RESEARCH ARTICLE

Compositional uniqueness and species contribution to beta diversity of aquatic macrophyte metacommunities from coastal wetlands

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Abstract

The partitioning of overall beta diversity into local contributions (LCBD; compositional uniqueness) and species contributions (SCBD) has enhanced the understanding of the organization of metacommunities. Here, we evaluated LCBD and SCBD of aquatic macrophyte metacommunities from 29 subtropical coastal wetlands, covering an extension of 640 km, in Southern Brazil. Furthermore, we assessed the environmental uniqueness, considering both the physical and chemical variables of water in wetlands, as well as climatic variables. We assessed the environmental and spatial correlates of LCBD and the environmental correlates of SCBD. We expected that (i) communities with greater compositional uniqueness would be found in environmentally more unique wetlands, (ii) the compositional uniqueness would also be related to climatic variables that determine the hydrological changes in wetlands, and (iii) the contribution of emergent species to beta diversity would be lower than of foating and submerged species. The compositional uniqueness did not present a clear spatial structure, being positively related to uniqueness in water chemistry and negatively to the mean air temperature during the driest quarter. The species contribution to beta diversity was higher for foating species than for emergent ones. Moreover, SCBD correlated to climatic variables and presented a positive relationship with site occupation, suggesting that more frequent species in terms of site occurrence contribute most to beta diversity. Our results show the importance of local environmental and broader climatic predictors in determining the compositional uniqueness of macrophyte communities and species contributions to overall beta diversity in the coastal wetlands of Southern Brazil.

Keywords LCBD · SCBD · Beta diversity · Wetland vegetation · Hydrophytes

Introduction

Untangling the variation in species composition among sites in a geographic area (beta diversity; Whittaker [1960](#page-9-0); Anderson et al. [2011\)](#page-7-0) into its components is fundamental to understand how biodiversity varies in space (Li et al. [2020](#page-8-0); Panja et al. [2022;](#page-9-1) García-Girón et al. [2023\)](#page-8-1) and time (Legendre and Gauthier [2014;](#page-8-2) Winegardner et al. [2017;](#page-9-2) Legendre and Condit [2019](#page-8-3)). In this context, partitioning overall beta diversity into the contribution of each local community (local contribution to beta diversity, LCBD) and of each species (species contribution to beta diversity, SCBD) (sensu

Legendre and De Cáceres [2013](#page-8-4)) may shed light on the distinct factors afecting the organization of metacommunities (Tonkin et al. [2016;](#page-9-3) Schneck et al. [2022\)](#page-9-4).

The contribution of each local community to beta diversity (LCBD) depends on its compositional uniqueness, that is, the degree of diferentiation in species composition in relation to the regional typical community composition (Legendre and De Cáceres [2013](#page-8-4)). More unique species compositions can be related either to unique environmental characteristics or to dispersal limitation owing to geographic distance among sites (Heino et al. [2017;](#page-8-5) Landeiro et al. [2018\)](#page-8-6). In freshwater ecosystems, compositional uniqueness was shown to be positively related to environmental uniqueness generated by stream physical characteristics for diatoms (Castro et al. [2019\)](#page-8-7), insects (Schneck et al. [2022\)](#page-9-4) and macrophytes (Bomfm et al. [2023\)](#page-8-8). However, this relationship between compositional and environmental uniqueness is not explicitly considered in most studies (e.g., Tonkin et al. [2016;](#page-9-3) Bomfm et al. [2023](#page-8-8); but see Heino et al. [2022](#page-8-9)).

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Moreover, most previous studies on freshwater systems have focused on evaluating local environmental correlates of compositional uniqueness (e.g., Heino and Grönroos [2017;](#page-8-10) Leão et al. [2020](#page-8-11)), so that the knowledge about the importance of regional-scale environmental gradients, such as climate, is scarce (Benito et al. [2020](#page-8-12); Panja et al. [2022](#page-9-1); Martínez-Román et al. [2023\)](#page-9-5).

