

# Phosphorus scarcity and desiccation stress increase the occurrence of dominant taxa in wetland benthic primary producer communities

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Abstract A few dominant species of plants often disproportionately contribute to primary production; however, dominance has an underappreciated influence on ecosystem processes and functioning. Cascading impacts of dominant species have been documented in ecosystems undergoing eutrophication, but competitive exclusion may also influence dominance structures when limiting nutrients become scarce (i.e., in lakes experiencing oligotrophication) or with exposure to stressors to which few species are adapted (i.e., desiccation stress in wetlands). To predict impacts of widespread changes in nutrients and hydrology on dominance structures in aquatic ecosystems, we need quantitative assessments of dominance of important primary producers, including algae and cyanobacteria, which can regulate other structural and functional properties of ecosystems. We used a highly spatiotemporally resolved (7 years, 165 sites) dataset from the abundant microbial mats of the Florida Everglades to assess how and why the degree of dominance and

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the identity of dominant taxa vary across nutrient and desiccation gradients. Using algal counts and the dimensions of algal units (cells, coenobia, colonies, and filaments), we measured dominance as relative biovolume. As hypothesized, the relative biovolume of dominant taxa increased and the number of taxa comprising 95% of the biovolume decreased with lower concentrations of limiting nutrient in the mats (phosphorus; P) and higher desiccation stress. Algal taxa that regulate the structural integrity of mats, such as the filamentous, calcium carbonate precipitating cyanobacterium Scytonema sp., strongly influenced these patterns through their tolerance of P scarcity and desiccation. Our indicators and approach can be used to test whether dominance of microscopic primary producers, and other organisms, increases with nutrient scarcity and desiccation stress in other aquatic ecosystems.

Keywords Dominance - Phosphorus scarcity - Desiccation stress · Algae · Cyanobacteria · Benthic systems - Wetlands

# Introduction

Diverse communities tend to be more resilient to environmental changes than less diverse ones via different ecological mechanisms operating at multiple scales, such as redundancy among different species performing the same functions (Oliver et al. [2015\)](#page-17-0). In low diversity ecosystems, rare species may not be

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sufficiently numerous to compensate for losses of dominant ones (Flöder et al. [2010](#page-16-0)). Dominant taxa (in biomass or abundance terms) often play an important and overlooked resilience function in many ecosystems undergoing considerable biodiversity loss (Hillebrand et al. [2008](#page-17-0)). Species that best compete for scarce limiting nutrients may dominate, or monopolize, community biomass, and thus primary production, therefore influencing species interactions and ecosystem functions (Grman et al. [2010](#page-17-0)). Dominant taxa that not only dominate biomass, but create, modify, and maintain habitats for other species, and contribute to nutrient cycling are called ecosystem engineers (Jones et al. [1994\)](#page-17-0); these are crucial for ecological status assessment in terrestrial (e.g., McCullough Hennessy et al. [2016\)](#page-17-0) and aquatic ecosystems (e.g., Vu et al. [2017\)](#page-18-0). The most commonly studied taxa in this context include plants (e.g., shrubs; Gilad et al. [2007\)](#page-16-0) and animals (e.g., beavers: Wright et al. [2002](#page-18-0); and crabs: Vu et al. [2017](#page-18-0)); here we investigate microscopic primary producers acting as ecosystem engineers, a less covered topic. Dominance is usually measured as relative abundance or biomass of single taxa (population-level) or groups of species (community-level). Biomass better reflects resource use and partitioning among competing species than abundance (Guo and Rundel [1997\)](#page-17-0); for example, a pool of species can be considered dominant when their cumulative (community-level) relative biomass is higher than a certain threshold (e.g.,  $>50\%$ ; Downing et al. [2001](#page-16-0)). Thus, here we focus on dominance as expressed by relative biomass estimates of algae to reveal underlying drivers of patterns that are meaningful for broader ecosystem functions.

Benthic microbial mats (also called periphyton) are three-dimensional ecosystems in which algae exchange nutrients with both water and substrate (Passy [2008\)](#page-17-0). In these systems, algae substantially contribute to primary production and carbon cycling, provide food, habitat, and oxygen to consumers (Hagerthey et al.  $2011$ ), and are sensitive to water diversion and eutrophication (Gaiser [2009;](#page-16-0) Gaiser et al. [2006\)](#page-16-0). In oligotrophic and desiccation-prone systems, a number of algae and cyanobacteria species have adaptive traits that allow them to dominate primary production. Some filamentous cyanobacteria cope with low P concentrations and/or desiccation by enzymatically hydrolyzing phosphate from organic solutes (Coleman [1992\)](#page-16-0) and by secreting extracellular polysaccharides (EPS) to store nutrients and water (Hagerthey et al. [2011](#page-17-0)), respectively. Moreover, in proximity of cyanobacteria heterotrophic bacteria can cope with low P by producing phosphatase (Sharma et al. [2005\)](#page-18-0). Although nutrient fertilization tends to increase dominance by homogenizing available resources to various organisms in many ecosystems (Hillebrand et al. [2008\)](#page-17-0), nutrient reduction/oligotrophication can also increase dominance by taxa with adaptive traits. One or a few algae may dominate biomass; for example, the diatom Didymosphenia geminata forms blooms in benthic systems with low concentrations of limiting P (Bothwell et al. [2014\)](#page-16-0). In some cyanobacteria, pigments protect cells from dehydration and high UV radiation that may, for example, cause the aggregation of macromolecules that can disintegrate organelles (Karsten and Holzinger [2014\)](#page-17-0). Here we investigate dominance by algal taxa adapted to low nutrient levels and dry conditions in an oligotrophic ecosystem subject to P enrichment and desiccation stress (Gaiser et al. [2011\)](#page-16-0).

