

RESEARCH ARTICLE

Stormwater influences phytoplankton assemblages within the diverse, but impacted Sydney Harbour estuary

Deepa Varkey^{1*}, Sophie Mazard¹, Thomas C. Jeffries², David J. Hughes³, Justin Seymour³, Ian T. Paulsen^{1*}, Martin Ostrowski¹

1 Department of Molecular Sciences, Macquarie University, Sydney, NSW, Australia, **2** School of Science and Health, Western Sydney University, Penrith, NSW, Australia, **3** University of Technology Sydney, Climate Change Cluster, Ultimo, NSW, Australia

These authors contributed equally to this work.

* ian.paulsen@mq.edu.au (IP); deepa.varkey@mq.edu.au (DV)



Abstract

Sydney Harbour is subjected to persistent stress associated with anthropogenic activity and global climate change, but is particularly subjected to pulse stress events associated with stormwater input during episodic periods of high rainfall. Photosynthetic microbes underpin metazoan diversity within estuarine systems and are therefore important bioindicators of ecosystem health; yet how stormwater input affects their occurrence and distribution in Sydney Harbour remains poorly understood. We utilised molecular tools (16S/18S rRNA and *petB* genes) to examine how the phytoplankton community structure (both prokaryotes and eukaryotes) within Sydney Harbour varies between high and low rainfall periods. The relative proportion of phytoplankton sequences was more abundant during the high rainfall period, comprising mainly of diatoms, an important functional group supporting increased productivity within estuarine systems, together with cyanobacteria. Increased spatial variability in the phytoplankton community composition was observed, potentially driven by the steepened physico-chemical gradients associated with stormwater inflow. Conversely, during a low rainfall period, the proportion of planktonic photosynthetic microbes was significantly lower and the persistent phytoplankton were predominantly represented by chlorophyte and dinoflagellate sequences, with lower overall diversity. Differences in phytoplankton composition between the high and low rainfall periods were correlated with temperature, salinity, total nitrogen and silicate. These results suggest that increased frequency of high-rainfall events may change the composition, productivity and health of the estuary. Our study begins to populate the knowledge gap in the phytoplankton community structure and substantial changes associated with transient environmental perturbations, an essential step towards unravelling the dynamics of primary production in a highly urbanised estuarine ecosystem in response to climate change and other anthropogenic stressors.

OPEN ACCESS

Citation: Varkey D, Mazard S, Jeffries TC, Hughes DJ, Seymour J, Paulsen IT, et al. (2018) Stormwater influences phytoplankton assemblages within the diverse, but impacted Sydney Harbour estuary. *PLoS ONE* 13(12): e0209857. <https://doi.org/10.1371/journal.pone.0209857>

Editor: Tunira Bhadauria, Feroze Gandhi Degree College, INDIA

Received: September 19, 2018

Accepted: December 12, 2018

Published: December 26, 2018

Copyright: © 2018 Varkey et al. This is an open access article distributed under the terms of the [Creative Commons Attribution License](https://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: All 18S rRNA and *petB* gene amplicon raw sequence files are available from the NCBI SRA database (BioProject ID: PRJNA491799 available from <http://www.ncbi.nlm.nih.gov/bioproject/491799>).

Funding: This work was supported by the Australian Research Council Discovery Grant DP110102718 to ITP, Australian Government funded International Postgraduate Research Scholarship to DV, Transfield Foundation Early Career Researcher Grant awarded to TCJ, and by

Introduction

Unicellular phytoplankton are significant contributors to primary production [1, 2], and biogeochemical cycling within estuaries [3]. Phytoplankton productivity is however strongly

the Australian Research Council Discovery Grants, DP110103091 and DP120102764 to JS. Sample collection and physiochemical analyses were funded by Greater Sydney Local Land Services. The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Competing interests: The authors have declared that no competing interests exist.

dependent on environmental conditions, such as the availability of light and nutrients, temperature and salinity [4]. Accordingly, phytoplankton assemblages are also highly dynamic and often characterised by species succession in response to environmental perturbations [5]. Alterations to phytoplankton assemblages have direct implications for the nutritional quality [2] and the number of trophic levels in the food chain [6–8], and thus may play important roles in biodiversity at higher trophic levels [9]. Phytoplankton may also be associated with negative impacts during blooms, often promoted by transient nutrient inputs, notably when eutrophication results in localised hypoxia and loss of benthic productivity which can both ultimately impact higher trophic species [10]. Therefore, examining phytoplankton assemblages and understanding how they respond to environmental perturbation is an important area of study and provides an insight into estuarine ecosystem health and functioning [11].

The last major assessment of phytoplankton assemblages in the Sydney Harbour estuary was undertaken some four decades ago [12]. Sydney Harbour is arguably the most biodiverse estuary in the world [13], supporting over 3000 species of metazoans due to high habitat heterogeneity [13–15]. As such the estuary holds great socio-economic and environmental importance for the surrounding population of Sydney, and Australia as a whole [16]. Yet, despite the ecological significance of Sydney Harbour, there is a paucity of taxonomic data on the phytoplankton community. Recent research on phytoplankton within the estuary has mainly centred on understanding the occurrence of harmful algal blooms [17, 18], rather than examining the primary producers *per se*. Therefore, phytoplankton diversity and the environmental conditions that shape the community in the estuary remain unexplored.

Furthermore, Sydney Harbour has been impacted by persistent stress associated with heavy industrialisation and urbanisation [19, 20] and more recently, by increases in sea surface temperature and the subsequent “tropicalization” of the harbour [21]. The estuary is also notably subjected to transient perturbations associated with stormwater inflow during periods of high rainfall, leading to elevated nutrient loading, higher suspended particulate matter and fluctuations in salinity [20, 22–25]. Unlike many other estuaries, there are no major freshwater rivers draining into the harbour, and thus it remains a well-mixed marine estuary for most of the year, with these infrequent, but large precipitation events acting as the major source of freshwater and nutrient loading [13, 23]. Recent efforts examining the benthic [26, 27] and bacterial communities [28], with specific focus on the implications for human health [29], identified the influence of transient environmental perturbations on these communities; yet, little attention has been paid to microbial primary producers.

Therefore, it remains unclear how transient perturbations during periods of high rainfall regulates overall phytoplankton diversity and how this affects primary production and thus ultimately, system biodiversity. This study intended to begin to fill that knowledge gap, focusing on how the phytoplankton community composition changes in response to episodic stormwater inflow within Sydney Harbour. This is particularly important at a time of increasing persistent stress associated with urbanisation and global warming, together with unknown implications for future rainfall patterns as a result of climate change.

Materials and methods

Sample collection

Samples were collected from 30 sites in the Sydney Harbour estuary (30 km; as in [28]). Sample collection required no specific permissions since it was as part of a long term environmental monitoring program conducted by the Sydney Institute of Marine Science and did not involve any endangered or protected species. Sampling sites were grouped into six regions based on location: Parramatta River, Lane Cove River, Western Central Harbour, Eastern Central

Library preparation

Generation of amplicon libraries of the prokaryotic 16S rRNA gene was carried out with the universal eubacterial primers 926F (5' -AAACTYAAAKGAATTGACGG-3') and 1392R (5' -ACGGGCGGTGTGTRC-3'). The preparation, processing and sequencing of these amplicons is described in [28].

