



# Article Effects of Ocean Currents in the Western Pacific Ocean on Net-Phytoplankton Community Compositions

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Abstract: Phytoplankton are known as important harbingers of climate change in aquatic ecosystems. This study investigated phytoplankton community structure in the western Pacific Ocean (WPO) in 2017 and revealed the spatial variability of phytoplankton in community composition and abundance, as well as their relationship to physical processes and environmental factors. The phytoplankton community was mainly composed of Dinophyta (221), followed by Bacillariophyta (105), Cyanophyta (4), and Chrysophyta (2). The cyanobacteria *Trichodesmium* were the dominants throughout the study period. Correlation analysis showed that dinoflagellates were mainly affected by temperature, while diatoms were significantly correlated with nutrients (silicate, phosphate, nitrite, nitrate). Phytoplankton was divided into five groups by cluster analysis, and the distribution of different groups was related to circulation and hydrological characteristics. In contrast, the highest abundance of diatoms and dinoflagellates was found in the New Guinea Coastal Current (NGCC) region, while the highest abundance of cyanobacteria was found in the Northern Equatorial Counter Current (NECC) region. Overall, we found that not only temperature and salinity, but also ocean currents and nutrients, influence the distribution of phytoplankton communities in the WPO.

**Keywords:** phytoplankton; community structure; western Pacific Ocean; ocean currents; environmental factors; nutrients

## 1. Introduction

As the most important producers in marine ecosystems, phytoplankton not only absorb carbon dioxide and regulate global climate change, but also provide energy through photosynthesis [1]. Phytoplankton communities play an important role in biogeochemical cycles and pelagic food webs, and they also support the energy needs of marine ecosystems [2]. They are widely distributed in the upper layer, and the distribution of phytoplankton species and their community structure are usually associated with the dominant marine environment (unique nutrient structure) [3]. The distribution of phytoplankton in seawater is usually strongly influenced by ocean circulation and mesoscale hydrographic features [4]. Some specific currents and water masses are inhabited by specific native species, a property that can be used to indicate water movement [5]. For this reason, the distribution of many phytoplankton species is closely related to unique environmental factors in many marine ecosystems.

The Pacific Ocean covers about a third of the earth and nearly half of the sea surface around the world. The boundaries of the tropical western Pacific Ocean (WPO) are very



Citation: Chen, Z.; Sun, J.; Chen, D.; Wang, S.; Yu, H.; Chen, H.; Wang, M. Effects of Ocean Currents in the Western Pacific Ocean on Net-Phytoplankton Community Compositions. *Diversity* **2021**, *13*, 428. https://doi.org/10.3390/d13090428

Academic Editor: Bert W. Hoeksema

Received: 20 August 2021 Accepted: 3 September 2021 Published: 5 September 2021

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**Copyright:** © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). irregular, with numerous islands and complex ocean currents. Specifically, there are three dominant current systems in the region: the North Equatorial Current (NEC,  $10^{\circ}-25^{\circ}$  N), the Northern Equatorial Counter Current (NECC) ( $4^{\circ}-10^{\circ}$  N), and the South Equatorial Current (SEC,  $4^{\circ}$  N– $20^{\circ}$  S) [6]. In addition, there are the New Guinea Coastal Current (NGCC) and the New Guinea Coastal Undercurrent (NGCU) on the coast of New Guinea. Owing to the high solar radiation throughout the year and the influence of the equatorial currents flowing, warm water accumulates in the western equatorial Pacific Ocean, forming the largest warm water region called the western Pacific warm pool (WPWP), with a thermocline thickness of 100–150 m, which was 3–6 °C higher than the eastern equatorial Pacific Ocean [7,8].

