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2 3 Supplementary Information for

Oceanographic boundaries constrain microbial diversity gradients in the South Pacific Ocean

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detail, see Aiken*, et al.* (14) and Uitz, Claustre, Morel and Hooker (12). Also the size of

- diatoms can range between the micro and nanoplankton size fraction. We note that some
- diagnostic pigments are shared by several phytoplankton groups and some groups may
- cover a broad size (see also Kheireddine*, et al.* (15)). Nevertheless, this approach has
- shown to give valuable insights in the dominant trends of the phytoplankton community
- and size structure at the regional and seasonal scales (16).
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- Table S1: Formulas used for calculation of phytoplankton functional guild and size class fractions based on diagnostic pigments after Hirata et al. 2011.

 The HPLC data set are available at <https://doi.pangaea.de/10.1594/PANGAEA.884052> (17).

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4.1 Nanoplankton

We found that nanoplanktonic guilds (prymnesiophytes in particular) were present in all

oceanic provinces. The proportion of nanoplankton within the community varied between

15-20 % at 60 °S and in the equatorial region, but up to 65 % at 55 °S (near the STF).

The sharp increase in prymnesiophytes coincided with the abrupt disappearance of

diatoms, while the minima corresponded to maximal microplankton and picoplankton

- abundances, in the Southern Ocean and equatorial regions respectively. Both the
- prymnesiophytes and the pico-eukaryotes contributed up to 83% to the phytoplankton
- guild fraction within the STF. The overall prevalence of prymnesiophytes reaffirms that

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5. Carbon assimilation rates

 At each CTD station, water samples to measure C-assimilation rates were taken from the clean underway flow through system (intake at 6m). Triplicate C-assimilation experiments were initiated by adding 20 μ mol L⁻¹ of NaH¹³CO₃ to polycarbonate one- liter incubation bottles. All incubation bottles were acid rinsed three times, rinsed two times with deionized water, and rinsed three times with seawater directly from the sample point prior to incubation. Polycarbonate bottles were placed in on-deck incubators where temperature regulation was maintained by a continuous surface seawater flow. After 24 h incubation the experiments were terminated by filtering each bottle (pressure drop <10 kPa) through a 25 mm precombusted GF/F filter. The natural abundance of the particulate organic carbon (POC), used as t-zero values to calculate assimilation rates, were obtained by filtering four liters of water onto pre-combusted GF/F filters for each station. All 204 filters, enriched and natural abundance, were snap frozen in liquid N and stored at -80° C. Filters were later acidified and dried overnight at 60 °C. Determination of total C and δ^{13} C was carried out using a continuous flow system consisting of a SERCON 20-22 mass spectrometer connected with an Automated C analyser at the Stable Isotope Facility of the University of California Davis. The external error of analyses (1 std dev) was 0.15 209 permille (‰) for $\delta^{13}C$. C assimilation rates (nmol C L⁻¹ h⁻¹) were calculated following the equations described in Knap, Michaels, Close, Ducklow and Dickson (19). Primary productivity are available at<https://doi.pangaea.de/10.1594/PANGAEA.884052> (17). **6. Richness and statistical analyses**

 All analyses utilised sub-sampled OTU tables as described above. Pro- and eukaryotic richness were calculated as the number of 97% OTUs observed per sample (20). Absolute latitudinal ranges of OTUs were calculated as the difference between the maximum and

- minimum latitudes where an OTU was present (eg., an OTU occurring at 50° S, 40° S
- 220 and 30 \degree S would have an absolute latitudinal range of 20 \degree (21). Correlations were
- 221 calculated using the Spearman coefficient r_s as a measure of rank correlation using the
- Corrplot and Vegan packages in R studio (22), see Figs. S2 and Fig. S3. In contrast to the
- Pearson coefficient, it assesses monotonic relationships, not purely linear relationships.
- Multiple error rates were corrected using Holm' method (23). Productivity and richness
- relationships were assessed with linear, cubic and quadratic regressions.
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Boosted regression trees

 Boosted regression trees Predictor variable influence on pro and eukaryotic richness was assessed using boosted regression trees (see Elith, Leathwick and Hastie (24)).

Through computerised boosting, BRT optimises model predictive performance through

forward step-wise fitting of many simple models, combining their predictive capability to

give more weight to residual variation that remains unexplained (Elith et al., 2008). Like

- regression trees, BRT is robust to missing and unbalanced data, outliers and non-linear
- relationships (24). Cross-validation (cv correlation in the manuscript Tables 1 and 2) is a

technique to evaluate how predictive the model is by partitioning the original data into a

training set to train the model, and a test set to evaluate it. In k-fold cross-validation, the

original sample is randomly partitioned into k equal size subsamples. The tenfold cross

238 validation correlation value is comparable to an r^2 value. See also 'A working guide to

- boosted regression trees' (24). We did not consider day lengths as a predictor in our BRT
- models as these increased linerarly with latitude (see Fig. S9). BRT was implemented in
- 241 the R software environment using the gbm.step function, a guassian error structure, 10
- fold cross-validation and the following settings which resulted in models with > 2000

243 trees in all cases; learning.rate = 0.001 , tree.complexity = 10, bag.fraction = 0.5 (24).