To evaluate the eukaryotic community composition, the amplicon libraries of the eukaryotic 18S rRNA gene was generated with the universal V9 region primers (primer set 1380F and 1510R; [30]) attached with sequencing adaptors and indices (based on 16S rRNA gene metagenomic library preparation guide from Illumina, Inc.) for multiplex sequencing. Amplicon libraries for the 18S rRNA gene were prepared in 50 μ l PCR reactions, each reaction contained 25 pmol each of forward and reverse Illumina primers, 0.8 mM dNTPs, 1X reaction buffer, 1 unit Taq polymerase (Qiagen, Australia) and 5–10 ng of template DNA. The PCR program comprised a denaturation step at 94°C for 5 min, followed by 30 cycles of denaturation at 94°C for 20s, annealing at 57°C for 20s, extension at 72°C for 30s, and a final extension step for 6 min at 72°C.

The high resolution phylogenetic marker, *petB* gene, which encodes the cytochrome b_6 subunit of cytochrome b_6f complex [31], was used to enhance the level of taxonomic resolution of the main prokaryotic phytoplankton group, the cyanobacterium *Synechococcus*. Specific primers for the *petB* gene, targeting the picocyanobacterial community [31], were attached with sequencing adaptors and indices that enabled multiplexed sequencing as per 16S rRNA gene metagenomic library preparation guide (Illumina Inc.). Amplicon libraries of the *petB* marker were prepared as done for the 18S rRNA gene with the following modifications: each reaction contained 20 pmol each of forward and reverse primers and 2.5 mM MgCl₂ (Qiagen, Australia). The PCR program comprised a denaturation step at 95°C for 5 min, followed by 30 cycles of denaturation at 95°C for 30s, annealing at 55°C for 30s, extension at 72°C for 45s, and a final extension step for 6 min at 72°C.

Amplification products of *petB* and 18S rRNA were quantitated using Quant-iT PicoGreen dsDNA assay kit (Life Technologies, Australia). Amplicons from each site were pooled (15/10 ng DNA per site for 18S rRNA gene or *petB* respectively) and purified using Agencourt AMPure XP bead purification (Beckman Coulter, Inc., Australia) and eluted using nuclease-free water (Ambion, Australia). Purified multiplexed samples were sequenced on a 300bp Paired-End run (*petB*) or a 150bp Paired-End run (18S rRNA gene) using the Illumina MiSeq platform at Ramaciotti Centre for Genomics (NSW, Australia). Raw sequence files have been deposited at NCBI Sequence Read Archive (BioProject ID: PRJNA491799).

Bioinformatic analyses

Microbial community structure data determined using universal 454 sequencing of 16S rRNA gene amplicons [28] was re-analysed using an in-house bioinformatic analysis pipeline based on the USEARCH64 program [32]. Briefly, the paired-end sequences for the 16S rRNA gene markers were joined using the FLASH algorithm [33]. Barcodes and primers were removed and all sequences were trimmed to 360 bp after quality filtering. Sequences with Ns and any less than 360 bp in length were discarded. *De novo* Operational Taxonomic Units (OTUs) were produced at 99% identity from the pool of dereplicated sequences after removal of singletons and chimeras. Taxonomy was assigned against the Silva 119 release 99% non-redundant reference database [34]. A mapping file and an OTU table were created by mapping the original file against the *de novo* OTUs using the python script uc2otutab.py. The relative abundance of sequences classified as cyanobacteria; chloroplasts, and cyanobacteria were extracted to estimate the relative proportion of phototrophic sequences at each site. Representative sequences

classified as cyanobacteria were assigned to *Prochlorococcus* and *Synechococcus* sub clusters 5.1, 5.2 and 5.3 using a 16S rRNA gene reference phylogenetic tree from [31].

The paired-end 18S rRNA gene sequences were joined, cleaned and processed through the same USEARCH64-based pipeline as above with minor modifications. Briefly, sequences were processed through an initial dereplication, and then sorted into clusters at 97% identity. The taxonomy for each OTU was assigned against the Protist Ribosomal Reference (PR²) database [35] using Mothur classify.seqs command using Knn, numwanted = 3 [36].

The *petB* amplicon sequencing reads were processed using the same USEARCH64 pipeline as above with some modifications. Using QIIME [37] `split_libraies.py`, sequencing adaptors and primers were removed, sequences were trimmed to 280 bp and quality filtered. The cleaned sequences were dereplicated (using `usearch-derep`) and filtered to remove sequences with less than 4 representatives. *De novo* OTUs were produced by clustering dereplicated sequences at 97% identity, removing chimeras and further clustering at 94%. A mapping file was created containing *de novo petB* OTUs and *petB* closed reference sequences (using an up to date *petB* sequence database containing sequences from complete genomes, cloned bidirectional sequences from the Warwick and Roscoff culture collections, and bidirectional sequences from clone libraries of environmental amplicons [31, 38]). The quality trimmed reads were then searched against the mapping file to produce the OTU table. Representative sequences of *de novo* OTUs and the closed reference sequences were used to generate a multiple sequence alignment and a consensus phylogenetic tree in ARB [39] using Neighbour Joining and PhyML [40], which was then used to assign taxonomy and examine the phylogenetic placement of *de novo* OTUs.

Data analyses

Statistical analysis was performed using R software v 3.4.2 [41] and Primer v6.0 [42]. For each phylogenetic marker, OTU counts per site were aggregated based on taxonomic assignment, total counts per site were rarefied to the lowest total count obtained (16S rRNA– 1130; 18S rRNA– 35232; *petB*– 1547) and scaled using square-root transformation. Sample sites were clustered based on Bray Curtis similarity of taxonomic abundance using hierarchical cluster analysis with SIMPROF test ($p = 0.05$). Analysis of similarity (ANOSIM) was performed to identify statistically significant clusters. Multidimensional scaling (MDS) plots were generated to visualise the separation of clusters based on taxonomic abundance. Similarity Percentage (SIMPER) analyses was performed to determine the contributions of taxonomic groups to the Bray Curtis dissimilarity between months and clusters. One-way analysis of variance (ANOVA) with TukeyHSD, after verifying normality, was used to test the statistical relationships between selected groups from the two sampling periods.

Environmental parameters were assessed using draftsman's plots and log-transformed if distribution was skewed. Correlations between variables were explored and for those where the correlation coefficient was >0.8 , one of the co-variables was removed. All retained variables were normalised for all subsequent analyses. RELATE and BEST (with Akaike information criterion) analyses with 999 permutations, were used to determine how well the resemblance matrices of environmental variables and taxonomic abundance matched, and which of the variables best explained patterns in taxonomic abundances. Distance-based linear modelling (DistLM) and distance-based redundancy analysis (dbRDA) were performed to examine taxonomic abundance variability explained by environmental variables.

Results

Physico-chemical conditions

The sampling period corresponded to a prolonged period of high rainfall (14.11 mm above the historical average) during the month sampled (February) [43]. Water temperature ranged

from ~22–27.5°C, with higher temperatures corresponding to sites located within inland branches of the estuary (S1 Fig). Inland sites were characterised by lower salinities (as low as 12.26 PSU), due to their proximity to freshwater input sources. Salinity increased along the estuary, reaching 34 PSU towards the harbour entrance, thus consistent with fully oceanic conditions (S1 Fig). Average pH was 8.06 ± 0.35 with the lowest values corresponding to the most inland sites in Lane Cove and Middle Harbour (S1 Fig). The average concentration of TSS was $7.2 \pm 5.3 \text{ mgL}^{-1}$, which was lower towards the mouth of the harbour (S1 Fig). Nutrient (including oxidised, reduced and total N, PO_4 and Si) concentrations were highest at the sites furthest inland, and considerably lower towards the harbour mouth (S2 Fig). Average dissolved O_2 concentration was $9.18 \pm 2.4 \text{ mgL}^{-1}$, highest in the Parramatta and Lane Cove Rivers, and the lowest was in site MH1 (2.4 mgL^{-1}) in Middle Harbour.