The study of phytoplankton in the Kuroshio region of the WPO dates to the 1970s, and a lot of work has been done by domestic and foreign scholars. The distribution and composition of plankton in the Kuroshio area were reported in detail by Kawarada et al. [9]. Shiro Fujioka [10] analyzed the Kuroshio water masses near the Sea of Japan and used phytoplankton as indicator species. In 1997, Sun [11] and Liu [12] further investigated the composition and abundance distribution of planktonic diatoms and dinoflagellates in the Ryukyu Islands and nearby waters. Chen [13] and Chen [14] proposed that the abundance of *Trichodesmium* was higher in the Kuroshio area due to the deeper nitrate thermocline and the lower nitrate concentration in the surface layer. The density of *Trichodesmium* in the Kuroshio region was very high. The available data need to be improved and updated. Although some quantitative assessments of the phytoplankton community structure of WPO have been obtained in previous studies, information on the influence of circulation on the phytoplankton composition in the region is lacking. Therefore, analyzing the distribution of the WPO phytoplankton community and the effects of species composition and circulation will provide indispensable information for future studies. In this study, the community structure of phytoplankton in the whole water column was explored by characterizing the community structure of net-phytoplankton in the investigated sea area. The relationships between phytoplankton and environmental factors and their responses to the effects of circulation were analyzed. Thus, certain information can be accumulated for the ecological study of phytoplankton in the region.

#### 2. Material and Method

The cruise was carried out from  $142-163^{\circ}$  E and  $1-40^{\circ}$  N in the WPO onboard R/V "*Dongfanghong* 2", covering 63 stations from October 6th to December 7th in 2017. As shown in Figure 1, the survey area was divided into two sections: Section A (stations assigned to the longitude of  $143-146^{\circ}$  E) and Section B (stations assigned along the equator). These stations were sampled between 0 and 200 m depth by vertical tows with the plankton net (mouth opening 0.25 m<sup>2</sup>, mesh size 20 µm). Samples were fixed in 5% buffered formalin and stored in the dark. In the laboratory, phytoplankton samples are observed under a microscope (AE2000, Motic, Xiamen, China) [15]. Phytoplankton identification was conducted as described by Jin [16], Isamu Y [17], and Sun [18]. Species identification was as close as possible to the species level.

Seawater samples were collected by a SeaBird CTD (SBE 9/11 plus) equipped with Go-Flo bottles, and temperature and salinity were recorded at the same time. The temperature and salinity of the water column were calculated by means of a trapezoidal integration of the different levels of seawater temperature and salinity. Nutrient samples from different layers were placed in PE bottles and stored at -20 °C for laboratory nutrient analysis [19]. Nitrate, nitrite, ammonium, phosphate, and silicate were also analyzed on board by spectrometric methods [20]. Chlorophyll *a* (chl *a*) samples were filtered through Whatman GF/F filters (0.7 µm) for seawater samples (1 L) and subsequently saved under -20 °C. Chl *a* was extracted in laboratory without light by 90% acetone, and then Turner fluorimeter (model 10-AU) was used to measure the chl *a* concentration [21]. The sampling layers were 5 m, 30 m, 75 m, 100 m, 150 m, and 200 m.



**Figure 1.** Study area and locations of the sampling stations in the WPO. Map of the WPO shows the major geographic names and the surface currents, including the Kuroshio Current (KC), the Subtropical Counter Current (STCC), the North Equatorial Current (NEC), the Northern Equatorial Counter Current (NECC), and the New Guinea Coastal Current (NGCC) [22,23].

Dominance index (Y) was calculated to describe the species dominance in the phytoplankton community. The calculation equation was as follows:

$$Y = \frac{n_i}{N} f_i \tag{1}$$

where  $n_i$  is the number of the individual species, N is the total number of all species, and  $f_i$  is the occurrence frequency of the species in a sample.

The abundance of phytoplankton cells in water column was calculated through the trapezoidal integral method [24]:

$$P = \left\{ \sum_{i=1}^{n-1} \frac{P_{i+1} + P_i}{2} (D_{i+1} - D_i) \right\} / (D_n - D_1)$$
(2)

where P is the average value of phytoplankton abundance in water column, P*i* is the abundance value of phytoplankton in layer *i*, *i* + 1 is the layer *i* + 1,  $D_n$  is the maximum sampling depth,  $D_i$  is the depth of layer *i*, and *n* is the sampling level.

Horizontal and depth-integrated distribution of phytoplankton and physiochemical parameters were projected using Ocean Data View 4.7.6 and ArcGIS 10.8. The histogram was plotted with Origin (Version 8.5). Pearson correlation and canonical correspondence analysis (CCA) between assemblages and physicochemical parameters were performed

using the R package vegan (version 2.5–7) [25] to explain the relationship between the environmental parameters (temperature, salinity, and nutrients) and phytoplankton community structure.

