higher winter NPP/lower summer NPP in the south, and timing 361 difference in NPP phenology. The more nutrient-controlled NPP depth distribution in the 362 southern region for summer months was distinct from the more light-controlled NPP depth 363 distribution in the north. 364

Comparison was also made with previous Argo NPP study in the North Atlantic [*Briggs et al.*, 2018]. Although their research area was about 4-8 degrees north to our northern-most location, the magnitude of observed NPP values were comparable. Their study yielded an integrated NPP (surface to 60 m) of ~ 84 mmol C m<sup>-2</sup> d<sup>-1</sup> during the spring bloom in an area from 58° N to 62° N [*Briggs et al.*, 2018], while our corresponding results in the upper 60 m during the bloom period were 95 mmol C m<sup>-2</sup> d<sup>-1</sup> (northern region, 47° N to 54° N) and 73 mmol C m<sup>-2</sup> d<sup>-1</sup> (southern region, 39° N to 47° N), respectively.

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### 373 **3.3 Estimate of mixed layer NCP to NPP ratio**

374 In steady state, the NCP to NPP ratio is equivalent to the f-ratio (the amount of biologically produced carbon available for export) [Eppley and Peterson, 1979], which is a 375 useful metric for quantifying the strength of the biological carbon pump. The most widely used 376 estimates of the f-ratio are derived from an empirical relationship with temperature [Laws et al., 377 2000, 2011]. However, these empirical equations are limited by the spatial and temporal 378 coverages of field-observed f-ratios. In this study, we demonstrate the ability of Argo profiling 379 floats in measuring f-ratios over large temporal and spatial scales by using concurrent 380 measurements of NCP and NPP on two Argo floats (BGC-Argo n0572 and SOS-Argo f9764) 381 from July to late December of 2016. Although the distance between these two floats were not 382 ideal (Figure S10), they roughly covered the same area (Figure 1) during this period of time and 383 could give us a big picture of NCP to NPP ratio in this area. The mixed layer-integrated NCP 384 (unit: mmol  $m^{-2} d^{-1}$ ) from Equation 10 was converted to mixed layer mean NCP (unit: mmol  $m^{-3}$ 385  $d^{-1}$ ). As shown in Figure 9a, the mixed layer depths (determined from salinity and temperature, 386 387 see the T-S plot in the Supporting Information) from these two floats were similar (except for September), indicating they were measuring the same water mass and therefore that it was 388 reasonable to combine the NPP and NCP results from these two floats to estimate NCP/NPP 389 390 ratios. For these months, NPP decreased sharply from July to mid-August and then increased slightly with a small peak in early September. Thereafter, NPP slowly decreased until late 391 December. The NCP trend generally followed the NPP variations, except for July. The highest 392 393 NCP/NPP ratio occurred between late August and early October, with peak values of 0.3. For comparison, a higher NCP/NPP value (0.3 to 0.7) was observed by Alkire et al. [2012] in the 394

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- subarctic North Atlantic during the bloom season (April and May). NCP and the NCP/NPP ratio
- turned negative in mid-October and continued decreasing, with the lowest NCP/NPP values
- around -1.0 in December when both NPP and NCP were small. The negative winter NCP may
- reflect ventilation of low  $O_2$  water and net respiration that occurred earlier in the shallow aphotic
- zone over the prior stratified season. Despite the potential spatial offsets between the two floats
- and temporal offset between NPP and NCP (NPP is instantaneous while NCP reflects the
   situation of several weeks prior in the mixed layer and longer in stratified subsurface waters), the
- 402 Argo results clearly show significant seasonal variations in NCP/NPP ratios that are quite
- 403 different than those derived from a traditional temperature-based empirical equation (purple line
- 404 in Figure 9c, calculated with Equation 3 in *Laws et al.*, [2011]).
- 405