In shallow wetlands, nutrient and water availability are key factors determining phytoplankton and phytobenthic community structure changes (Huszar and Reynolds [1997;](#page-17-0) Gaiser et al. [2011](#page-16-0); Brasil et al. [2016](#page-16-0); Marazzi et al. [2017\)](#page-17-0). Hydrology and P drive algal richness in subtropical wetlands, such as the Okavango Delta and the Everglades (Marazzi et al. [2017\)](#page-17-0). Wetlands are facing multiple environmental stresses including habitat loss, eutrophication (Junk [2002](#page-17-0)), and droughts causing carbon loss (Fenner and Freeman [2011\)](#page-16-0). On the other hand, nutrient removal via drainage (in particular of the less replenishable P) has caused oligotrophication in wetlands and downstream areas (Stockner et al. [2000\)](#page-18-0). Both eutrophication and oligotrophication cause community shifts, respectively, toward algae better adapted to high P (Smith [2003](#page-18-0)) and to scarce P (Horn [2003](#page-17-0)) in various aquatic ecosystems. Therefore, testing how nutrient and hydrology influence algal dominance can help predict how communities of primary producers may change under different oligotrophication/eutrophication (Duarte [2009](#page-16-0)) and drying/wetting scenarios (Obeysekera et al. [2015](#page-17-0); Brasil et al. [2016\)](#page-16-0). We use a globally important and threatened wetland, the Florida Everglades, as a model of the interplay between key environmental stressors and algal dominance in benthic mats, fundamental systems for primary production, nutrient cycling, and other ecosystem functions (e.g., dissolved oxygen production and food provision to consumers; Hagerthey et al. [2011;](#page-17-0) Trexler and Loftus [2016\)](#page-18-0). Our indicators and approach can be applied to other organisms and ecosystems facing nutrient scarcity and drying trends to support predictions of the occurrence of dominant species (including key ecosystem engineers), with changing resource and water availability.

To predict whether and how primary producer communities will cope with future nutrient and water scarcity, we need to understand how and why their dominance varies and identify which adaptive traits allow certain taxa to become dominant (Hillebrand et al. [2008](#page-17-0)). To this end we need spatiotemporally resolved and extensive data series that include environmental covariates across multiple locations and sampling periods (Horn [2003\)](#page-17-0). Long-term research studies in the Everglades provide such data on algal community composition, biomass, and environmental conditions (Gaiser et al. [2011](#page-16-0)). Using recent data, we assess whether and how algal dominance changes with limiting nutrient concentrations and hydrology in this wetland. To describe and explain patterns of algal dominance in the Everglades, we assessed how much of the total biovolume is represented by the top 5 taxa, i.e., top 5 biovolume (%) and the number of taxa comprising 95% of the biovolume, i.e., N taxa  $= 95\%$  biovolume. We also used evenness as a complementary measure of dominance, as communities with lower evenness are characterized by taxa with less equal abundance/ biomass (Magurran and McGill [2011\)](#page-17-0). Our hypotheses are that in Everglades habitats where P limitation and desiccation stress are more severe, (1) the top five taxa with the highest biovolume comprise a higher share of the total biovolume; (2) fewer taxa dominate the total biovolume, resulting in lower evenness; and (3) adaptive traits allow these taxa to dominate biovolume.

#### Methods

## Sampling protocol

To describe and explain how the degree and structure of dominance in benthic algal mats vary across resource and stress gradients in the Everglades, we analyzed an extensive dataset originated by the Comprehensive Everglades Restoration Plan Monitoring and Assessment Plan (CERP-MAP). To investigate how water chemistry (in particular nutrients) and hydrology affect benthic algae during the wet season, we collected 947 algal samples from 165 sites (Fig. [1](#page-3-0)). We conducted this sampling each year from 2005 to 2011 between September and December in these representative regions (approximately north to south): Lake Okeechobee; the Arthur R. Marshall Loxahatchee National Wildlife Refuge; Pal Mar; Holey Land Wildlife Management Area; Water Conservation Area 2 and 3; Pennsuco; Lostman's Creek; the 'Oligohaline' area; Southern Marl Prairie; Shark River Slough; and Taylor Slough (Marazzi et al. [2017\)](#page-17-0). Using generalized random-tessellation stratification (Stevens and Olsen [2004\)](#page-18-0), we sampled sites drawn from a pool of GPS coordinates (Philippi [2005\)](#page-18-0) in representative locations (800 m  $\times$  800 m principal sampling units, PSUs). Within a  $1-m<sup>3</sup>$  enclosure open at top and bottom (Gunderson [1994](#page-17-0)), we removed all benthic microbial mats from the surface of the water and any substrate and placed them into a 2000-mL perforated graduated cylinder. To comprehensively assess all benthic algae, if no mats were present (in  $\sim$ 8% of the samples), we took flocculent detritus from the benthos (Pisani et al. [2011\)](#page-18-0). A 120-mL homogenized subsample was taken from the total harvested material, placed into weighed plastic bags, and transferred to a laboratory freezer (Jordan et al. [1997\)](#page-17-0). We measured water depth (cm) with a metal ruler and mat TP concentrations ( $\mu$ g g<sup>-1</sup> dry weight) by means of colorimetry after dry combustion (Solorzano and Sharp [1980](#page-18-0); EPA [1983](#page-16-0)). We used water-level approximations from the Everglades Depth Estimation Network (EDEN; [http://sofia.usgs.](http://sofia.usgs.gov/eden) [gov/eden\)](http://sofia.usgs.gov/eden) to evaluate desiccation stress by estimating the days since last dry (depth  $\leq$ 5 cm; DSLD) and the annual number of dry days (ANDD) for each sampling site. Mat TP concentrations are a better proxy of potential primary productivity than concentrations of P in the water; the latter are often below detection limits, while algae rapidly uptake P from oligotrophic waters (Gaiser et al. [2004\)](#page-16-0). Lower TP indicates limiting nutrient scarcity, while shorter hydroperiod, lower depth and DLSD, and higher ANDD correspond to higher desiccation stress for algae and cyanobacteria (Gaiser [2009\)](#page-16-0).