Species that contribute the most to beta diversity (SCBD) within a region of interest are those that vary more or less than average among sites (Legendre and De Cáceres [2013](#page-8-4)). For freshwater communities, it has been shown that species with high SCBD have either intermediate (Szabó et al. [2019;](#page-9-6) Pozzobom et al. [2020\)](#page-9-7) or high occupancy (Vilmi et al. [2017a](#page-9-8)) and are regionally abundant (Vilmi et al. [2017a](#page-9-8); Szabó et al. [2019](#page-9-6)). However, an alternative approach to better understand why certain species or groups of species may contribute more than others to beta diversity would be to relate SCBD to species traits (Li et al. [2020;](#page-8-0) Schneck et al. [2022](#page-9-4)) or functional groups (Heino and Grönroos [2017](#page-8-10); Pozzobom et al. [2020](#page-9-7)) and environmental variables (Schneck et al. [2022](#page-9-4)). For example, in a study conducted in Brazilian foodplain lakes, functional groups of aquatic macrophytes partially explained SCBD (Pozzobom et al. [2020\)](#page-9-7).

Wetlands are functionally complex ecosystems characterized by fuctuations in water level, which determine their physical, chemical, and biological conditions (Junk et al. [2014](#page-8-13)). Despite harboring a signifcant portion of biodiversity, these ecosystems are among the most vulnerable in the world (Junk et al. [2014\)](#page-8-13), especially owing to the infuence of factors, such as climate change, urban development, pollution, and invasive species, highlighting the urgency of protection and conservation actions (Maltchik et al. [2004](#page-8-14)). In Southern Brazil, palustrine wetlands represent a large proportion of wetlands, approximately 90%, and they can vary from permanently flooded to never flooded, but remain saturated for long periods during the annual cycle (Maltchik et al. [2004](#page-8-14)). They include a variety of formations, such as marshes, shallow lakes, meanders, and foodplains infuenced by factors, such as precipitation, surface runoff, and groundwater discharge (Maltchik et al. [2004](#page-8-14)).

Aquatic macrophytes are a key component in wetlands (De Magalhaes et al. [2016\)](#page-8-15) and are characterized by a wide range of strategies that enables them to establish in distinct habitats (Santamaría [2002](#page-9-9); Lacoul and Freedman [2006](#page-8-16)). Some species can grow through the water surface, while others live foating or submerged in the water column (Chambers et al. [2008](#page-8-17); Murphy et al. 2019). Owing to such distinct architecture, the importance of local and regional environmental factors and spatial processes in determining the distribution of species (Alahuhta and Heino [2013;](#page-7-1) Gillard et al. [2020](#page-8-18)) difers among life forms (Schneider et al. [2018](#page-9-10); Trindade et al. [2018](#page-9-11); Garcia-Girón et al. [2023\)](#page-8-1). For example, in subtropical coastal wetlands, it has been shown that the distribution of foating and submerged species was mainly infuenced by water quality and spatial variables, respectively, while emergent species, characterized by a broader distribution, were infuenced by climatic variables (Trindade et al. [2018\)](#page-9-11). Moreover, it has been suggested that relating SCBD values to macrophyte life forms can improve our ability to detect species that contribute more to beta diversity (Pozzobom et al. [2020;](#page-9-7) Bomfm et al. [2023](#page-8-8)). Finally, identifying communities and species contributing the most to beta diversity would help understand key aspects of the organization of macrophyte metacommunities in wetlands.

We investigated the contribution of local communities and species to beta diversity of aquatic macrophytes in coastal wetlands, over *c*. 640 km in subtropical Brazil. We assessed the environmental and spatial correlates of LCBD and the environmental and biological correlates of SCBD. We expected that: (i) communities with greater compositional uniqueness would be found in environmentally more unique wetlands; (ii) given the large spatial scale of our study, compositional uniqueness would also be related to climatic variables that determine the hydrological changes in wetlands; and (iii) the contribution of emergent species to beta diversity would be lower than of foating and submerged species because the frst ones are less dependent on water quality and are more widely distributed.