During the low rainfall period (in September), rainfall was only half that of the typical monthly average. The range of measured temperatures was smaller (~17–20°C) and salinity was remarkably constant across the estuary (~34 PSU), except for the most inland sites of Parramatta and Lane Cove Rivers where it dropped to 28–30 PSU (S1 Fig). Furthermore, average pH (7.84 ± 0.2) and TSS ($3.5 \pm 3.7 \text{ mgL}^{-1}$) were lower than during the high rainfall period. Excluding the most inland sites, average concentrations of oxidised and reduced N and PO_4 were ~2–3x higher whilst average total N and Si amounts were only half that of the high rainfall period (S2 Fig). Generally, nutrient concentrations were higher in the inland branches, (i.e. closer to the stormwater input sources) compared to the main estuary (S2 Fig). Average dissolved O_2 concentration was lower ($8.6 \pm 0.8 \text{ mgL}^{-1}$) and less variable across the estuary than during the high rainfall period.

Temporal and spatial shifts in phytoplankton composition

The microbial community, including the prokaryotic, eukaryotic and cyanobacterial fractions, in the high rainfall period was significantly distinct from the community present during the low rainfall period in the Sydney Harbour estuary (ANOSIM: 16S rRNA—R statistic = 0.912; significance = 0.1%; 18S rRNA—R statistic = 0.52, significance = 0.1%; *petB*—R statistic = 1, significance = 0.1%).

All proportions of taxa mentioned below are as percentages of the total sequences for each phylogenetic marker (i.e. 16S rRNA, 18S rRNA or *petB* genes). Since eukaryotic phytoplankton can have a wide range of rRNA gene copy numbers (100s - 1000s; [44]), OTU relative abundances cannot be used as a direct quantitative measure of cell density [45]. However, OTU abundances are not completely independent of plankton numbers [45] therefore we have used it to compare the relative abundances of phytoplankton groups between sampling periods.

Microbial phototrophs: key differences between rainfall periods. In the high rainfall period, the distinct microbial community (based on 16S rRNA gene; S3 Fig) was characterised by significantly higher relative abundance of the phototrophic components, chloroplast (13.6%) and cyanobacteria (15.3%), which were both less than 0.5% during low rainfall ($p < 0.05$; Fig 2A). This pattern is consistent with the significantly higher concentrations of chlorophyll ($11.88 \mu\text{gL}^{-1}$) during the high rainfall period relative to the low rainfall period ($7.24 \mu\text{gL}^{-1}$; $p < 0.05$; S1 Fig).

Spatial variability was evident during the high rainfall period with higher proportions of chloroplast than cyanobacterial 16S rRNA sequences in the most inland sites, i.e. P1 and P2 (Parramatta River), LC1 and LC2 (Lane Cove River) and MH1 and MH3 (Middle Harbour) [Fig 2B]. The rest of the estuary, particularly those at the mouth of the harbour, had an equal or higher percentage of cyanobacteria (Fig 2B). A major proportion of cyanobacteria was marine *Synechococcus*, mainly comprising (53–70% of *petB* sequences) the clade II lineage in the high rainfall period and clade I during low rainfall (S4 Fig).

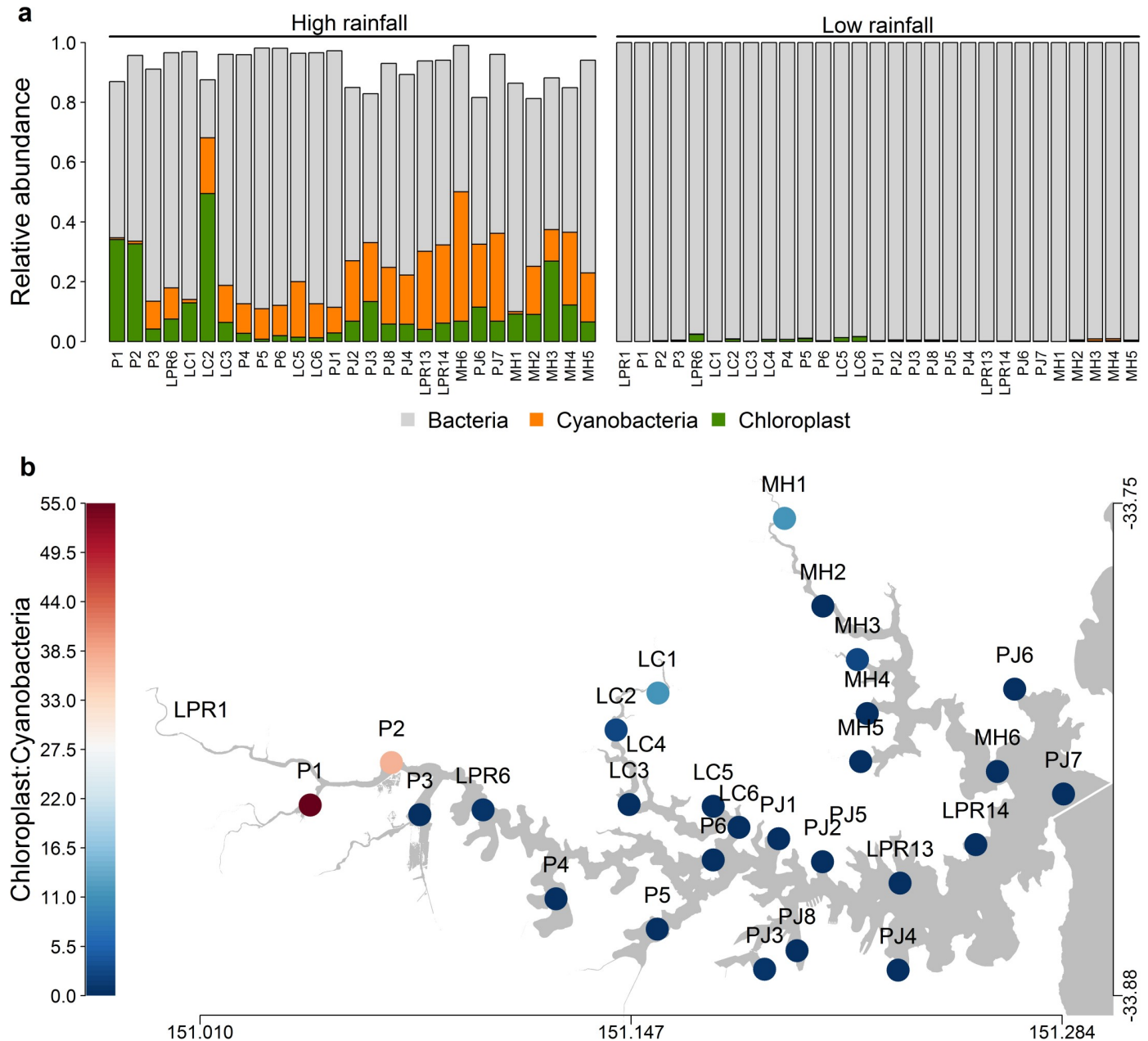


Fig 2. Relative proportions of microbial functional groups in the Sydney Harbour estuary, based on V6-V8 regions of 16S rRNA gene. **a)** Relative abundance of the heterotrophic (bacteria) and autotrophic (cyanobacteria and chloroplast) fractions, at each sampling site, under high and low rainfall conditions. Reads that did not fall in these functional categories have been excluded. **b)** Spatial representation of the ratio of eukaryotic (chloroplast) to prokaryotic (cyanobacteria) phytoplankton during high rainfall.