<span id="page-3-0"></span>Fig. 1 Map of the sampling sites in the Florida Everglades. LKO Lake Okeechobee, LOX Loxahatchee, Out\_ENP out of Everglades National Park, WCA Water Conservation Area, ENP Everglades National Park



#### Algal analyses

To analyze algal community structure, we used modified methods to prepare wet mounts for algal counts (APHA et al. [2005\)](#page-16-0) from frozen benthic mat samples (Stevenson and Bahls [1999](#page-18-0)). We thawed and homogenized  $0.1-1$  mL samples with a hand blender; when  $CaCO<sub>3</sub>$  crystals were present on the slide, we added a solution of 0.01 mL 10% HCl and then dried the cover slip; otherwise, we dried the samples directly. Finally, we inverted the samples onto microscope slides in 0.020 mL of water and sealed them by ringing the glass with fingernail polish (Stevenson et al. [2002\)](#page-18-0). We counted at least 500 algal units (i.e., cells, coenobia, colonies, and filaments of at least 100 lm length) in each sample at

 $1000\times$  magnification using a compound light microscope. We identified the algae observed to the lowest possible taxonomic unit (genus, species, or variety) using Prescott [\(1962](#page-18-0)), Komárek and Hindak ([1975](#page-17-0)), and Komárek and Anagnostidis [\(1986](#page-17-0), [1989](#page-17-0), [1999](#page-17-0)). We calculated algal biovolume by measuring  $\sim$  20 cells covering the size range of each taxon and applying geometric formulas representative of the different shapes of the taxa observed (Hillebrand et al. [1999\)](#page-17-0); we then estimated relative biovolume  $(\% )$  for each taxon.

## Data analyses

To investigate changes in cumulative (communitylevel) dominance of algae in the Everglades, we used three indicators, calculated from count and biovolume data: (1) the relative biovolume  $(\%)$  of the top 5 taxa hereafter top 5 biovolume  $(\%)$ ; (2) the number of taxa comprising 95% of the biovolume—hereafter N  $taxa = 95\%$  biovolume; and (3) the identity and frequency of the single most dominant taxa (i.e., those with the highest relative biovolume). In addition, we calculated Shannon Evenness, a complement of dominance widely used in diversity studies (Magurran and McGill [2011\)](#page-17-0), to identify its key drivers and verify that, as expected, evenness decreased when dominance increased. To identify statistically significant differences of mean algal dominance between sampling sites, we divided P and hydrology gradients into quartiles (Table 1). Our TP classes are rather similar to those identified by Gaiser et al. ([2006\)](#page-16-0) (high TP:  $>172.8 \mu g g^{-1}$ , see Table 1, as compared to 250  $\mu$ g g<sup>-1</sup> in Gaiser et al. [2006](#page-16-0)). To assess the influence of limiting nutrient levels and desiccation on the life-history strategies of dominant taxa, we classified the 26 taxa most dominant in at least one site according to six morphological and functional traits (Table [2](#page-5-0)): coccoid, epiphytic, unicellular motile, filamentous producing scytonemin, filamentous not producing scytonemin, and unicellular non-motile (Wehr et al. [2015\)](#page-18-0).

To illustrate the relationship between environmental stressors, we graphed TP concentrations in the benthic mats in relation to desiccation stress (i.e., DSLD and ANDD) by quartiles in scatterplots in  $SPSS^{\otimes}$  (version 20). To identify statistically significant differences in algal dominance across P and hydrology gradients, we used parametric tests (oneway ANOVA and Tukey's HSD) and nonparametric ones (Kruskal–Wallis and Mann–Whitney U) when the assumptions of normality and homogeneity of variance were / were not met (assessed via the Kolmogorov–Smirnov and Levene's tests), respectively. We graphed dominance changes across P and desiccation gradients via box plots using the package ggplot2 in R (RStudio Team [2015\)](#page-18-0). To quantify and compare the influence of P scarcity and hydrology/ desiccation stress on algal dominance, we ran linear, quadratic, and cubic univariate models. By means of multiple linear regressions, we assessed the influence of alternative hydrological variables—water depth, hydroperiod, days since last dry (DSLD), and annual number of dry days (ANDD), and of the water chemistry variables mat TP, water pH, and conductivity on the response variables top 5 biovolume (%), N taxa = 95% biovolume, and Shannon Evenness. To avoid multicollinearity, we evaluated the correlations between hydrological and water chemistry predictors and the variance inflation factors (VIF) prior to fitting the models with the candidate explanatory variables (Zuur et al. [2007\)](#page-18-0); we used the recommended maximum VIF value of 10 to retain the models (Marquardt [1970;](#page-17-0) Hair et al. [1995](#page-17-0)). We chose the best univariate and multiple regression models (Tables [4](#page-10-0), [5](#page-11-0)) on the basis of the highest  $R_{\text{adj}}^2$ , while also checking the Akaike information criterion for model selection (AIC; Johnson and Omland [2004](#page-17-0)). For the multiple linear regressions, we visually assessed whether the distributions of the residuals of our twelve models were stationary (i.e., the residuals oscillated above and below 0), in relation to the hydrological predictor defining each model (see Table [5](#page-11-0)). We conducted all the regression analyses in R (RStudio Team [2015](#page-18-0)). To assess the contribution of adaptive traits to the dominance of specific taxa, we analyzed their trait occurrence frequency in relation to P and desiccation gradients.

## Results

Mat TP was significantly lower at Everglades sites that, prior to sampling, had been wet for a shorter time  $(i.e., <154$  days since last dry; DSLD) and/or had been dry for a longer period on an annual basis (i.e., ANDD

Table 1 Measured values of the explanatory variables grouped by quartiles

$(1)$ Very low	$(2)$ Low	$(3)$ High	$(4)$ Very high
< 95.8	95.8–172.8	172.8–352.8	>352.8
$0 - 116$	116–154	154–538	>538
$<$ 12	$12 - 40$	$40 - 105$	>105

Mat TP total phosphorus, DSLD days since last dry, ANDD annual number of dry days