#### 3. Result

### 3.1. Phytoplankton Species Composition

Phytoplankton samples from the WPO were analyzed, and 332 species belonging to 68 genera in 4 phyla were identified, including Bacillariophyta, Dinophyta, Cyanophyta, and Chrysophyta. There were 105 diatoms belonging to 37 genera (31.63% of total species), 221 species in 28 genera of dinoflagellates (66.57%), 4 cyanobacteria species, and 2 chrysophyceae species (Table 1). The distribution of phytoplankton (Figure 2a) is mainly determined by Cyanobacteria. The distribution of dinoflagellate (Figure 2b) shows that most of the sites of dinoflagellate are evenly distributed, and diatom is more dominant in some stations near the shore. Trichodesmium thiebautii is the main species of Trichodesmium and is abundantly distributed in the surveyed sea area (Figure 2c). The abundance of Trichodesmium reaches the maximum value ( $12.905 \times 10^3$  cells m<sup>-3</sup>) at the A35 station of the investigated sea area. The distribution of dominant species (Figure 2d) shows that there is a rich diversity of phytoplankton in the investigated sea area. The dominant species of dinoflagellate in this survey is Ceratium kofoidii, and the maximum value appears at A28 station (5.619  $\times$  10<sup>3</sup> cells m<sup>-3</sup>). *Planktoniella foromsa* is the dominant species of diatom in this survey, and the maximum value appears at B19 station (13.276  $\times$  10<sup>3</sup> cells m<sup>-3</sup>). Thalassiothrix longissima is a common species of Kuroshio, which is dominant at A01 and A02 stations, and reaches the peak at B18 station with higher diatom abundance (Table 2). Cluster analysis was used to analyze the similarity of phytoplankton taxa. The results of the cluster analysis were used to analyze the similarity between phytoplankton taxa based on their abundance during the 2017 cruise. The cluster analysis revealed five distinct phytoplankton communities (Figure 3). Phytoplankton groups containing fewer than four stations were not considered as significant clusters. Clusters were assigned different color symbols and plotted in the sampling area (Figure 3).

Phylum	Genera	Species	Ratio of Richness (%)
Bacillariophyta	37	105	31.63
Dinophyta	28	221	66.57
Cyanophyta	2	4	1.20
Chrysophyta	1	2	0.60

Species	Percentage (%)	Frequency (fi)	Dominance (Y)	Maximum (10 <sup>3</sup> Cells m <sup>-3</sup> )	Average (10 <sup>3</sup> Cells m <sup>-3</sup> )	Maximum Stations
T. thiebautii	65.67	0.952	0.6254	8895.529	374.425	A35
Trichodesmium erythraeum	19.46	0.889	0.1730	2128.430	110.979	A36
Trichodesmium hildebrandtii	12.07	0.746	0.0900	2782.329	68.807	A35
C. kofoidii	0.18	0.952	0.0017	5.619	1.037	A28
Prorocentrum leniculatum	0.15	1.000	0.0015	3.300	0.845	A36
Richelia intracellularis	0.14	0.698	0.0010	7.947	0.805	A24
P. foromsa	0.12	0.794	0.0010	13.276	0.688	B19
Coscinodiscus marginato-lineatus	0.10	0.968	0.0009	2.844	0.542	B18
Thalassiosira subtilis	0.09	0.968	0.0009	3.433	0.512	B07
Prorocentrum compressum	0.08	1.000	0.0007	1.836	0.425	B07
T. longissima	0.08	0.937	0.0007	6.542	0.445	B18
Thalassiosira minima	0.07	1.000	0.0007	2.540	0.415	B19

 Table 2. Dominant phytoplankton species in the WPO.

Table 1. The numbers of phytoplankton species and genera in the WPO.



**Figure 2.** Horizontal distribution of phytoplankton abundance in the WPO. (**a**) Phytoplankton cell abundance of four-phyla (cells  $m^{-3}$ ); (**b**) phytoplankton cell abundance of diatoms and dinoflagellates (cells  $m^{-3}$ ); (**c**) phytoplankton cell abundance of *Trichodesmium* (trichomes  $m^{-3}$ ); (**d**) dominant species abundance (cells  $m^{-3}$ ).