<https://doi.org/10.1371/journal.pone.0209857.g002>

Eukaryotic phytoplankton: Key differences between rainfall periods. During the high rainfall period, the distinct eukaryotic community (based on 18S rRNA gene; Fig 3a) was dominated by Bacillariophyceae (diatoms), in particular polar-centric and unclassified Bacillariophyceae, which occurred in an average relative abundance of 42% across the estuary (Fig 3B; S5 Fig). During the low rainfall period, diatoms had notably lower relative abundance (18% on average across the estuary) with pennate species most prevalent whilst 18S rRNA OTUs

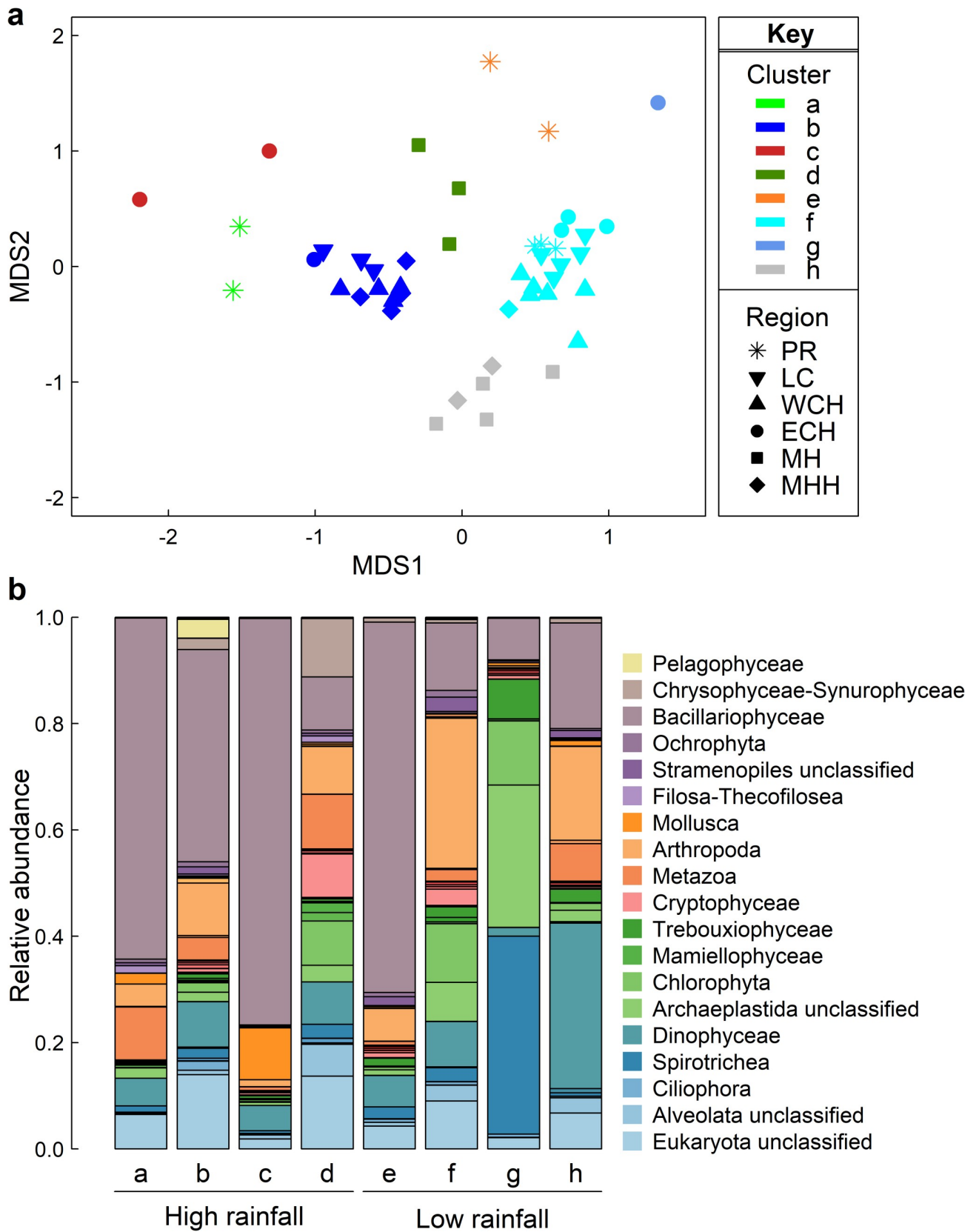


Fig 3. Eukaryotic community profile, based on 18S rRNA gene V9 region, in Sydney Harbour estuary during high and low rainfall periods. a) Multi-dimensional scaling plot of the community composition during the two periods. Samples are colour-coded based on clusters (assigned using hierarchical cluster analysis with SIMPROF test based on Bray-Curtis similarity) from the high rainfall period: a (light green), b (dark blue), c (red), d (dark green); and from the low rainfall period: e (orange), f (light blue), g (blue), h (grey). Symbols represent geographic region sampled: Parramatta River (*), Lane Cove River (●), Western Central Harbour (▼), Eastern Central Harbour (▲), Middle Harbour (■) and Marine/Harbour Heads (◆). b) Relative abundance profile of the eukaryotic community during the sampling periods, at taxonomic level of family or lower. Each bar represents the cluster of sites, as above. The rarefied number of reads assigned to each lineage was averaged across sites of each cluster.

<https://doi.org/10.1371/journal.pone.0209857.g003>

assigned to Dinophyceae (13.1%) and Archaeplastida sub-groups (17.9%), were almost twice that of the high rainfall period (Fig 3B; S5 Fig).

During the high rainfall period, sites close to potential stormwater point sources in Lane Cove (cluster c) and Parramatta (cluster a) Rivers had higher relative abundance of diatoms than the main estuary (Fig 3), each region distinguished by specific diatom taxa (S5 Fig). During the low rainfall period, only the most inland sites were distinct from the other sites in the estuary whereby LPR1 and P1 (cluster e) of Parramatta River were characterised by high diatom prevalence whilst LC1 (cluster g) of Lane Cove River had the lowest relative abundance of diatoms and the highest proportion of the ciliate, *Spirotrichea* (Fig 3). The Middle Harbour community was differentiated from the other sites in the estuary during both sampling periods with twice the proportion of OTUs assigned to Archaeplastida, Chrysophyceae-Synurophyceae and Cryptophyceae in the high rainfall period (cluster d) and the highest relative abundance of Dinophyceae (dinoflagellate) OTUs during low rainfall (cluster h; Fig 3).

Influence of environmental variables on phytoplankton composition

Patterns in the eukaryotic taxonomic composition significantly correlated with the variation of environmental variables (R statistic = 0.66, significance = 0.1%) during both the high and low rainfall periods. DistLM and ordination analyses identified temperature, total N, Si and salinity as significant variables that explained 36% of the variation in the eukaryotic community profiles, both spatially and between sampling periods (Fig 4). Temperature strongly correlated with community differences between the high (late summer) and low (early spring) rainfall periods, while salinity, total N and Si correlated with the spatial variations in the community.

For the prokaryotic phytoplankton mainly represented by *Synechococcus*, the clear distinction of community composition between the high and low rainfall periods strongly correlated with temperature, total N and PO₄, with temperature alone explaining 85.6% of the variation (S6 Fig).

Discussion

Little is known about the influence of periodic perturbations such as heavy rainfall on the primary producers that underpin the ecological functioning of a socially and economically important estuary, 'rarely matched' for habitat and biological diversity, the Sydney Harbour estuary [13]. By evaluating the spatio-temporal variability in the phytoplankton community during both high and low rainfall periods, we demonstrate how estuarine phytoplankton communities respond to stormwater inflow and discuss the potential implications for ecosystem functioning in the highly-biodiverse, yet impacted Sydney Harbour estuary.