Trait	Taxa
Coccoid	Aphanothece sp.; Chroococcidiopsis sp.; Gloeothece sp.; Gomphosphaeria sp. (cyanobacteria)
Epiphytic	Stipitococcus sp. (Xanthophyta)
Filamentous—no scytonemin	Fischerella sp.; Johannesbaptistia sp.; Lyngbya sp.; Schizothrix sp. (cyanobacteria); Mougeotia; Oedogonium sp.; Unknown green filament (Chlorophyta)
Unicellular motile	Amphora sulcata; Brachysira brebissonii; B. serians; Diadesmis confervacea; Encyonema ftsp02; Mastogloia lanceolata; M. calcarea; Nitzschia serpentiraphe (Bacillariophyta)
Filamentous— scytonemin	Scytonema sp. (cyanobacteria)
Unicellular non-motile	Cosmarium calcareum; Pleurotaenium minutum var. attenuatum; P. minutum var. excavatum; Staurastrum longebrachiatum; Triploceras sp. (Chlorophyta)

<span id="page-5-0"></span>Table 2 Classification of dominant taxa by morphological traits and ability to produce the scytonemin pigment

 $>$ 36 days) than in sites that had been wet for a longer time and/or had been dry for a shorter period (Fig. [2](#page-6-0)). Our indicators were about 5–50% higher/lower where mat TP was lower and desiccation stress higher (Figs. [3](#page-7-0), [4\)](#page-8-0). Top 5 biovolume  $(\%)$  was higher where mat TP was lower (Fig. [3](#page-7-0)A), DSLD lower (Fig. [3B](#page-7-0)), and ANDD higher (Fig. [3C](#page-7-0)). N taxa =  $95\%$  biovolume and Shannon Evenness were lower (i.e., higher dominance) with lower mat TP (Figs. [4](#page-8-0)A, [5A](#page-9-0)) and with lower DSLD (Figs. [4](#page-8-0)B, [5](#page-9-0)B), and higher ANDD (i.e., higher desiccation stress; Figs. [4](#page-8-0)C, [5](#page-9-0)C). All the hydrological variables considered (depth, hydroperiod, DSLD, ANDD) were highly correlated with one another (Table [3](#page-10-0)). The response variables were also highly correlated (Table [3](#page-10-0)); where top 5 biovolume (%) was higher, N taxa =  $95\%$  biovolume and Shannon Evenness were lower, and vice versa.

On a univariate basis, according to highest  $R<sub>adj</sub><sup>2</sup>$ values, often corresponding to the lowest AIC values, mat TP explained, on average, 32% of the variance of top 5 biovolume (%), N taxa =  $95\%$  biovolume, and Shannon Evenness, as compared to 20% for pH, 17% for hydrological variables, and 13% for conductivity (Table [4](#page-10-0)). Apart from depth and pH, which best predicted our response variable via quadratic models, the other predictors mostly attained the best fit via cubic models (Table [4\)](#page-10-0). On a multivariate basis, due to the high correlation coefficients between hydrological predictors (mostly  $>0.8$ , as compared to  $< 0.4$  between these and the other variables; see Table [3](#page-10-0)), we created competing models to explain the three response variables, each including TP, conductivity, and pH, and each hydrological predictor in separate models (Table [5](#page-11-0)). We did not observe any multicollinearity, as all the VIF values of our models were \10 (Table S1). According to the models  $R<sub>adj</sub><sup>2</sup>$  values, often corresponding to the lowest Akaike information criterion (AIC) values, among the hydrological variables used, ANDD best predicted top 5 biovolume  $(\%)$ , N taxa = 95% biovolume, and Shannon Evenness. Models with ANDD had higher explained variance (53%) than those with hydroperiod (47%), DSLD (42%), and depth (29%) (Table [5\)](#page-11-0). The residuals of our twelve models were stationary (Fig. S1).

When mean site-specific data are considered, the filamentous cyanobacterium Scytonema sp. showed a stable degree of dominance across the mat TP gradient (Fig. [6](#page-13-0)a); by contrast, it was more frequently dominant where a shorter time had passed since the last dry conditions (i.e., lower DSLD; see 'producing Scytonemin' group in Fig. [6b](#page-13-0)), and where annual dry periods were longer (i.e., higher ANDD; Fig. [6c](#page-13-0)). Overall, coccoid, epiphytic, motile, and unicellular non-motile taxa were less dominant than filamentous ones (producing scytonemin or not; Fig. [6\)](#page-13-0). Coccoid taxa were slightly more dominant in low P and desiccation-prone sites, and motile taxa were slightly more dominant with intermediate mat TP concentrations and DSLD (Fig. [6a](#page-13-0), b). When all the dominance data by sample are considered, a total of 26 taxa (9 cyanobacteria, 8 Bacillariophyta, 8 Chlorophyta, and 1 Xanthophyta) were the single most dominant ones in at least one site (4 coccoid, 1 epiphytic, 7 filamentous not producing scytonemin, 1 filamentous producing scytonemin, 8 motile, and 5 unicellular taxa; Tables 2, [6\)](#page-14-0). Over 84% of these dominant taxa were filamentous and coccoid cyanobacteria and filamentous taxa not producing scytonemin (e.g., Schizothrix sp. and a few

<span id="page-6-0"></span>

Fig. 2 Relationship between mat TP concentrations and: A days since last dry (DSLD): Kruskal–Wallis ( $p < 0.05$ ):  $\chi^2$ : 19.088; Mann–Whitney  $U (p < 0.05)$ ; **B** annual number of dry days (ANDD): one-way ANOVA  $(p < 0.05)$ :  $F = 5.096$ ; Tukey's HSD ( $p < 0.05$ ). Statistically significant differences are indicated by different letters

Chlorophyta; Table [6\)](#page-14-0). Scytonema sp. was more frequently dominant with lower mat TP (63% in quartiles 1 and 2), whereas filamentous taxa not producing scytonemin, such as Mougeotia and Schizothrix, were more dominant with higher TP and lower ANDD (Table [6](#page-14-0)). Aphanothece sp., the most frequently dominant coccoid cyanobacterium, was more frequently dominant with higher mat TP (Table [6](#page-14-0)). Unicellular Chlorophyta and Bacillariophyta were more dominant with higher TP; unicellular Chlorophyta were also more dominant with lower ANDD (Table [6\)](#page-14-0).