Figure 3. Location of the different phytoplankton groups in the WPO.

## 3.2. Environmental Characteristics of the Survey Area

Phytoplankton clustering analysis divided the 63 stations surveyed into five groups (Figure 3). The different groups had different hydrological characteristics. These hydrological characteristics included temperature (T), salinity (S), chl *a*, silicate ( $SiO_3^{2-}$ ), phosphate ( $PO_4^{3-}$ ), nitrate ( $NO_3^{-}$ ), nitrite ( $NO_2^{-}$ ), and ammonium ( $NH_4^+$ ). We found that the five groups had different characteristics. Group A had the highest mean temperature, the highest mean salinity, the highest mean nutrient concentration, and a deeper mixed layer with a thickness of about 125 m; Group B had the shallowest mixed layer with a thickness of about 30 m; Group C had the highest mean salinity; and Group E had moderate mean temperature, salinity, and nutrient levels (Table 3, Figure 4).

**Table 3.** Average ( $\pm$  standard deviations) values for nutrients ( $\mu$ mol L<sup>-1</sup>), temperature (°C), salinity, and chlorophyll a ( $\mu$ g L<sup>-1</sup>) for each phytoplankton community group identified by the cluster analysis in the WPO.

	Group A	Group B	Group C	Group D	Group E
PO4 <sup>3-</sup>	$0.37\pm0.07$	$0.13\pm0.08$	$0.27\pm0.10$	$0.16\pm0.06$	$0.13\pm0.05$
$NO_2^-$	$0.23\pm0.12$	$0.05\pm0.01$	$0.12\pm0.04$	$0.06\pm0.01$	$0.09\pm0.02$
$NO_3^-$	$2.66\pm0.87$	$0.70\pm0.52$	$2.15\pm1.07$	$2.06\pm0.79$	$0.66\pm0.47$
$NH_4^+$	$0.87\pm0.21$	$1.32\pm0.43$	$1.51\pm0.56$	$0.86\pm0.09$	$1.49\pm0.62$
$SiO_3^{2-}$	$1.83\pm0.29$	$2.00\pm0.17$	$2.23\pm1.07$	$2.62\pm0.60$	$1.57\pm0.45$
temperature	$28.24 \pm 0.45$	$23.50\pm0.46$	$27.29 \pm 1.49$	$22.72 \pm 1.08$	$26.89 \pm 1.48$
salinity	$35.06\pm0.18$	$34.98\pm0.11$	$34.54\pm0.24$	$34.80\pm0.08$	$34.62\pm0.31$
chl a	$0.41\pm0.11$	$0.27\pm0.46$	$0.34\pm0.08$	$0.31\pm0.08$	$0.27\pm0.08$



**Figure 4.** The temperature profiles of the upper 200 m at the survey stations to distinguish the five groups (Group A–E).

#### 3.3. Phytoplankton Community Structure of Five Groups

Cluster analysis showed that phytoplankton communities have a spatial distribution structure in the currents of the WPO. In the five groups, the phytoplankton had different proportions of cell abundance. The cell abundance of the four-phyla phytoplankton also differed in the five groups (Figure 5). The dominant species of phytoplankton had different mean cell abundance in the five groups (Table 4). Overall, the highest abundance of diatoms and dinoflagellates was in Group A, and the highest abundance of cyanobacteria in Group C.

**Table 4.** List of phytoplankton community group characteristics (average  $\pm$  standard deviations) identified by cluster analysis in the WPO.