Material and methods

Study area

We conducted the study in 29 wetlands at the coastal plain of Rio Grande do Sul State, between coordinates (29º16′14.96″ S and 49º37′15.08″ W) and (33º37′25.15″ S and 53º13′46.56″ W), South Brazil (Fig. [1](#page-2-0)). The coastal plain extends approximately 640 km, covering 22,740 km² of emerged lands and 14.260 km^2 of water surfaces, totaling 37,000 km² (Schwarzbold and Schäfer [1984\)](#page-9-12). Originating from the Cenozoic, the coastal plain expanded primarily during the Quaternary period through alluvial fans and barrier–lagoon depositional systems, forming large bodies of water such as the Patos lagoon and lakes Mirim and Mangueira (Barboza et al. [2009](#page-7-2)). Currently, the landscape of the coastal plain consists of estuaries and deltas, marine beaches, rivers and streams, savannas, palm groves, fooded felds, and forests (seasonal, temporary, or permanent), lakes and lagoons, and permanently or temporarily wetlands (known in southern Brazil as *banhados*) (Becker et al. [2007](#page-8-19)). The climate of the region is humid subtropical (Maluf [2000](#page-9-13)). Annual precipitation varies between 1000 and 1500 mm, and the average annual temperature ranges between 16 and 20 ˚C, with average temperatures between 22 and 26 ˚C in

Fig. 1 Study area showing the 29 wetlands sampled (green circles) in the coastal plain of Rio Grande do Sul State, Southern Brazil. The inset shows South America, with Brazil shown in green

the hottest months and between 10 and 15 ˚C in the coldest months (Nimer [1977](#page-9-14)).

To select the sampling sites, we chose areas with saturated soils or shallow waters, where vegetation is adapted to moist conditions and fooding, following the defnition of wetlands by Mitsch and Gosselink [\(2000\)](#page-9-15). On the basis of this criterion, we selected freshwater wetlands that allowed us to walk through their entire extent for sampling data. We checked all areas where it was possible to observe the surroundings to ensure they met the objectives of our study. We avoided large wetlands and those that did not have clearly defned border areas, which would be difficult to visually inspect; we also discarded wetlands clearly connected to other aquatic environments, as well as those near monocultures or other human activities. Despite being in a coastal plain, the sampled wetlands did not have any connection with the ocean and are characterized as freshwater (in situ measured salinity $=0$ in all 29 sampled wetlands). Additionally, we used geographic coordinates to ensure that the chosen areas represented the coastal plain extensively. The wetlands' area ranged from 0.19 to 5 hectares, with an average depth of 30 ± 10 cm. Each wetland was sampled once during the austral summer of 2016, a period characterized by low volume of rainfall. We used this dataset previously to evaluate the relative role of environmental and spatial factors on macrophyte species richness and assemblage composition (Trindade et al. [2018\)](#page-9-11).

Aquatic macrophytes

To determine the richness and composition of aquatic macrophyte assemblages, we conducted a thorough visual survey of the vegetation. This study took place during a period of low precipitation, which may infuence the size of wetland areas, thus facilitating our walk throughout each visited wetland area. The same researcher recorded the species in all sampled wetlands. The time spent searching for species varied among wetlands (from 60 to 90 min); always being interrupted after 20 min of walking without registering a new species. We identifed the species on the basis of specialized literature (Cordazzo and Seeliger [1995;](#page-8-20) Irgang and Gastal [1996](#page-8-21)), as well as collaboration with specialists. We registered 114 aquatic macrophytes species: 90 emergent, 14 foating (including free-foating and rooted foating-leaved species), and 10 submerged (including fxed submerged and free-foating submerged species); detailed information is available in Trindade et al. ([2018](#page-9-11)).

Local environmental variables

In each wetland, we used a multiparameter water quality meter (Horiba-U50) to measure the following environmental variables at fve random points: dissolved oxygen (DO; mg L^{-1}), pH, and electrical conductivity (COND; μ S cm⁻¹; Supplementary Material, Table [1\)](#page-3-0). We also collected three water samples for analyses of total phosphorus (TP; mg L^{-1} ; Valderrama [1981;](#page-9-16) Baumgarten and Rocha [1996](#page-8-22)) and total nitrogen (TN; mg L^{-1} ; Allen et al. [1974](#page-7-3)). We determined mean depth of the wet area (cm), using a graduated ruler at the same five points we measured the environmental variables. We recorded the altitude (m) and geographic coordinates

Table 1 Beta regression results on environmental uniqueness and climatic variables as predictors of the variation in compositional uniqueness (LCBD) of macrophytes in wetlands