# 406 **4 Summary and Implications**

In this study, we obtained for the first time year-round, in-situ estimates of NPP in the 407 western North Atlantic Ocean (39° N to 55° N, 30° W to 50° W) using the bio-optical 408 measurements on BGC-Argo floats from the NAAMES project. The BGC-Argo-measured NPP 409 was comparable and complementary to discrete-sampling-based <sup>14</sup>C incubation measurements, 410 but it also filled the niche of temporal and spatial (both horizontally and vertically) coverage 411 limitations of the ship-based <sup>14</sup>C and satellite remote sensing approaches. Evaluations against <sup>14</sup>C 412 NPP incubation measurements showed advantages and limitations of both the CbPM and PPM 413 414 bio-optical models. Specifically, the CbPM reproduced the magnitude of NPP in most cases (except those when subsurface photoacclimation was important), while PPM accounted for the 415 effects of subsurface photoacclimation but overall was biased low compared to <sup>14</sup>C data. Overall, 416 our work demonstrats that Argo float data provids an important, complementary approach to <sup>14</sup>C 417 and satellite remote sensing estimates of NPP, with the potential to provide more information on 418 the temporal and spatial distribution of phytoplankton carbon production. Our work also shows 419 the limitations of current NPP models, and emphasizes the need for improving the NPP estimates 420 using bio-optical measurements from Argo profiling floats. 421

422

# 423 Acknowledgments

In addition to the links included in the main text, the Argo data can also be obtained with 424 WMO number at http://www.argodatamgt.org/Access-to-data/Description-of-all-floats2. These 425 data were collected and made freely available by the International Argo Program and the national 426 427 programs that contribute to it (http://www.argo.ucsd.edu, http://argo.jcommops.org). The Argo Program is part of the Global Ocean Observing System. The links for satellite-based NPP, PAR 428 and U<sub>10</sub> data were listed in the main text. Detailed data for each float were included in the 429 supporting information. Support for this work came from the National Aeronautics and Space 430 Administration (NASA) as part of the North Atlantic Aerosol and Marine Ecosystems Study 431 (NAAMES, grants 80NSSC18K0018). 432

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- **Figure 1**. Trajectories of seven Argo profiling floats with the initial float deployment locations
- denoted by filled symbols. The bar chart (right panel) indicates float deployment durations.
- 525 The dotted lines indicate the trajectory of SOS-Argo f9764 for NCP estimates, and all other

floats are BGC-Argo for NPP estimates. SOS-Argo data are available at

- 527 <u>https://sites.google.com/a/uw.edu/sosargo/home</u> and BGC-Argo data are available at
- 528 <u>http://misclab.umeoce.maine.edu/floats/</u>. The dash-line at 47° N divided the research area into
- the northern (temperate) and southern (subtropical) regions. Stars (labeled with the station ID)
- 530 indicate ship stations where <sup>14</sup>C NPP values were measured during NAAMES cruises (*Fox et al.*,
- [2020]) and compared with NPP from nearby Argo floats. The circles and triangle indicate the
- 532 locations where BGC-Argo and SOS-Argo were first deployed.
- **Figure 2**. Comparison of surface Net Primary Production (NPP, mmol  $m^{-3} d^{-1}$ ) derived from <sup>14</sup>C
- approach and Argo estimates using CbPM (panel a) and PPM (panel b). The grey diagonal line is
- 1:1 line and the green dotted line presents Type II linear regression line. Type II linear regression
- result for CbPM:  $y = (0.80 \pm 0.08) x + (0.65 \pm 0.16), R = 0.93, RMSD = 0.41 mmol m<sup>-3</sup> d<sup>-1</sup>. Type$
- 537 II linear regression result for PPM:  $y = (0.44 \pm 0.06) x + (0.57 \pm 0.11), R = 0.88, RMSD = 0.29$
- 538 mmol  $m^{-3} d^{-1}$ .
- **Figure 3**. (a i): Net primary production (NPP, mmol  $m^{-3} d^{-1}$ ) profiles derived from BGC-Argo
- floats (blue line) on NAAMES <sup>14</sup>C stations, using the Carbon-based Productivity Model (CbPM).
- 541 Black "x" indicates NPP results from onboard <sup>14</sup>C incubation experiments during NAAMES1 to
- 542 NAAMES4 cruises (*Fox et al.*, [2020]). The blue shading indicates the standard deviation of
- 543 multiple Argo profiles during the same 24-h incubation experiment. The red dotted line and
- yellow dash line indicate mixed layer depth (MLD, m) and euphotic depth ( $Z_{1\%}$ , m), respectively.
- (j) The correlation between NPP estimates from Argo and <sup>14</sup>C measurements. The grey diagonal
- 546 line in the background is the 1:1 line. The green dotted line is from a type II regression:  $y = (0.99 \pm 0.07) x + (0.60 \pm 0.10), R = 0.90, RMSD = 0.51 mmol m<sup>-3</sup> d<sup>-1</sup>$
- Figure 4. (a i): Net primary production (NPP, mmol  $m^{-3} d^{-1}$ ) profiles derived from BGC-Argo 548 floats (blue line) on NAAMES <sup>14</sup>C stations, using the PPM model from *Fox et al.*, [2020]. Black 549 "x" indicates NPP results from onboard <sup>14</sup>C incubation experiments during NAAMES1 to 550 NAAMES4 cruises (Fox et al., [2020]). The blue shading indicates the standard deviation of 551 multiple Argo profiles during the same 24-h incubation experiment. The red dotted line and 552 yellow dash line indicate mixed layer depth (MLD, m) and euphotic depth ( $Z_{1\%}$ , m), respectively. 553 (j) The correlation between NPP estimates from Argo and <sup>14</sup>C measurements. The grey diagonal 554 line in the background is the 1:1 line. The green dotted line is from a type II regression with all 555 data:  $y = (0.50 \pm 0.05) x + (0.39 \pm 0.07), R = 0.81, RMSE = 0.37 \text{ mmol m}^{-3} \text{ d}^{-1}).$ 556
- 557