	Group A	Group B	Group C	Group D	Group E
Phytoplankton	$211,\!796 \pm 129,\!387$	91,379 ± 60,250	1,454,796 ± 3,127,957	$175,003 \pm 211,356$	$77,\!120 \pm 101,\!440$
Diatoms	$12,\!176 \pm 12,\!454$	$4188 \pm 2124$	$6664 \pm 3171$	$8109 \pm 2944$	$4022\pm1794$
Dinoflagellates	$9820\pm7323$	$6136 \pm 2530$	$7306\pm2106$	$5748 \pm 3264$	$5834 \pm 3357$
Cyanobacteria	$189{,}548 \pm 114{,}153$	$80,735 \pm 55,865$	$1,\!440,\!161 \pm 3,\!126,\!653$	$160,\!503 \pm 210,\!271$	$67,\!168 \pm 100,\!680$
Chrysophyceae	$252\pm268$	$321\pm496$	$665\pm560$	$643\pm361$	$96\pm157$
T. thiebautii	$96,835 \pm 102,200$	$44{,}784 \pm 34{,}253$	$1,093,840 \pm 2,302,347$	$23,\!845 \pm 21,\!450$	$37,\!684 \pm 64,\!710$
T. erythraeum	$37,\!156 \pm 53,\!088$	$33,\!982 \pm 41,\!793$	$162,\!062\pm292,\!659$	$119,\!011 \pm 173,\!439$	$23,\!111 \pm 35,\!473$
T. hildebrandtii	$55,\!556 \pm 49,\!123$	$1486\pm2972$	$183{,}590 \pm 649{,}917$	$15,\!922 \pm 33,\!384$	$4509 \pm 14{,}216$
C. kofoidii	$965\pm908$	$1312\pm830$	$1251\pm921$	$918 \pm 1059$	$1261\pm1652$
P. leniculatum	$782\pm629$	$177\pm190$	$867\pm 612$	$495\pm371$	$1443\pm993$
R. intracellularis	$0\pm 0$	$483\pm278$	$669\pm690$	$1725\pm2011$	$1865\pm2174$
P. foromsa	$2389 \pm 3473$	$55\pm52$	$334\pm261$	$83\pm58$	$9\pm16$
C. marginato-lineatus	$632\pm812$	$545\pm318$	$719\pm583$	$259\pm255$	$519 \pm 434$
T. subtilis	$705\pm978$	$473\pm223$	$598 \pm 498$	$536\pm685$	$199\pm163$
P. compressum	$524\pm448$	$373\pm388$	$482\pm403$	$266\pm183$	$428\pm353$
T. longissima	$988 \pm 1594$	$64\pm 63$	$388 \pm 377$	$230\pm110$	$65\pm99$
T. minima	$583\pm679$	$413\pm309$	$403\pm426$	$513\pm306$	$300\pm209$



**Figure 5.** Species composition and changes between groups of phytoplankton in the WPO. (**a**) The cell abundance ratio of the four-phyla phytoplankton in each group; (**b**) The cell abundance (cells  $m^{-3}$ ) of the four-phyla phytoplankton in each group.

Group A was distributed along the equator and mainly affected by the NGCC. The total phytoplankton abundance in Group A was not the highest  $(2.12 \times 10^5 \text{ cells m}^{-3})$  among the five phytoplankton groups, but the abundance of diatoms and dinoflagellates in Group A was the highest  $(1.22 \times 10^4 \text{ cells m}^{-3} \text{ and } 0.98 \times 10^4 \text{ cells m}^{-3})$ . Cyanobacteria, diatoms, dinoflagellates, and chrysophyceaes accounted for 89.49%, 5.75%, 4.64%, and 0.12% of the total phytoplankton, respectively. The abundance of *P. foromsa*  $(2.39 \times 10^3 \text{ cells m}^{-3})$ and *T. longissima*  $(9.88 \times 10^2 \text{ cells m}^{-3})$  was higher than other groups. Additionally, *R. intracellularis* was not found in Group A.

Group B contained sites affected by the STCC. *P. leniculatum* of Group B had the lowest abundance  $(1.77 \times 10^2 \text{ cells m}^{-3})$ . Cyanobacteria accounted for 88.35%, diatoms 4.58%, dinoflagellates 6.72%, and chrysophyceaes 0.35% of the total phytoplankton. *C. kofoidii* had the highest abundance  $(1.31 \times 10^3 \text{ cells m}^{-3})$  in Group B among the five groups.

Group C was mainly affected by the NECC. Group C had the highest abundance of total phytoplankton ( $1.45 \times 10^6$  cells m<sup>-3</sup>). Group C of phytoplankton was mainly composed of cyanobacteria; cyanobacteria accounted for 98.99% of the total phytoplankton, diatoms accounted for 0.46% of the total phytoplankton, dinoflagellates accounted for 0.50% of the total phytoplankton, and chrysophyceaes accounted for 0.05% of the total phytoplankton. *C. marginato-lineatus* had the highest abundance ( $7.19 \times 10^2$  cells m<sup>-3</sup>) among the five groups in Group C.