	Estimate	Std. error	\overline{z}	P	Model pseudo R^2
(Intercept)	-3.341	0.028	-118.424		
LCEH _{Phys}	0.009	0.034	0.255	0.798	
$LCEH_{WC}$	0.100	0.026	3.872	< 0.001	
MTWeO	0.039	0.034	1.135	0.256	
MTDrO	-0.110	0.045	-2.420	0.016	
PS	0.064	0.038	1.683	0.092	
PCO	0.074	0.048	1.548		0.122 0.435

 $LCEH_{Phy} LCEH_{WC}$ local contribution to environmental heterogeneity resulting from wetland physical characteristics and from water chemistry, respectively, *MTWeQ* mean temperature of the wettest quarter, *MTDrQ* mean temperature of the driest quarter, *PS* precipitation seasonality, *PCQ* precipitation of the coldest quarter

P values \leq 0.05 are in bold

at the central point of each wetland and used Google Earth Pro and Quantum Gis (QGis 3.22 Essen) to obtain wetland area (ha).

Climatic variables

We used 12 bioclimatic variables at a spatial resolution of a 1 $km²$ grid originated from the combination of temperature and precipitation from the global dataset of Worldclim2 (Fick and Hijmans [2017\)](#page-8-23). For our purpose, we obtained the following data: annual mean temperature (AMT; mm), temperature seasonality (TS; standard deviation $\times 100$), maximum temperature of warmest month (MAXTW; °C), minimum temperature of coldest month (MINTC; ˚C), mean temperature of wettest quarter (MTWeQ; ˚C), mean temperature of driest quarter (MTDrQ; ˚C), annual precipitation (AP; mm), precipitation seasonality (PS; coefficient of variation), precipitation of wettest quarter (PWeQ; mm), precipitation of driest quarter (PDQ; mm), precipitation of warmest quarter (PWQ; mm) and precipitation of coldest quarter (PCQ; mm). These are the same bioclimatic variables selected by Trindade et al. ([2018](#page-9-11)) because of their importance for the organization of macrophyte communities. However, here we opted not to include annual evapotranspiration because the available database is based on the previous version of Worldclim (Hijmans et al. [2005\)](#page-8-24).

Data analyses

We calculated the total beta diversity (BD_{Total}) and partitioned it into the compositional uniqueness or local contribution (LCBD) and the species contribution to beta diversity (SCBD) following Legendre and De Cáceres ([2013](#page-8-4)). For these analyses, we used presence-absence data and the Hellinger distance. LCBD and SCBD vary between 0 and 1, so that values closer to 1 indicate local communities and species that contribute more to beta diversity (Legendre and De Cáceres [2013\)](#page-8-4).

We used the same approach to calculate local environmental uniqueness (LCEH or local contribution to environmental heterogeneity, as defned by Castro el al. 2019 and Schneck et al. [2022\)](#page-9-4). We used Euclidean distance on two subsets of standardized environmental variables to obtain metrics on the wetlands physical (LCEH_{Phy}; area, depth, and altitude) and water chemical uniqueness ($LCEH_{WC}$; dissolved oxygen, pH, electric conductivity, total nitrogen, and total phosphorus). To verify which variables contributed more to environmental uniqueness, we correlated the LCEH values with environmental variables using Pearson's correlation.

First, we used Pearson's correlation to evaluate how LCBD relates to species richness. Next, we used beta regression (Cribari-Neto and Zeiles 2010) to model the relationship between LCBD and six predictors (LCEH_{Phy}, LCEH $_{\text{WC}}$ and the climatic variables MTWeQ, MTDrQ, PS, and PCQ). This fnal model was defned after excluding the other eight climatic variables owing to multicollinearity (AMT, TS, MAXTW, MINTC, AP, PWeQ, PDQ and PWQ) using a variance infation factor (VIF) criterion lower than 3. Then, we analyzed the spatial autocorrelation in the model residuals using Moran's I correlograms. Residuals were spatially independent $(P > 0.05$, after Bonferroni's correction for multiple tests; Oden [1984](#page-9-17)), and thus we did not include spatial variables in the LCBD regression model. Finally, we used Moran's I correlograms to evaluate whether geographically closer wetlands showed more similar values of compositional uniqueness. The use of Moran's I based correlograms to test for spatial autocorrelation in the residuals of the regression model and in the response variable (LCBD) followed Zuur et al. [\(2010](#page-9-18)) and Heino et al. ([2017\)](#page-8-5).