Variability in the phytoplankton community

Previous studies have shown that stormwater inflow into the Sydney Harbour estuary modifies the resident bacterial communities [28], with these shifts mainly considered within the context of a negative perturbation event, with implications for human health due to increased numbers

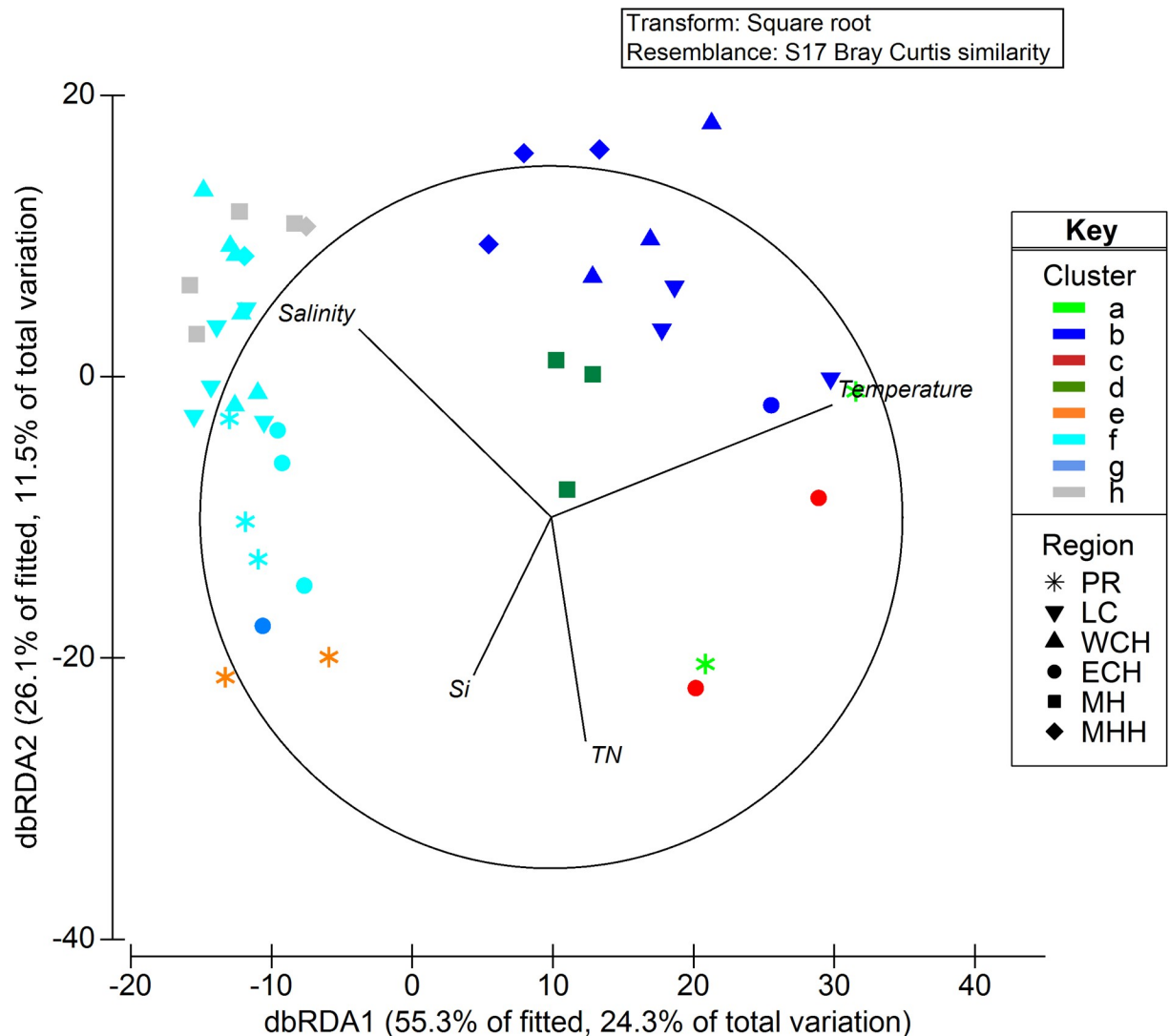


Fig 4. Distance-based redundancy analysis plot of the eukaryotic community structure (using 18S rRNA gene V9 region) for the Sydney Harbour estuary, during high and low rainfall periods. Samples are colour-coded based on clusters (assigned using hierarchical cluster analysis with SIMPROF test based on Bray-Curtis similarity) for the high rainfall period: **a** (light green), **b** (dark blue), **c** (red), **d** (dark green); and for the low rainfall period: **e** (orange), **f** (light blue), **g** (blue), **h** (grey). Symbols represent geographic region sampled: Parramatta River (*), Lane Cove River (●), Western Central Harbour (▼), Eastern Central Harbour (▲), Middle Harbour (■) and Marine/Harbour Heads (◆). TN—Total nitrogen; Si—Silicate.

<https://doi.org/10.1371/journal.pone.0209857.g004>

of pathogens such as faecal coliforms [25]. Our data however, which focuses on the primary producers within this estuary suggests that a diverse and “healthy” phytoplankton community occurs within Sydney Harbour during the late summer high rainfall period. Specifically, the observed increase in total Chl-*a* together with the greater proportion of 16S rRNA sequences assigned to autotrophs suggests that overall phytoplankton abundance was likely higher than during the low rainfall period in early spring. This observation would appear to support previous findings of lower CO₂ emissions from Sydney Harbour estuary during a high rainfall period, presumably indicating greater photosynthetic drawdown of CO₂ [46]. This previous study [46] further demonstrated that during early spring, CO₂ emission was higher, consistent with a switch towards net heterotrophic, rather than autotrophic status.

Furthermore, in addition to a likely higher overall abundance of phytoplankton during the high rainfall period, our study also found evidence of a phytoplankton composition conducive to a high-quality food web. Specifically, the apparent high abundance of diatoms (inferred from 18S rRNA gene), an important and highly-productive functional group, which typically support higher total biomass in upper trophic levels [6, 7], and are thus considered an essential part of estuarine ecosystem functioning [1]. Additionally, we observed no obvious indicators of ecosystem stress (e.g. hypoxia) commonly associated with localised eutrophication [47], despite exceptionally high nutrient concentrations close to stormwater point sources during the high rainfall period. Thus, from the perspective of studying photosynthetic microbes we found no evidence of negative ecological impact, rather, it appears that such transient perturbations may be beneficial for primary production.

In fact, during the low rainfall period, the relative phytoplankton abundance (inferred from 16S rRNA gene) and total Chl-*a* concentration were notably lower and the phytoplankton (based on 18S rRNA gene) was mostly represented by chlorophytes and dinoflagellates. While these findings should be interpreted with caution due to certain eukaryotes exhibiting multiple copies of the 18S rRNA gene which limits absolute quantification and abundance comparisons between phytoplankton classes [44, 45]; the substantial difference in the proportion of phytoplankton sequences likely reflects the difference in their abundance between the sampling periods.

Environmental influence on phytoplankton composition

The apparent higher proportion of phytoplankton during the high rainfall period suggests environmental conditions conducive to phytoplankton growth. Temperature, salinity, total N and Si explained a third of the observed variation in phytoplankton community structure between high (late summer) and low (early spring) rainfall periods.