- **Figure 5**. Climatologies of surface Net Primary Production (NPP) for the northern region (a) and
- southern region (c) from Argo (blue line) and Satellite (yellow line) using CbPM model. Panels
- (b) and (d) show surface photosynthetically active radiation (PAR<sub>surf</sub>, red line) and the monthly
- climatology of surface nitrate concentration ([NO<sub>3</sub><sup>-</sup>], grey bar) from World Ocean Atlas 2013
- 562 [Garcia et al., 2013]. The shadings in panels (a-d) indicate one standard deviation. Correlation
- analysis of panels (a) and (c) are presented in panels (e) to (f) with the grey diagonal line as 1:1
- 564 line and the black dash line as type II regression line. Type II linear regression result for  $1.22 \pm 0.22$
- 565 Northern Region:  $y = (1.92 \pm 0.08) x + (-1.53 \pm 0.28), R = 0.88, RMSD = 2.02 \text{ mmol m}^{-3} \text{ d}^{-1}.$
- 566 Type II linear regression result for Southern Region:  $y = (2.44 \pm 0.10) x + (-1.95 \pm 0.21), R =$
- 567 0.79, RMSD =  $1.74 \text{ mmol m}^{-3} \text{ d}^{-1}$ .
- **Figure 6.** Monthly climatologies of net primary production (NPP, mmol m<sup>-3</sup> d<sup>-1</sup>) profiles derived
- from BGC-Argo measurements using the PPM model from *Fox et al.*, [2020]. The shadings
- 570 indicate one standard deviation. The red dotted line and yellow dash line indicate mixed layer
- 571 depth (MLD, m) and euphotic depth ( $Z_{1\%}$ , m), respectively.
- **Figure 7.** Monthly climatologies of photosynthetically active radiation (PAR, mol photon  $m^{-2} h^{-1}$ )
- 573 profiles derived from Satellite data
- 574 (http://sites.science.oregonstate.edu/ocean.productivity/1080.by.2160.8day.inputData.php). The
- shadings indicate one standard deviation. The red dotted line and yellow dash line indicate mixed
- 576 layer depth (MLD, m) and euphotic depth ( $Z_{1\%}$ , m), respectively.
- **Figure 8.** Monthly climatologies of nitrate ( $[NO_3^-]$ ,  $\mu$ mol L<sup>-1</sup>) profiles derived from World
- 578 Ocean Atlas 2013. The shadings indicate one standard deviation. The red dotted line and yellow
- dash line indicate mixed layer depth (MLD, m) and euphotic depth ( $Z_{1\%}$ , m), respectively.
- **Figure 9**. (a) Mixed layer depth from floats n0572 and f9764. (b) Mixed layer mean net primary
- 581 production (NPP) and net community production (NCP). (c) Mixed layer mean NCP to NPP
- ratio (NCP/NPP). The purple dashed line indicates the NCP/NPP derived using temperature-
- based empirical algorithm (Equation 3 in *Laws et al.*, [2011]). NPP was derived from BGC-Argo
   n0572 using the Carbon-based Productivity Model (CbPM, *Westberry et al.*, [2008]). NCP was
- calculated from oxygen mass balance using data from SOS-Argo float f9764. Both NCP and
- 586 NPP were converted to the mix layer mean (unit: mmol C  $m^{-3} d^{-1}$ ).

Figure 1.



Figure 2.



Figure 3.



Figure 4.



Figure 5.



Figure 6.



Figure 7.



Figure 8.



Figure 9.