For SCBD we used Pearson's correlation to explore how it relates to the occurrence of each species (the number of wetlands in which each species occurs). Following, we tested whether macrophyte life forms difer in their SCBD values and we used a beta regression with SCBD as the response variable and life form with three levels as the predictor. After that, we evaluated the pairwise comparisons through simultaneous tests and adjusted *P* values using the Holm correction. Finally, to advance our understanding on the speciesenvironment relationship for those species that contribute the most to beta diversity, we used the fourth-corner analysis (Dray and Legendre [2008;](#page-8-25) see Schneck et al. [2022](#page-9-4) for a similar approach). We used a matrix of sites and the six predictors, a second matrix of sites and species presenceabsence, and a vector of SCBD values. Signifcance of correlations were assessed through 5999 permutations using model 6 from Dray et al. [\(2014](#page-8-26)) and corrected for multiple

tests using the Holm correction. This analysis was repeated for the complete set of macrophyte species and separately for each life form.

We performed all analyses in R environment (R Core Team [2023\)](#page-9-19). We used package "adespatial" (Dray et al. [2020\)](#page-8-27) to calculate LCBD, SCBD, and LCEH, "pgirmess" (Giraudoux [2018\)](#page-8-28) for correlograms, "betareg" (Cribari-Neto and Zeileis [2010](#page-8-29)) for beta regressions, "multcomp" for pairwise comparisons (Hothorn et al. [2008\)](#page-8-30) and "ade4" (Dray and Dufour [2007\)](#page-8-31) for the fourth corner analysis.

Results

Total beta diversity of the macrophyte wetland communities was 0.65. Compositional uniqueness (LCBD) ranged from 0.023 to 0.056 (Fig. [2a](#page-4-0)) and no spatial structure was observed in LCBD values (Fig. [2b](#page-4-0); none distance class was significant; $P > 0.05$). We found a negative correlation between LCBD and species richness (*r*=−0.394; *P*=0.034; Fig. [3\)](#page-5-0). The regression model showed that compositional uniqueness was positively related to water chemistry uniqueness ($LCEH_{WC}$) and negatively related to the mean temperature of the driest quarter (MTDrQ) (model *pseudo* R^2 = 0.435; Table [1](#page-3-0)). Finally, LCEH_{WC} was positively correlated to total phosphorus and electrical conductivity $(r=0.73; r=0.82$, respectively; $P < 0.0001$).

The SCBD values ranged from 0.002 to 0.023 (0.009 ± 0.01) . Of the 114 registered species, 47 species (or 41% of the total) contributed more than the average to beta diversity (Fig. [4](#page-5-1)a). The three species that most contributed to beta diversity were *Schoenoplectus californicus* (C. A. Mey) Soják (SCBD = 0.023 ; occurrence = 18 sites), *Nymphoides humboldtiana* (Kunth) Kuntze (SCBD=0.021;

Fig. 2 Spatial variation in compositional uniqueness (LCBD) of macrophyte communities in the 29 sampled wetlands (a) and spatial autocorrelation analysis of LCBD (b). The size of the circles in plot a is proportional to the LCBD values

Fig. 3 Correlation between compositional uniqueness (LCBD) and species richness of macrophytes in the 29 sampled wetlands

occurrence=20), and *Cyperus esculentus* L. (SCBD=0.020; occurrence = 16) (Supplementary Material, Table [2](#page-6-0)). We found a positive correlation between SCBD values and species occurrence $(r=0.91; P<0.0001)$ (Fig. [4b](#page-5-1)). When comparing SCBD values among life forms, we found that foating species had higher SCBD than emergent species $(P=0.002)$; however, submerged species did not differ from floating or emergent ones $(P > 0.05$; Fig. [4c](#page-5-1)). According to the fourth corner analysis, SCBD was positively correlated with mean temperature of the driest quarter (MTDrQ) and with precipitation of the coldest quarter (PCQ) (Table [2](#page-6-0)). However, when testing the SCBD-environment separately for each life form, it was clear that this pattern was driven by emergent species (Table [2](#page-6-0)).