Temperature and light, are important factors regulating photosynthesis [4], and thus potentially phytoplankton growth rates. Temperature, which was considerably (6°C) higher in the late summer high rainfall period than the low rainfall period in early spring, certainly contributed to the difference in phytoplankton composition. Notably, this seasonally-driven difference in temperature was the most significant driving factor behind shifts in *Synechococcus* clade composition, which is consistent with patterns reported in other estuarine environments (e.g. Chesapeake Bay, see [48, 49]). The predominance of *Synechococcus* clade II in late summer (high rainfall period) and prevalence of clades I and IV in early spring (low rainfall period) is in accordance with clade-specific temperature niches, i.e. 20–28°C for clade II and 10–20°C for clades I and IV [50–53]. Although the seasonal difference in temperature partly explained differences in phytoplankton composition, numerous phytoplankton species, particularly diatoms which are a highly diverse group, flourish at a range of temperatures [1], therefore, it is highly likely that there are other factors also at play. Unfortunately, irradiance was not measured and therefore it remains unclear whether this had a significant influence on the observed differences in phytoplankton composition.

Changes in salinity and nutrients (N and Si) may be directly linked to stormwater inflow, and we demonstrate that in the high rainfall period, sites close to stormwater point sources exhibit markedly different phytoplankton communities with higher proportion of chloroplast to cyanobacterial 16S rRNA sequences, and the prevalence of diatoms based on 18S rRNA gene. Notably, coastal diatoms have a well-documented capacity to respond rapidly to macro-nutrient enrichment compared to other phytoplankton groups [54, 55]. Therefore, periodic delivery of N and Si via stormwater inflow may be an important driver of phytoplankton productivity within Sydney Harbour, which otherwise has limited nutrient enrichment from

riverine input unlike most other estuaries [23]. This represents a potentially important finding particularly considering the recent prolonged drought that has affected the Sydney Harbour catchment area [56].

Finally, biotic interactions with predators such as grazers and/or viruses may also explain apparent lower phytoplankton abundance during the low rainfall period compared to the high rainfall period. Indeed support for this hypothesis is evident in the higher prevalence of zooplankton such as *Eucyclops* and *Leptodiaptomus*, known grazers of phytoplankton such as diatoms [57, 58], at sites with the lowest relative abundance of diatoms.

Conclusions

Our data suggests that the community balance between heterotrophs and phototrophs is highly variable over space and time in the estuary, with a greater proportion and diversity amongst the phototrophic community during the high rainfall period. Therefore, by inference, such transient perturbations may in fact be beneficial for promoting biodiversity within Sydney Harbour. While we saw no negative consequences of eutrophication during this study, whether this observation would hold true in the longer term and whether stormwater inputs represent a net benefit versus detriment remain unclear. Critically, the inevitable trade-off between the spatial resolution that was necessary within such a large and spatially-heterogeneous estuary, means that we lack sufficient temporal resolution to capture potential phytoplankton successional dynamics in response to stormwater input. Since the last major assessment of the phytoplankton assemblages within Sydney Harbour estuary was conducted four decades ago [12], we have no reliable community baseline from which to evaluate the interesting findings of this study. However, by unravelling the phytoplankton diversity and the drivers of community change, our study provides insights into phytoplankton dynamics within this highly urbanised ecosystem. Further high-resolution monitoring to capture the interplay between eutrophication and phytoplankton productivity will be critical to understand how transient stress affects primary production, and help inform future management policy of the urbanised catchment.

Supporting information

S1 Fig. Physicochemical parameters of water from sites sampled within Sydney Harbour estuary during the high and low rainfall periods. a) Temperature ($^{\circ}\text{C}$), b) Salinity (psu), c) pH (unitless), d) Total Suspended Solids (TSS, mg.L^{-1}) and e) Chlorophyll ($\mu\text{g.L}^{-1}$). (TIF)

S2 Fig. Nutrient concentrations of water from sites sampled within Sydney Harbour estuary, during the high and low rainfall periods. a) Nitrate/Nitrite ($\mu\text{g.L}^{-1}$), b) Ammonium ($\mu\text{g.L}^{-1}$), c) Total nitrogen (N, $\mu\text{g.L}^{-1}$), d) Phosphate ($\mu\text{g.L}^{-1}$) and e) Silicate ($\mu\text{g.L}^{-1}$). (TIF)

S3 Fig. Multi-dimensional scaling (MDS) plot of the planktonic prokaryotic community profile, based on 16S rRNA gene (V6-V8 regions), along the Sydney Harbour estuary during high and low rainfall. Samples are colour-coded based on clusters (assigned using hierarchical cluster analysis with SIMPROF test based on Bray Curtis similarity) from high rainfall period: 1 (olive green), 2 (purple), 3 (red), 4 (blue), 5 (brown); and from low rainfall period: 6 (green), 7 (coral), 8 (pink). Regions of the sample sites are represented by symbols: Parramatta River (asterisk), Lane Cove (circle), Western Central Harbour (inverted triangle), Eastern Central Harbour (triangle), Middle Harbour (square) and Marine/Harbour Heads (diamond). (TIF)

S4 Fig. *Synechococcus* community composition, based on *petB* gene, along the Sydney Harbour estuary during sampling. a) Multi-dimensional scaling (MDS) plot of the community in the high (red) and low (blue) rainfall periods. Symbols represent geographic region sampled: Parramatta River (asterisk), Lane Cove (circle), Western Central Harbour (inverted triangle), Eastern Central Harbour (triangle), Middle Harbour (square) and Marine/Harbour Heads (diamond). b) Relative abundance of *Synechococcus* lineages based on *petB* gene sequences detected during high and low rainfall periods.
(TIF)

S5 Fig. Relative abundance profile of the planktonic eukaryotic community, at the genus level, at each sampling site in the Sydney Harbour estuary during the high and low rainfall periods.
(TIF)

S6 Fig. Distance-based redundancy analysis (dbRDA) of *Synechococcus* community composition (determined using *petB* gene) for the Sydney Harbour estuary, under high (red) and low (blue) rainfall conditions. Symbols represent geographic region sampled: Parramatta River (asterisk), Lane Cove (circle), Western Central Harbour (inverted triangle), Eastern Central Harbour (triangle), Middle Harbour (square) and Marine/Harbour Heads (diamond).
(TIF)

S1 Table. Environmental parameters at sampling sites in the Sydney Harbour estuary, during high (February) and low (September) rainfall periods.
(XLSX)

Acknowledgments

We thank Daniel Harrison for sample collection and nutrient analyses, conducted at Sydney Institute of Marine Science and Southern Cross University.

Author Contributions

Conceptualization: Deepa Varkey, Justin Seymour, Ian T. Paulsen, Martin Ostrowski.

Data curation: Deepa Varkey, Sophie Mazard.

Formal analysis: Deepa Varkey, David J. Hughes, Martin Ostrowski.

Funding acquisition: Justin Seymour, Ian T. Paulsen.

Investigation: Deepa Varkey, Sophie Mazard, David J. Hughes, Martin Ostrowski.

Methodology: Deepa Varkey.

Project administration: Thomas C. Jeffries, Justin Seymour.

Resources: Thomas C. Jeffries, Ian T. Paulsen, Martin Ostrowski.

Software: Martin Ostrowski.

Supervision: Ian T. Paulsen.

Validation: Martin Ostrowski.

Visualization: Thomas C. Jeffries, David J. Hughes.

Writing – original draft: Deepa Varkey.

Writing – review & editing: Sophie Mazard, David J. Hughes, Justin Seymour, Ian T. Paulsen, Martin Ostrowski.