Group D mainly contained stations affected by the STCC and KC. Cyanobacteria, diatoms, dinoflagellates and chrysophyceaes accounted for 91.71%, 4.63%, 3.29% and 0.37% of the total phytoplankton respectively. *Fragilariopsis doliolus* had the highest abundance  $(6.78 \times 10^2 \text{ cells m}^{-3})$  in Group D among the five groups.

Group E, located in the middle of the sampling area, was mainly affected by the NEC. Group E was the group with the lowest total phytoplankton abundance  $(7.71 \times 10^4 \text{ cells m}^{-3})$ , and the abundance  $(4.51 \times 10^3 \text{ cells m}^{-3}, 0.01 \times 10^3 \text{ cells m}^{-3}, 0.07 \times 10^3 \text{ cells m}^{-3})$  of *T. hildebrandtii*, *P. foromsa*, and *T. longissima* in this group was also very low. Cyanobacteria, diatoms, dinoflagellates and chrysophyceaes accounted for 87.10%, 5.21%, 7.56%, and 0.13% of the total phytoplankton, respectively.

## 3.4. Phytoplankton Distribution in Relation to Environmental Factors

The influence of environmental factors on the phytoplankton community structure in the WPO was assessed using Pearson's correlation (Figure 6) and CCA analysis (Figure 7). The phytoplankton community in the region was significantly influenced by environmental factors. Phytoplankton cell abundance was extremely significantly correlated with cyanobacteria (p < 0.001), indicating that cyanobacteria are the main component of phytoplankton in this survey area. Diatom was extremely significantly correlated with phosphate and nitrate (p < 0.01) and was also significantly correlated with silicate and nitrite (p < 0.05). This shows that the abundance of diatom is more affected by nutrients. There was a significant correlation between dinoflagellate and temperature (p < 0.05), and temperature plays an important role in the growth of dinoflagellate. Different dominant species had different responses to the aquatic environment. The abundance of *T. erythraeum*, *P. compressum*, *C. marginato-linetus*, and *P. Leniculatum* were positively correlated with nitrates and silicates concentration. The abundance of *P. foromsa*, *T. hildebrandtii* were positively correlated with phosphate and nitrite concentration.



**Figure 6.** Pearson's correlation between phytoplankton and environmental factors. Samples number: n = 63, \* For p < 0.05, \*\* for p < 0.01, \*\*\* for p < 0.001. Temp.: temperature; Sali.: salinity; Diat.: Diatom; Dino.: Dinoflagellate; Cyan.: Cyanobacteria; Chry.: Chrysophyceae; NO<sub>3</sub><sup>-</sup>: nitrate; NO<sub>2</sub><sup>-</sup>: nitrite, NH<sub>4</sub><sup>+</sup>: ammonium, PO<sub>4</sub><sup>3-</sup>: phosphate, and SiO<sub>3</sub><sup>2-</sup>: silicate.



**Figure 7.** Canonical Correlation Analysis of the dominant phytoplankton species and environmental factors in the surface layer in the WPO during autumn, 2017. dia: diatoms; dino: dinoflagellates; cya: cyanobacteria; chr: chrysophyceae; Tt: *Trichodesmium thiebautii*; Te: *Trichodesmium erythraeum*; Th: *Trichodesmium hildebrandtii*; Ck: *Ceratium kofoidii*; Pl: *Prorocentrum leniculatum*; Ri: *Richelia intracellularis*; Pf: *Planktoniella foromsa*; Cm: *Coscinodiscus marginato-lineatus*; Ts: *Thalassiosira subtilis*; Pc: *Prorocentrum compressum*; Tl: *Thalassiothrix longissima*; Tm: *Thalassiosira minima*.