# Discussion

In the Everglades, mean algal dominance increased with oligotrophy and desiccation stress, as evidenced by the increase of top 5 biovolume (%) and the decrease of N taxa  $= 95\%$  biovolume and Shannon Evenness with lower TP and drier conditions (Figs. [3,](#page-7-0) [4,](#page-8-0) [5;](#page-9-0) Tables [4,](#page-10-0) [5](#page-11-0)). This means that changing nutrient loads and water availability can substantially reshape algal communities over space and time and that environmental conditions favoring dominant native taxa need to be preserved to ultimately enhance ecosystem functions, such as the provision of habitat for consumers.

## Algal dominance increases with oligotrophy

The proportion of biovolume accounted for by dominant taxa, as measured by top 5 biovolume (%), increased with P scarcity and was  $>60\%$  in all the sites (Fig. [3](#page-7-0)). Changes of mean algal dominance across space significantly increased with oligotrophy, i.e., lower mat TP concentrations (Tables [4](#page-10-0), [5\)](#page-11-0). In other benthic systems, reduced P has been also shown to increase dominance by diatoms and/or cyanobacteria that tolerate oligotrophy (Horn [2003](#page-17-0); Bothwell et al. [2014\)](#page-16-0). In the case of Didymosphenia geminata, P additions have even been suggested to limit its blooms (James et al. [2015](#page-17-0)). In the Everglades, freshwater drainage, canalization, and impoundment for agricultural and urban development purposes historically caused P to increase downstream of the Everglades Agricultural Area (Fig. [1\)](#page-3-0). This has caused substantial impacts on periphyton mats (Gaiser et al. [2006](#page-16-0)), but other areas have preserved their ecological character, such as the marl prairie further south. Scenarios of increasing freshwater flow and thus potentially higher P load to the Everglades marshes are likely to favor heterotrophic bacteria

<span id="page-7-0"></span>

Fig. 3 Top 5 biovolume  $(\%)$  in relation to quartiles of A mat TP (one-way ANOVA, O.W.A.:  $F = 90.63$ ;  $p = 2 \times 10^{-16}$ \*\*\*; Tukey's HSD:  $p < 0.05$ ); **B** days since last dry (DSLD; O.W.A.:  $F = 23.27$ ;  $p = 3.53 \times 10^{-6}$ \*\*\*); and **C** annual number of dry

with abundant fatty acids and more edible green algae and diatoms (which contain more lipids than cyanobacteria); thus, consumers may benefit from a

days (ANDD; O.W.A.:  $F = 8.640; p < 0.001;$  Tukey's HSD:  $p$  < 0.05). Statistically significant differences are indicated by different letters; the y axis does not start at 0

higher nutritional quality of periphyton (Bornhoeft [2016](#page-16-0); Naja et al. [2017](#page-17-0)). However, enforcing stringent P load and concentration criteria while restoring

<span id="page-8-0"></span>

Fig. 4 N taxa  $= 95\%$  biovolume in relation to quartiles of A mat TP (O.W.A.:  $F = 122.8; p = 2 \times 10^{-16}$ \*\*\*; Tukey's HSD test:  $p < 0.05$ ); **B** days since last dry (DSLD; one-way ANOVA, O.W.A.:  $F = 19.06$ ;  $p = 2.4 \times 10^{-05***}$ ); C annual

freshwater flow to the Everglades (Naja et al. [2017\)](#page-17-0) remains crucial for the preservation of cohesive periphyton mats with native algal species adapted to low P (Gaiser [2009](#page-16-0); Gaiser et al. [2011](#page-16-0)).

number of dry days (ANDD; O.W.A.:  $F = 3.178$ ;  $p < 0.026$ ; Tukey's HSD:  $p < 0.05$ ). Statistically significant differences are indicated by different letters

Looking at the occurrence of the dominant taxa, we found that filamentous cyanobacteria were more dominant than eukaryotic algae in oligotrophic sites (see Table [6;](#page-14-0) Fig. [6\)](#page-13-0) likely due to their ability to store

<span id="page-9-0"></span>

Fig. 5 Shannon Evenness in relation to quartiles of A mat TP (O.W.A.:  $F = 14.07$ ;  $p = 3.25 \times 10^{-8}$ \*\*\*; Tukey's HSD test:  $p < 0.05$ ); **B** days since last dry (DSLD; O.W.A.:  $F = 7.135$ ;  $p = 1.69 \times 10^{-4}$ \*\*\*); C annual number of dry days (ANDD;

P intracellularly by using phosphatases, enzymes that hydrolyze phosphate from organic solutes (Carey et al. [2012\)](#page-16-0). These cyanobacteria are known to be abundant in oligotrophic sites with higher pH in the Everglades

O.W.A.:  $F = 7.079$ ;  $p = 1.88 \times 10^{-4}$ \*\*\*). Statistically significant differences are indicated by different letters; the y axis does not start at 0

(Gaiser et al. [2011](#page-16-0)). With increasing P, periphyton mats break down due to heterotrophic bacteria rapidly taking up this nutrient from the mats and thus lowering the pH via  $CO<sub>2</sub>$  release; this in turn causes the

<span id="page-10-0"></span>Table 3 Correlation coefficients (Spearman) between all the measured variables

	Depth	Hydroperiod	<b>DSLD</b>	<b>ANDD</b>	pH	Conductivity	TP	
Explanatory versus explanatory variables								
Depth		$0.8305**$	$0.8284**$	$-0.7980**$	$-0.2134**$	$0.2098**$	$0.3528**$	
Hydroperiod		1	$0.9384**$	$-0.8726**$	$-0.3229**$	0.1495	$0.4306**$	
<b>DSLD</b>			1	$-0.8877**$	$-0.3292**$	$0.1932*$	$0.3942**$	
<b>ANDD</b>				1	$0.3346**$	$-0.1209$	$-0.3930**$	
pH					1	$0.1628**$	$-0.5983**$	
Conductivity						1	$-0.0939$	
TP							1	
Response versus explanatory variables								
Top 5 biovolume $(\%)$	$-0.4221**$	$-0.5295**$	$-0.5103**$	$0.5371**$	$0.3769**$	$0.2752**$	$-0.5808**$	
N taxa = $95\%$ biovolume	$0.4131**$	$0.5131**$	$0.4939**$	$-0.5226**$	$-0.4228**$	$-0.2788**$	$0.6442**$	
Shannon Evenness	$0.2487**$	$0.4239**$	$0.3916**$	$-0.3742**$	$-0.3045**$	$-0.2300**$	$0.4544**$	
		Top 5 biovolume $(\%)$		N taxa = $95\%$ biovolume			<b>Shannon Evenness</b>	
Response versus response variables								
Top 5 biovolume $(\%)$				$-0.9244**$		$-0.8329**$		
N taxa = $95\%$ biovolume							$0.8013**$	
<b>Shannon Evenness</b>						1		