References

1. Carstensen J, Klais R, Cloern JE. Phytoplankton blooms in estuarine and coastal waters: Seasonal patterns and key species. *Estuar Coast Shelf Sci.* 2015; 162: 98–109.
2. Winder M, Carstensen J, Galloway AWE, Jakobsen HH, Cloern JE. The land–sea interface: A source of high-quality phytoplankton to support secondary production. *Limnol Oceanogr.* 2017; 62(S1): S258–S71.
3. Litchman E, Tezanos Pinto P, Edwards KF, Klausmeier CA, Kremer CT, Thomas MK. Global biogeochemical impacts of phytoplankton: a trait-based perspective. *J Ecol.* 2015; 103(6): 1384–96.
4. Edwards KF, Thomas MK, Klausmeier CA, Litchman E. Phytoplankton growth and the interaction of light and temperature: A synthesis at the species and community level. *Limnol Oceanogr.* 2016; 61(4): 1232–44.
5. Pinckney JL, Paerl HW, Harrington MB, Howe KE. Annual cycles of phytoplankton community-structure and bloom dynamics in the Neuse River Estuary, North Carolina. *Mar Biol.* 1998; 131(2): 371–81.
6. Cloern JE, Dufford R. Phytoplankton community ecology: Principles applied in San Francisco Bay. *Mar Ecol Prog Ser.* 2005; 285: 11–28.
7. Irwin AJ, Finkel ZV, Schofield OME, Falkowski PG. Scaling-up from nutrient physiology to the size-structure of phytoplankton communities. *J Plankton Res.* 2006; 28(5): 459–71.
8. Legendre L, Rassoulzadegan F. Plankton and nutrient dynamics in marine waters. *Ophelia.* 1995; 41(1): 153–72.
9. Dickman EM, Newell JM, González MJ, Vanni MJ. Light, nutrients, and food-chain length constrain planktonic energy transfer efficiency across multiple trophic levels. *Proc Natl Acad Sci USA.* 2008; 105(47): 18408. <https://doi.org/10.1073/pnas.0805566105> PMID: 19011082
10. Bricker SB, Longstaff B, Dennison W, Jones A, Boicourt K, Wicks C, et al. Effects of nutrient enrichment in the nation's estuaries: A decade of change. *Harmful Algae.* 2008; 8(1): 21–32.
11. de Vargas C, Audic S, Henry N, Decelle J, Mahé F, Logares R, et al. Eukaryotic plankton diversity in the sunlit ocean. *Science.* 2015; 348(6237).
12. Revelante N, Gilmartin M. Characteristics of the microplankton and nanoplankton communities of an Australian coastal plain estuary. *Mar Freshw Res.* 1978; 29: 9–18.
13. Johnston EL, Mayer-Pinto M, Hutchings PA, Marzinelli EM, Ah Yong ST, Birch G, et al. Sydney Harbour: what we do and do not know about a highly diverse estuary. *Mar Freshw Res.* 2015; 66(12): 1073–87.
14. Banks J, Hedge LH, Hoisington C, Strain EM, Steinberg PD, Johnston EL. Sydney Harbour: Beautiful, diverse, valuable and pressured. *Reg Stud Mar Sci.* 2016; 8: 353–61.
15. Hutchings P, Ah Yong S, Ashcroft M, McGrouther M, Reid A. Sydney Harbour: its diverse biodiversity. *Aust Zool.* 2013; 36(3): 255–320.
16. Mayer-Pinto M, Johnston EL, Hutchings PA, Marzinelli EM, Ah Yong ST, Birch G, et al. Sydney Harbour: a review of anthropogenic impacts on the biodiversity and ecosystem function of one of the world's largest natural harbours. *Mar Freshw Res.* 2015; 66(12): 1088–105.
17. Ajani P, Hallegraef G, Pritchard T. Historic overview of algal blooms in marine and estuarine waters of New South Wales, Australia. 2001; *Proc Linn Soc NSW.* 123: 1–22.
18. Ajani P, Ingleton T, Pritchard T, Armand L. Microalgal blooms in the coastal waters of New South Wales, Australia. *Proc Linn Soc NSW.* 2011; 133: 15–31.
19. Banks JL, Hutchings P, Curley B, Hedge L, Creese B, Johnston E. Biodiversity conservation in Sydney Harbour. *Pac Conserv Biol.* 2016; 22(2):98–109.
20. Hedge L, Johnston E, Birch G, Creese B, Figueira W, Hutchings P, et al. Living Harbour. *Dynamic Science. a Systematic Review of the Science of Sydney Harbour: Sydney Institute of Marine Science;* 2014.
21. Verges A, Steinberg PD, Hay ME, Poore AG, Campbell AH, Ballesteros E, et al. The tropicalization of temperate marine ecosystems: climate-mediated changes in herbivory and community phase shifts. *Proc Biol Sci.* 2014; 281(1789): 20140846. <https://doi.org/10.1098/rspb.2014.0846> PMID: 25009065
22. Beck HJ, Birch GF. Metals, nutrients and total suspended solids discharged during different flow conditions in highly urbanised catchments. *Environ Monit Assess.* 2012; 184(2): 637–53. <https://doi.org/10.1007/s10661-011-1992-z> PMID: 21448629