#### 4. Discussion

## 4.1. Hydrological Conditions and Corresponding Phytoplankton Community Structure

The study spanned five different hydrological characteristics distributed across the  $40^{\circ}$ N to equatorial cross-section, Kuroshio region, subtropical gyre, transitional zone, warm pool, and equator region [26–29]. The difference in salinity between the surface water in the transition zone and the Subsurface Chlorophyll Maximum (SCM) confirms the existence of positive precipitation budget phenomenon in this area [30]. However, at higher resolution, neither phytoplankton species richness nor species distribution can be strictly distinguished by hydrological characteristics (Figures 4 and 5). On the contrary, according to the results obtained in this study, phytoplankton species composition and abundance tend to change gradually along the cross-section, resulting in some transition zones between different hydrological characteristics. For example, from the Kuroshio area to the transition area, nutrient conditions gradually changed to oligotrophic conditions, and correspondingly, the phytoplankton abundance gradually decreased [31]. The composition and abundance of phytoplankton community also changed spatially. Although some mesoscale vortexes and secondary mesoscale gyres may cause instability in local water bodies, this spatial distribution of diatoms occurs when nutrient gradients are kept changing along latitudes for a certain period. However, phytoplankton gradual adaptation to oligotrophic conditions depends on the species composition of diatoms and dinoflagellates [32–34].

In addition to changes in phytoplankton abundance between different hydrological characteristics, variations in diatoms and dinoflagellates abundance within the same hydrological characteristics were also found (Figures 4 and 5), suggesting that mesoscale circulation could play an important role in phytoplankton distribution [35]. Due to their

poor activity and high potential growth rate, diatoms can reproduce rapidly in circulation and in water with high nutrient content. However, the disadvantage of poor mobility comes with its advantage. The circulation can not only bring new nutrient supplements, but also enable diatoms to distribute evenly in the sea area with strong circulation [36]. This also explains the high diatom abundance in Group A under the influence of NGCC. In fact, dinoflagellates are more susceptible to circulations and vortices, and the more violent the circulations and vortices are, the more their growth is inhibited [37]. The effects of circulations and vortices on dinoflagellates include inhibition of cell division, destruction of cell morphology, and inhibition of nutrient transport [38]. The characteristics of high temperature, high salinity, and high flow rate in the Kuroshio area exactly inhibited the abundance of dinoflagellates in this area, which was consistent with the previous research results [39].

#### 4.2. Distribution of Trichodesmium

In the present study, *Trichodesmium* was the dominant cyanobacteria species. Marine *Trichodesmium* has been considered the most critical autotrophic nitrogen-fixing cyanobacteria since the 1960s [40]. *Trichodesmium* can be divided into two forms: clusters and free filaments. *Trichodesmium* is suitable for living in waters above 20 °C and has a special cellular air sac structure that allows it to move vertically within the upper 100 m of the ocean water column [41]. In the process of water bloom formation by *Trichodesmium*, a large amount of nitrogen is often fixed in a relatively short period of time. Therefore, the study of the nitrogen fixation rate of *Trichodesmium* is an important nitrogen-fixing organism in the ocean and a major contributor to the new productivity of the oligotrophic sea area [43]. The abundance of *Trichodesmium* in the tropical oligotrophic sea area is an issue of great concern [44].

In this study, cyanobacteria bloom was observed near New Guinea. The discovery of high abundance of *Trichodesmium* near the coast is consistent with the results of Campbell [45]. However, until now, it has not been clear how environmental factors control the latitude distribution of *Trichodesmium*. According to our results, temperature has an impact on the spatial distribution of *Trichodesmium*, which is similar to previous observations of tropical and subtropical oceans [46,47]. The optimum temperature for the growth and nitrogen fixation of *Trichodesmium* was between 20 °C and 30 °C. Our results show that there was a positive correlation between temperature and *Trichodesmium* abundance (Figure 6).

At present, there have been reports on the abundances of other oligotrophic salts in the oceanic region: Bonnet found that Trichodesmium has the highest abundance of trichomes  $L^{-1}$  (1.85) in the equatorial WPO [48]; Zhang [49] found that the average abundances of Trichodesmium in the central, eastern, and southern Indian Ocean were 1.76, 0.87 and 1.52, respectively. Therefore, this study investigates the high abundance of *Trichodesmium*, which is consistent with previous studies. Previous studies have not clarified which factors are the main causes of *Trichodesmium* growth (possibly temperature, wind, iron, phosphorus, etc.) [50,51]. Many researchers believe that temperature is the most important factor affecting the growth of *Trichodesmium* [52]. However, we believe that there is no single positive correlation between temperature and *Trichodesmium* growth, which is consistent with the study by Chang [50]. In the tropical WPO, where the temperature was not restricted, Group A had the highest temperature, but the abundance of *Trichodesmium* in Group A was not the highest. The highest value of *Trichodesmium* was in Group C, which had the second-highest temperature (Table 3, Figure 5). The cluster analysis divided the five groups according to the abundance of phytoplankton, which was consistent with the currents (Figure 3). We believe that marine physical processes such as circulation and hydrological characteristics have a profound impact on the spatial distribution of phytoplankton in the WPO.