DSLD days since last dry, ANDD annual number of dry days, TP total phosphorus

In bold high correlation values: \*  $p < 0.01$ ; \*\*  $p < 0.05$ 

Table 4 Parameters of univariate linear regression predictors of top 5 biovolume (%), N taxa = 95% biovolume, and Shannon Evenness

Predictors (best model <sup>a</sup> ) Top 5 biovolume $(\%)$					N taxa = $95\%$ biovolume	<b>Shannon Evenness</b>				
[Regression parameters] $[\beta]$		[P]	$[R_{\text{adi}}^2]$	$[\beta]$	[P]	$[R_{\text{adi}}^2]$	$[\beta]$	[P]	$[R_{\text{adj}}^2]$	
Depth $(Q, Q, Q)$		$-0.2980$ 2.34 $\times$ 10 <sup>-5</sup>	0.109	0.120	$4.41 \times 10^{-5}$ 0.103			0.0019 0.0034	0.055	
Hydroperiod $(C, L, C)$		$0.0453 \quad 1.31 \times 10^{-9}$	0.227		$0.0133 \quad 1.96 \times 10^{-8} \quad 0.192 \quad 0.0032 \quad 5.12 \times 10^{-7} \quad 0.186$					
$DSLD$ $(C, C, C)$		$-0.0196$ 2.36 $\times$ 10 <sup>-8</sup>	0.219	0.0075	$6.21 \times 10^{-7}$ 0.181 0.0002 1.92 $\times 10^{-6}$				0.169	
ANDD $(C, Q, C)$	0.0933	$3.27 \times 10^{-8}$	0.226		$-0.0191$ 6.05 $\times$ 10 <sup>-8</sup> 0.205 $-0.0008$ 9.55 $\times$ 10 <sup>-5</sup> 0.126					
pH (Q, Q, Q)	148.05	$1.74 \times 10^{-10}$	0.228		$-51.098$ $1.81 \times 10^{-12}$ 0.269 $-0.9784$ 8.30 $\times 10^{-5}$ 0.097					
Conductivity $(C, C, C)$		$0.0235$ 6.06 $\times$ 10 <sup>-6</sup>	0.135		$-0.0095$ $1.02 \times 10^{-6}$ 0.154 $-0.0002$ 0.0004				0.089	
TP(C, C, C)	$-0.0277$	$3.68 \times 10^{-16}$	0.350		0.0128 2.20 $\times$ 10 <sup>-16</sup> 0.401 0.0002 2.01 $\times$ 10 <sup>-8</sup> 0.193					

For each response variable, bold indicates the predictor with the highest  $R_{\text{adj}}^2$  and underlined are the predictors with the second highest  $R^2_{\mathrm{adj}}$ 

n.s. not significant,  $\beta$  first-order regression coefficient, P p value

<sup>a</sup> First column: in brackets are indicated the models with the highest  $R_{\text{adj}}^2$ ; *L* linear, *Q* quadratic, *C* = cubic

dissolution of calcium carbonate (Gottlieb et al. [2005](#page-17-0); Gaiser et al. [2011](#page-16-0), [2015\)](#page-16-0). Scytonema sp. was more frequently the taxon with the highest relative biovolume in oligotrophic sites (quartiles 1 and 2) than in mesotrophic and eutrophic sites (quartiles 3 and 4; Table [6](#page-14-0)). This and other cyanobacteria, such as Schizothrix calcicola, thrive in low P areas and are considered ecosystem engineers; they form compact

<span id="page-11-0"></span>Table 5 Results of multiple linear regression models explaining dominance in relation to hydrology predictors (i.e., annual number of dry days, ANDD; hydroperiod, days since last dry, DSLD, and depth), pH, conductivity, and mat TP;  $p < 0.05$ ;

*n.s.* not significant  $\beta$  = first-order regression coefficient;  $P = p$  value. In bold the most significant models and predictors and the relative results



Table 5 continued



layers of filaments and secrete extracellular polysaccharide (EPS) where P and water are stored (Swift and Nicholas [1987;](#page-18-0) Hagerthey et al. [2011\)](#page-17-0). Epiphytic green algae, such as Mougeotia, Oedogonium, and a few unicellular desmids, were more frequently dominant with higher  $TP$  (Table  $6$ ), consistent with established knowledge of their ability to successfully compete for P in oligotrophic–mesotrophic conditions (Reynolds [2006](#page-18-0)). In these deeper sites with higher TP, for example in Water Conservation Areas (Fig. [1](#page-3-0)), pH tends to be lower, which favors desmids (Table  $6$ ), as previously observed in the Everglades (see, e.g., Bellinger et al. [2010](#page-16-0)). A less clear trend is shown by the coccoid cyanobacterium Aphanothece, which was the taxon with the highest relative biovolume more frequently where TP was higher (Table [6\)](#page-14-0), whereas it is usually widespread in this wetland (Gleason and Spackman [1974](#page-17-0)).

#### Algal dominance increases with desiccation stress

We demonstrated that higher dominance, especially of cyanobacteria, was caused by desiccation stress, alongside mat TP, in a globally important wetland (Tables [4](#page-10-0), [5\)](#page-11-0). Drier conditions (i.e., higher ANDD, shorter hydroperiod, and lower depth and DSLD), alongside higher pH, significantly increased top 5 biovolume (%) and reduced N taxa =  $95\%$  biovolume, and Shannon Evenness (Tables [4,](#page-10-0) [5](#page-11-0)). This means that, in the Everglades, the combined stress of nutrient and water scarcity is best tolerated by a few dominant benthic taxa, especially cyanobacteria (Table [6](#page-14-0)). Cyanobacteria were also found to dominate in other wetlands with receding water levels, for example in various shallow lakes in South America (Huszar and Reynolds [1997;](#page-17-0) Kosten et al. [2012;](#page-17-0) Brasil et al. [2016](#page-16-0)).