23. Das P, Marchesiello P, Middleton JH. Numerical modelling of tide-induced residual circulation in Sydney Harbour. *Mar Freshw Res.* 2000; 51(2): 97–112.
24. Hatje V, Apte SC, Hales LT, Birch GF. Dissolved trace metal distributions in Port Jackson estuary (Sydney Harbour), Australia. *Mar Pollut Bull.* 2003; 46(6): 719–30. [https://doi.org/10.1016/S0025-326X\(03\)00061-4](https://doi.org/10.1016/S0025-326X(03)00061-4) PMID: 12787580
25. Hose GC, Gordon G, McCullough FE, Pulver N, Murray BR. Spatial and rainfall related patterns of bacterial contamination in Sydney Harbour estuary. *J Water Health.* 2005; 3(4): 349–58. PMID: 16459841
26. Chariton Anthony A, Court Leon N, Hartley Diana M, Colloff Matthew J, Hardy Christopher M. Ecological assessment of estuarine sediments by pyrosequencing eukaryotic ribosomal DNA. *Front Ecol Environ.* 2010; 8(5): 233–8.
27. Sun MY, Dafforn KA, Brown MV, Johnston EL. Bacterial communities are sensitive indicators of contaminant stress. *Mar Pollut Bull.* 2012; 64(5): 1029–38. <https://doi.org/10.1016/j.marpolbul.2012.01.035> PMID: 22385752
28. Jeffries TC, Schmitz Fontes ML, Harrison DP, Van-Dongen-Vogels V, Eyre BD, Ralph PJ, et al. Bacterioplankton dynamics within a large anthropogenically impacted urban estuary. *Front Microbiol.* 2015; 6: 1438. <https://doi.org/10.3389/fmicb.2015.01438> PMID: 26858690
29. Siboni N, Balaraju V, Carney R, Labbate M, Seymour JR. Spatiotemporal dynamics of *Vibrio* spp. within the Sydney Harbour Estuary. *Front Microbiol.* 2016; 7: 460. <https://doi.org/10.3389/fmicb.2016.00460> PMID: 27148171
30. Amaral-Zettler LA, McCliment EA, Ducklow HW, Huse SM. A method for studying protistan diversity using massively parallel sequencing of V9 hypervariable regions of small-subunit ribosomal RNA genes. *PLOS ONE.* 2009; 4(7): e6372. <https://doi.org/10.1371/journal.pone.0006372> PMID: 19633714
31. Mazard S, Ostrowski M, Partensky F, Scanlan DJ. Multi-locus sequence analysis, taxonomic resolution and biogeography of marine *Synechococcus*. *Environ Microbiol.* 2012; 14(2): 372–86. <https://doi.org/10.1111/j.1462-2920.2011.02514.x> PMID: 21651684
32. Edgar RC. Search and clustering orders of magnitude faster than BLAST. *Bioinformatics.* 2010; 26(19): 2460–1. <https://doi.org/10.1093/bioinformatics/btq461> PMID: 20709691
33. Magoc T, Salzberg SL. FLASH: fast length adjustment of short reads to improve genome assemblies. *Bioinformatics.* 2011; 27(21): 2957–63. <https://doi.org/10.1093/bioinformatics/btr507> PMID: 21903629
34. Yilmaz P, Parfrey LW, Yarza P, Gerken J, Pruesse E, Quast C, et al. The SILVA and “All-species Living Tree Project (LTP)” taxonomic frameworks. *Nucleic Acids Res.* 2014; 42(Database issue): D643–D8. <https://doi.org/10.1093/nar/gkt1209> PMID: 24293649
35. Guillou L, Bachar D, Audic S, Bass D, Berney C, Bittner L, et al. The Protist Ribosomal Reference database (PR2): a catalog of unicellular eukaryote Small Sub-Unit rRNA sequences with curated taxonomy. *Nucleic Acids Res.* 2013; 41(Database issue): D597–D604. <https://doi.org/10.1093/nar/gks1160> PMID: 23193267
36. Schloss PD, Westcott SL, Ryabin T, Hall JR, Hartmann M, Hollister EB, et al. Introducing mothur: Open-source, platform-independent, community-supported software for describing and comparing microbial communities. *Applied and Environmental Microbiology.* 2009; 75(23): 7537–41. <https://doi.org/10.1128/AEM.01541-09> PMID: 19801464
37. Caporaso JG, Kuczynski J, Stombaugh J, Bittinger K, Bushman FD, Costello EK, et al. QIIME allows analysis of high-throughput community sequencing data. *Nat Methods.* 2010; 7(5): 335–6. <https://doi.org/10.1038/nmeth.f.303> PMID: 20383131
38. Humily F, Farrant GK, Marie D, Partensky F, Mazard S, Perennou M, et al. Development of a targeted metagenomic approach to study a genomic region involved in light harvesting in marine *Synechococcus*. *FEMS Microbiol Ecol.* 2014; 88(2): 231–49. <https://doi.org/10.1111/1574-6941.12285> PMID: 24862161
39. Ludwig W, Strunk O, Westram R, Richter L, Meier H, Yadukumar, et al. ARB: a software environment for sequence data. *Nucleic Acids Res.* 2004; 32(4): 1363–71. <https://doi.org/10.1093/nar/gkh293> PMID: 14985472
40. Guindon S, Dufayard JF, Lefort V, Anisimova M, Hordijk W, Gascuel O. New algorithms and methods to estimate maximum-likelihood phylogenies: assessing the performance of PhyML 3.0. *Syst Biol.* 2010; 59(3): 307–21. <https://doi.org/10.1093/sysbio/syq010> PMID: 20525638
41. R Core Team. R: A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria. 2013.
42. Clarke KR, Gorley RN. PRIMER v6: User Manual/Tutorial. PRIMER-E, Plymouth. 2006.
43. Bureau of Meteorology. Monthly weather review—New South Wales. 2013 Feb [cited 13 November 2018]. Available from: <http://www.bom.gov.au/climate/mwr/nsw/mwr-nsw-201302.pdf>.

44. Zhu F, Massana R, Not F, Marie D, Vaulot D. Mapping of picoeucaryotes in marine ecosystems with quantitative PCR of the 18S rRNA gene. *FEMS Microbiol Ecol.* 2005; 52(1): 79–92. <https://doi.org/10.1016/j.femsec.2004.10.006> PMID: 16329895
45. Penna A, Casabianca S, Guerra AF, Vernesi C, Scardi M. Analysis of phytoplankton assemblage structure in the Mediterranean Sea based on high-throughput sequencing of partial 18S rRNA sequences. *Mar Genomics.* 2017; 36: 49–55. <https://doi.org/10.1016/j.margen.2017.06.001> PMID: 28625778
46. Tanner EL, Mulhearn PJ, Eyre BD. CO2 emissions from a temperate drowned river valley estuary adjacent to an emerging megacity (Sydney Harbour). *Estuar Coast Shelf Sci.* 2017; 192: 42–56.
47. Vaquer-Sunyer R, Duarte CM. Thresholds of hypoxia for marine biodiversity. *Proc Natl Acad Sci USA.* 2008; 105(40): 15452. <https://doi.org/10.1073/pnas.0803833105> PMID: 18824689
48. Cai H, Wang K, Huang S, Jiao N, Chen F. Distinct patterns of picocyanobacterial communities in winter and summer in the Chesapeake Bay. *Appl Environ Microbiol.* 2010; 76(9): 2955–60. <https://doi.org/10.1128/AEM.02868-09> PMID: 20228109
49. Murrell MC, Lores EM. Phytoplankton and zooplankton seasonal dynamics in a subtropical estuary: importance of cyanobacteria. *J Plankton Res.* 2004; 26(3): 371–82.
50. Pittera J, Humily F, Thorel M, Grulois D, Garczarek L, Six C. Connecting thermal physiology and latitudinal niche partitioning in marine *Synechococcus*. *ISME J.* 2014; 8: 1221. <https://doi.org/10.1038/ismej.2013.228> PMID: 24401861
51. Sohm JA, Ahlgren NA, Thomson ZJ, Williams C, Moffett JW, Saito MA, et al. Co-occurring *Synechococcus* ecotypes occupy four major oceanic regimes defined by temperature, macronutrients and iron. *ISME J.* 2015; 10: 333. <https://doi.org/10.1038/ismej.2015.115> PMID: 26208139
52. Varkey D, Mazard S, Ostrowski M, Tetu SG, Haynes P, Paulsen IT. Effects of low temperature on tropical and temperate isolates of marine *Synechococcus*. *ISME J.* 2015; 10: 1252. <https://doi.org/10.1038/ismej.2015.179> PMID: 26495993
53. Zwirgmaier K, Jardillier L, Ostrowski M, Mazard S, Garczarek L, Vaulot D, et al. Global phylogeography of marine *Synechococcus* and *Prochlorococcus* reveals a distinct partitioning of lineages among oceanic biomes. *Environ Microbiol.* 2007; 10(1): 147–61. <https://doi.org/10.1111/j.1462-2920.2007.01440.x> PMID: 17900271
54. Alexander H, Rouco M, Haley ST, Wilson ST, Karl DM, Dyhrman ST. Functional group-specific traits drive phytoplankton dynamics in the oligotrophic ocean. *Proc Natl Acad Sci USA.* 2015; 112(44): E5972. <https://doi.org/10.1073/pnas.1518165112> PMID: 26460011
55. Hughes DJ, Varkey D, Doblin MA, Ingleton T, McInnes A, Ralph PJ, et al. Impact of nitrogen availability upon the electron requirement for carbon fixation in Australian coastal phytoplankton communities. *Limnol Oceanogr.* 2018; <https://doi.org/10.1002/lno.10814>
56. NSW DPI Climate Unit. Drought continues to bite across NSW. 2018 Jun 8 [cited 11 September 2018]. Available from: <https://www.dpi.nsw.gov.au/about-us/media-centre/releases/2018/drought-continues-to-bite-across-nsw>.
57. Liu H, Chen M, Zhu F, Harrison PJ. Effect of diatom silica content on copepod grazing, growth and reproduction. *Front Microbiol.* 2016; 3(89).
58. Pohnert G. Diatom/copepod interactions in plankton: The indirect chemical defense of unicellular algae. *ChemBioChem.* 2005; 6(6): 946–59. <https://doi.org/10.1002/cbic.200400348> PMID: 15883976