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250 **Supplementary Table S2.**

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Table S2. Percentage relative influence of 11 predictor variables in explaining variation in pro- and eukaryotic richness from samples just below the mixed layer depth (n=89)

in pro- and eukaryotic richness from samples just below the mixed layer depth $(n=89)$

255 along the p15S GO-SHIP transect determined by BRT (see also Elith, Leathwick and

256 Hastie (24)). Predictor variables: Primary productivity of the surface layer (PP); Mixed

257 Layer Depth (MLD); $NOx (NO₃⁻ + NO₂⁻)$; Note: phytoplankton size classes and

258 taxonomic groups derived from HPLC analysis are not included as these were obtain
259 from surface samples only. from surface samples only.

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271 **Table S3: Tests for differences between unordered Oceanographic Biomses.**

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ANOSIM – OCEANOGRAPHIC BIOMES **16S - ARCHAEA**

PAIRWISE TESTS		
	R	Significance
GROUPS	Statistic	Level %
SO, STF	0.828	0.1
SO, TROP. OLIGO	0.993	0.1
STF, TROP. OLIGO	0.821	0.1
SO, EQ. UPWELLING	1	0.1
STF, EQ. UPWELLING	1	0.1
TROP. OLIGO, EQ. UPWELLING	0.216	0.2

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ANOSIM – OCEANOGRAPHIC BIOMES **18S - EUKARYOTES**

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- 277 Groups: SO = Southern Ocean; STF = Subtropical Front; Trop. Oligo = Tropical
- 278 Oligotrophic; Eq. upwelling = Equatorial upwelling.
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²⁶⁹ *Non multi-dimensional scaling (nMDS) and Analysis of Similarities (ANOSIM)*

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Fig. S1: a) Chlorophyll *a* concentrations (in μ g L⁻¹) along the P15S GO-SHIP transect, **b**) Transmission (in %), used as a proxy for particle concentration (1) along the P15S GO- SHIP transect. Black dots on **a)** denote sampling depths for chlorophyll *a* measurements. The polar front, subtropical front and the equatorial upwelling provinces are highlighted by grey rectangles. The red arrow highlights upwelling of colder, relatively nutrient richer waters. Thin grey lines on **b)** denote sampling stations, and black circles highlight low transmission signals (= areas with high particle concentrations).

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 Fig. S2: Spearman correlation coefficients (rs) plots for pro-and eukaryotic richness and biogeochemical parameters. Top figure **a)** shows the samples from the surface waters and bottom figure **b)** shows the samples just below the mixed layer depth. Phytoplankton size 320 classes derived from HPLC analysis are denoted: Microphytoplankton $(20 - 200 \,\mu m)$, 321 Nanophytoplankton $(2 - 20 \mu m)$ and Picophytoplankton $(0.2 - 2 \mu m)$. Positive correlations are displayed in blue and negative correlations in red. Colour intensity and 323 the size of the squares are proportional to the correlation coefficients. P values > 0.05 are

 indicated by black crosses. Note primary productivity values used in the correlation plot are averages from three replicates.

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Fig. S2c: Spearman correlation coefficients (rs) plot for pro-and eukaryotic richness and

332 biogeochemical parameters from the surface waters P values > 0.05 are indicated by black crosses. Note primary productivity values used in the correlation plot are avera

333 black crosses. Note primary productivity values used in the correlation plot are averages from three replicates.

from three replicates.

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366 Fig. S4 a) Heat map of the archaeal Domain. Most abundant sequences of the OTU matrix are displayed and sequence reads for both archaea and bacteria are square root transformed. Colour bar denotes sequence abundance. Dendogram is not a phylogentic tree, but illustrates the clustering of strongly correlated OTUs. Blue, organge, green and red symbols above the heatmaps denote CTD stations in their respecitive oceanogrpahic provinces.

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Fig. S4 b) Heat map of the bacterial Domain. Most abundant sequences of the OTU matrix are displayed and sequence reads for both archaea and bacteria are square roc matrix are displayed and sequence reads for both archaea and bacteria are square root transformed. Colour bar denotes sequence abundance. Dendogram is not a phylogentic tree, but illustrates the clustering of strongly correlated OTUs. Blue, organge, green and red symbols above the heatmaps denote CTD stations in their respecitive oceanogrpahic provinces.

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 Fig. S4 c) Heat map of the eukaryotic Domain. Most abundant sequences of the OTU matrix are displayed and sequence reads for both archaea and bacteria are square root transformed. Colour bar denotes sequence abundance. Dendogram is not a phylogentic tree, but illustrates the clustering of strongly correlated OTUs. Blue, organge, green and red symbols above the heatmaps denote CTD stations in their respecitive oceanogrpahic provinces.

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 $^{415}_{416}$ **Fig. S5**. Mixed layer depths were calculated according to Talley, Pickard, Emery and Swift (2), as a $\Delta T = 0.2 \degree$ C compared to a surface reference depth. Mixed layer depths

417 Swift (2), as a $\Delta T = 0.2$ °C compared to a surface reference depth. Mixed layer depths are denoted in black circles on the graph. DNA sampling depths are highlighted in red

- 418 denoted in black circles on the graph. DNA sampling depths are highlighted in red
- circles.
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 Fig. S6: Rarefaction curves for Archaea, subsampled to a depth of 13400 sequences.

Fig. S7: Rarefaction curves for bacteria, subsampled to a depth of 13400 sequences.

 Fig. S8: Rarefaction curves for eukaryotes, subsampled to a depth of 24500 sequences.

 Fig. S9: Hours of day light along the latitudinal P15S GO-SHIP transect in early Austral
433 winter in the South Pacific Ocean. winter in the South Pacific Ocean.

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