Chase [\(2007](#page-16-0)) observed similar trends in experimental ponds where green algae, tolerant to desiccation, dominated following drought, while more diverse algal (and plant) assemblages were dominant in the absence of drought. In this study, algal dominance was also predicted by increasing water pH (Tables [4,](#page-10-0) [5\)](#page-11-0) that causes calcium carbonate to dissolve from limestone and to be re-precipitated by algae that use bicarbonates, rather than carbon dioxide (Hagerthey et al. [2011\)](#page-17-0). Although high pH might favor cyanobacteria dominance per se (Caraco and Miller [1998](#page-16-0)), in our dataset pH was positively correlated with ANDD (Table [3](#page-10-0)) so that higher desiccation stress and pH jointly increase algal dominance (Tables [4,](#page-10-0) [5\)](#page-11-0). The dominance of filamentous cyanobacteria with higher pH is not surprising; contrary to eukaryotic algae, these organisms favor low concentrations of metals, such as manganese, which become less soluble as pH increases (Patrick et al. [1969](#page-17-0)).

Cyanobacteria, such as Scytonema sp., dominated this wetland's prairies and marshes (Fig. [6;](#page-13-0) see the 'filamentous producing scytonemin' group), consistent with previous observations (Gleason and Spackman [1974;](#page-17-0) Swift and Nicholas [1987](#page-18-0); Gaiser et al. [2011\)](#page-16-0). Although we did not measure scytonemin, the capability to produce this pigment that protects photosystem II (Potts [1994\)](#page-18-0) likely contributes to the dominance of Scytonema sp. in 63% of our samples (Table [6](#page-14-0)). The mean frequency of the most dominant traits by site was more variable across the desiccation gradient (Fig. [6](#page-13-0)b, c) than the P gradient (Fig. [6](#page-13-0)a) indicating that the production of scytonemin may be the most important adaptation in this wetland. Further research aimed to measure this pigment is however needed to confirm this interpretation of our findings. Previous work concluded that desiccation contributes <span id="page-13-0"></span>Fig. 6 Mean frequency of the most abundant algal traits by site (%) in relation to quartiles of a mat TP; b days since last dry (DSLD); c annual number of dry days (ANDD). No significant differences  $(p<0.05)$ 



<span id="page-14-0"></span>Table 6 Frequency of the single most dominant taxa (highest relative biovolume by sample) and their key trait in relation to mat TP, days since last dry (DSLD), and annual number of dry days (ANDD) by quartiles

Traits/phylum	Top 1 taxa	% by TP quartile			% by DSLD quartile				% by ANDD quartile				N	
		$\mathbf{1}$	$\overline{c}$	3	$\overline{4}$	$\mathbf{1}$	$\overline{c}$	3	$\overline{4}$	$\,1\,$	$\overline{c}$	3	$\overline{4}$	samples <sup>a</sup>
Coccoid		6	14	29	56	8	28	52	$\mathfrak{Z}$	29	14	21		22.
Cyanobacteria	Aphanothece sp.	6	6	17	72	33	11	6	11	17	6	33		18
Cyanobacteria	Chroococcidiopsis sp.			100				100						$\mathbf{1}$
Cyanobacteria	Gomphosphaeria sp.				100			100		100				$\mathbf{1}$
Cyanobacteria	Gloeothece sp.		50		50		100				50	50		$\overline{c}$
Epiphytic														
Xanthophyta	Stipitococcus sp.	$\mathbf{1}$	5	$\overline{4}$	6	19	13	25	19	25	13	19	19	16
Filamentous-no scytonemin		$\overline{4}$	23	20	53	$\mathbf{1}$	36	8	18	22	20	6	8	260
Cyanobacteria	<i>Fischerella</i> sp.		25	25	50	25		13	38	38		13	25	8
Cyanobacteria	Johannesbaptistia sp.				100		100							1
Cyanobacteria	Lyngbya sp.		100				100				100			$\mathbf{1}$
Chlorophyta	Mougeotia sp.	11	9	36	44	27	13	22	22	40	13	13	18	55
Chlorophyta	Oedogonium sp.			50	50		17		33	33	17			6
Cyanobacteria	Schizothrix sp.	15	30	30	25	14	19	23	36	43	11	16	14	188
Chlorophyta	Unknown green filament				100									$\mathbf{1}$
Filamentous- scytonemin														
Cyanobacteria	Scytonema sp.	34	27	22	17	25	25	24	19	33	8	17	29	597
Unicellular motile			3	3	94	20	3	16	$\overline{7}$	23		20	3	14
Bacillariophyta	Amphora sulcata				100			100				100		$\mathbf{1}$
Bacillariophyta	Brachysira brebissonii				100									1
Bacillariophyta	Brachysira serians				100	100				100				1
Bacillariophyta	Diadesmis confervacea				100									1
Bacillariophyta	Encyonema ftsp02				100	33			33	33		33		3
Bacillariophyta	Mastogloia calcarea		25	25	50	25	25	25	25	50		25	25	4
Bacillariophyta	Mastogloia lanceolata				100									$\overline{c}$
Bacillariophyta	Nitzschia serpentiraphe				100									$\mathbf{1}$
Unicellular non- motile			5	20	77	27	10	33	15	60	11	7	$\tau$	32
Chlorophyta	Cosmarium calcareum				100	100				100				$\mathbf{1}$
Chlorophyta	Staurastrum longebrachiatum				100			100		100				$\mathbf{1}$
Chlorophyta	Pleurotaenium minutum var. attenuatum			50	50		25	50		25	25		25	4
Chlorophyta	Pleurotaenium minutum var. excavatum		10	50	50	18	27	14	27	41	14	18	9	20
Chlorophyta	Triploceras sp.		17		83	17			50	33	17	17		6