#### 4.3. Dominant Species and Their Preferred Environmental Factors

The conditions suitable for phytoplankton are often different from one community to another and even from one species to another. Comparing the dominant phytoplankton species of five groups, we conclude that *P. leniculatum* was the dominant species in the study area. *P. leniculatum* belongs to Dinophyta, and it is widely distributed in the world, including the Pacific Ocean, the Indian Ocean, the waters near Madagascar, and the Andaman Sea [53]. In the study area, the abundance of *P. leniculatum* in Group B was the lowest, which was affected by STCC, and it had the lowest average nutrient concentration. CCA analysis showed that *P. leniculatum* in Group B had a positive correlation with nitrate and silicate. Different from others, C. kofoidii was distributed evenly and had a high abundance in the whole study area. C. kofoidii reached the highest abundance in Group B, which was critically affected by Pacific Subtropical gyre. Atmospheric nitrogen fixation in the ocean is an important source of new nitrogen in the surface waters, which stimulates phytoplankton productivity and provides fuel for biological pumps. *Trichodesmium* is the main group responsible for marine nitrogen fixation in tropical waters [42]. The *R. intracellularis* has been shown to provide significant nitrogen input to the ocean on a regional scale [54]. The results of this study show that *R. intracellularis* was not observed in the equatorial region, while there was a high abundance in the region of transitional zone and the Kuroshio region. CCA analysis showed that *R. intracellularis* prefers to bloom in areas with higher nitrate and silicate.

## 5. Conclusions

This study investigated phytoplankton community structure in the WPO in 2017 and revealed the spatial variability of phytoplankton in community composition and abundance, as well as their relationship with physical ocean processes and environmental factors. A total of 332 species of phytoplankton were identified in this survey. The highest abundance of phytoplankton was found in the NECC and equatorial regions. Trichodesmium was widely distributed in the study area and reached the peak in WPWP, dinoflagellates were mainly affected by temperature, and diatoms were significantly correlated with nutrients (phosphate, nitrate, silicate, and nitrite). Phytoplankton were divided into five groups by cluster analysis, and the distribution of different groups was related to circulation and hydrological characteristics. These results show that physical ocean processes such as circulation and hydrological characteristics have a profound influence on the spatial distribution of phytoplankton. Different currents divide phytoplankton into different groups in space. In this investigation, we found that not only temperature and nutrient salinity, but also currents and water mass movements, affect the distribution of phytoplankton communities in the WPO. Despite the baseline data and information provided by this study, the phytoplankton of the WPO remain a mystery to us, especially the distribution of phytoplankton throughout the water column and eddies. Therefore, more long-term community studies are needed to further explore the role of phytoplankton in the marine biogeochemistry of the WPO.

**Author Contributions:** Conceptualization, J.S.; Data curation, Z.C.; Formal analysis, Z.C.; Funding acquisition, J.S.; Investigation, Z.C. and D.C.; Resources, D.C., S.W., H.Y., H.C., M.W. and J.S.; Supervision, J.S.; Writing—original draft, Z.C.; Writing—review and editing, J.S. All authors have read and agreed to the published version of the manuscript.

**Funding:** This research was supported by the National Key Research and Development Project of China (2019YFC1407805), the National Natural Science Foundation of China (41876134, 41676112, and 41276124), the Tianjin 131 Innovation Team Program (20180314), and the Changjiang Scholar Program of Chinese Ministry of Education (T2014253) through grants to Jun Sun.

Institutional Review Board Statement: Not applicable.

Data Availability Statement: All data are available from the authors upon request.

**Acknowledgments:** We thank all the members of Dongfanghong 2 for supporting and securing our scientific investigation on this cruise. Thanks to the CTD data provided by Jiwei Tian 's team at Ocean University of China.

Conflicts of Interest: The authors declare no conflict of interest.

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