<sup>a</sup> Total number of samples in which each taxon was the most dominant one

to algal community structure changes in the Everglades (Gleason and Spackman [1974](#page-17-0); Swift and Nicholas [1987](#page-18-0); Gaiser et al. [2011\)](#page-16-0) and other periodically dry ecosystems, such as savannahs (Williams et al. [2014\)](#page-18-0). The ability to store water and nutrients in EPS (Hagerthey et al. [2011\)](#page-17-0) allows several taxa to dominate at numerous sites: filamentous (e.g., Schizothrix sp.; 188 sites) and coccoid cyanobacteria (e.g., Aphanothece sp.; 18 sites), as well as filamentous green algae (e.g., Mougeotia; 55 sites; Table [6](#page-14-0)). Future environmental scenarios indicate that warmer temperatures, caused by global warming, may compound with the possibility of more frequent and/or longer droughts (Obeysekera et al. [2015\)](#page-17-0) in changing species distribution and dominance patterns across ecosystems. As these adaptive traits have evolved over very long periods of time to counter nutrient scarcity and/or drying, these likely confer resilience to benthic primary producer communities. Experimental studies testing which adaptive traits best support the viability and productivity of dominant algae are therefore needed to better understand how benthic mats will react to ongoing environmental changes.

Using the Everglades as a model ecosystem to predict dominance patterns

In the interior of the Everglades, P tends to be scarce and desiccation stress high, especially in shallow sites that are frequently dry (Gaiser et al. [2011](#page-16-0)); in this wetland we found that algal dominance is high (Figs. [3](#page-7-0), [4\)](#page-8-0) and taxon richness is low, compared to other subtropical wetlands, such as the more pristine Okavango Delta (Marazzi et al. [2017](#page-17-0)). Diverse phytoplankton communities in a shallow lake in New Zealand were observed to have enough species to compensate for the loss of dominant taxa impacted by salt intrusion (Flöder et al. [2010\)](#page-16-0). By contrast, rare species in the Everglades are likely not sufficiently numerous to compensate for the performance loss of dominant ones with possibly even drier conditions in the future (Obeysekera et al. [2015\)](#page-17-0). However, dominant/ecosystem engineer cyanobacteria tolerate desiccation, high temperatures, and UV radiation in aquatic ecosystems (Gaiser et al. [2011](#page-16-0); Karsten and Holzinger [2014](#page-17-0); Brasil et al. [2016](#page-16-0)). In lakes and estuaries that are becoming warmer, more polluted, and/or more saline, the dominance of microscopic primary producers is also likely to increase (Carey et al. [2012;](#page-16-0) Kosten et al. [2012;](#page-17-0) Paerl and Otten [2013](#page-17-0)). In biological soil crusts limited by water scarcity, early succession cyanobacteria are becoming more dominant than late succession primary producers, such as mosses and lichens (Ferrenberg et al. [2015](#page-16-0)). Dominance was also observed to increase in tundra shrub

under experimental warming (Walker et al. [2006](#page-18-0)). Further research using our indicators could evaluate whether nutrient scarcity (or excess) and desiccation stress may be increasing (decreasing) the occurrence of dominant taxa with adaptive traits in prairie wetlands (Johnson et al. [2010](#page-17-0)), lakes (Paerl and Otten [2013\)](#page-17-0), floodplains (Finlayson [2013](#page-16-0); Brasil et al. [2016](#page-16-0)), and peatlands (Fenner and Freeman [2011\)](#page-16-0).

Dominance patterns of other organisms in the Everglades and elsewhere can be interpreted with the approach we eveloped. For example, primary production in this wetland's oligotrophic marshes is dominated by sawgrass (Cladium jamaicense) and spike rush (Eleocharis cellulosa), while muhly grass (Muhlenbergia filipes) prevails in its marl prairies (Gunderson [1994](#page-17-0)). These species have been subject to the encroachment of other plants tolerating high soil P, notably cattail (Typha sp.; Osborne et al. [2014](#page-17-0)) as well as the advancement of mangroves due to higher salinity caused by sea-level rise (Teh et al. [2008](#page-18-0)). In other ecosystems facing environmental threats, algae and/or plants also dominate benthic mats (Fenner and Freeman [2011;](#page-16-0) Johnson et al. [2010](#page-17-0); Muster et al. [2015\)](#page-17-0). The impacts of nutrient load changes and drought in these landscapes may change the dominance structure of various primary producers, a topic that warrants further research.

## **Conclusions**

We demonstrated that phosphorus scarcity and desiccation stress increase the occurrence of dominant taxa and their prevalence in biovolume terms in benthic communities in the Everglades, a globally important wetland. More oligotrophic and drier habitats host communities with fewer taxa monopolizing higher shares of algal biovolume than habitats with higher P and deeper waters. Our indicators and approach for analyzing dominance can support predictions of community structure changes in other ecosystems subject to oligotrophic and dry conditions. This can in turn help devise conservation decisions; depending on the level of anthropogenic impacts, ecosystem management requires a focus on biodiversity and/or ecosystem services (see, e.g., Schneiders et al. [2012](#page-18-0)). On the one hand, maintaining/restoring the natural flood pulse in subtropical wetlands may enhance diversity-mediated resilience <span id="page-16-0"></span>to environmental changes (Marazzi et al. [2017](#page-17-0)). However, dominant taxa with adaptive traits are often key for ecosystem functioning and provide resilience to environmental changes such as eutrophication (Grman et al. [2010\)](#page-17-0), oligotrophication (Horn [2003](#page-17-0)), and droughts (Brasil et al. 2016). Therefore, both species diversity and dominance should be assessed to better understand how and why communities change. In aquatic ecosystems subject to nutrient limitation and droughts, conservation should not only protect threatened and charismatic species, but also preserve shallow habitats hosting crucial microscopic primary producers. As some of the most dominant taxa perform an ecosystem engineer role (e.g., Scytonema sp.), this will likely benefit organisms with evident cultural, recreational, and economic value (e.g., fish and birds) that rely on healthy microbial mats for food, nutrients, habitat, and/or oxygen.

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