Discussion

Our fndings indicate that the compositional uniqueness of macrophyte metacommunities from the studied coastal wetlands, which span approximately 640 km, is related not to wetland location but to local environmental uniqueness and climatic characteristics. Specifcally, compositional uniqueness was positively related to local environmental uniqueness on the basis of water chemistry of the wetlands, and negatively related to the mean temperature of the driest quarter. Regarding the species contribution to beta diversity, the foating life form showed the highest SCBD values. Moreover, the species that most contributed to beta diversity were positively correlated with two climatic variables

Fig. 4 Species contribution to beta diversity (SCBD) of macrophytes and its rank distribution (a), correlation between SCBD and the species occurrence in the wetlands (b) and boxplots of SCBD for the three life forms (c). The colors in plots (a) and (b) correspond to the life form in plot (c). In boxplots, the median is represented by a heavy horizontal line, while the frst and third quartiles are depicted by the ends of the box. The whiskers indicate the minimum and maximum values

Table 2 Fourth-corner results on the relationship (Pearson correlation, *r*) between species contribution to beta diversity (SCBD) and environmental predictors for the total macrophyte communities and separately for each life form

Variable	Dataset	r	P
LCEH_{Phy}	All species	0.070	0.733
	Emergent	0.065	0.918
	Floating	0.029	> 0.999
	Submerged	0.094	> 0.999
$LCEH_{WC}$	All species	-0.107	0.306
	Emergent	-0.122	0.280
	Floating	0.149	0.747
	Submerged	0.098	> 0.999
MTWeO	All species	-0.144	0.163
	Emergent	-0.180	0.081
	Floating	0.100	> 0.999
	Submerged	0.011	> 0.999
MTDrQ	All species	0.194	0.021
	Emergent	0.214	0.032
	Floating	0.039	> 0.999
	Submerged	0.205	> 0.999
PS	All species	0.024	0.752
	Emergent	0.026	0.918
	Floating	-0.076	> 0.999
	Submerged	0.136	> 0.999
PCO	All species	0.193	0.027
	Emergent	0.219	0.028
	Floating	0.070	> 0.999
	Submerged	0.138	> 0.999

Significant *P* values (\leq 0.05) are in bold

(precipitation of the coldest quarter and mean temperature of the driest quarter) but did not relate to local environmental uniqueness. Despite being well known that water chemistry (Akasaka et al. [2010](#page-7-4); Alahuhta et al. [2013](#page-7-5)) and climate (Alahuhta et al. [2021](#page-7-6); García-Girón et al. [2023](#page-8-1)) infuence the diversity of aquatic plants, we showed here that the degree of uniqueness of macrophyte communities and the species contribution to overall beta diversity are also correlated with those variables.

Our results on LCBD showed that the most unique macrophyte communities had a reduced set of species and were found in wetlands characterized by low mean air temperature during the driest period of the year and that difered the most from the average local environmental characteristics. This indicates that regional climate and unique environmental water chemistry conditions played a role in selecting communities with a more unique species composition. Despite understanding beta diversity patterns is not an easy task, as numerous factors can infuence the distribution of species locally and regionally (Alahuhta et al. [2013](#page-7-5); Vilmi et al. [2017b;](#page-9-20) Gillard et al. [2020\)](#page-8-18) some previous studies have also found clear correlates of compositional uniqueness from freshwater communities (e.g., Leão et al. [2020](#page-8-11); Pozzobom et al. [2020](#page-9-7); Schneck et al. [2022\)](#page-9-4). Most of these studies focused on gradients of environmental degradation and found that more unique communities occurred in freshwater environments with reduced forest cover and more degraded conditions (e.g., diatoms and insects: Schneck et al. [2022](#page-9-4); aquatic macrophytes: Bomfm et al. [2023](#page-8-8)). Our results, even without a sampling design focused on a predefned environmental gradient, showed a positive correlation between environmental uniqueness based on water chemistry (LCEHwc) and total water phosphorus or electrical conductivity, variables that are generally associated with increased degradation of aquatic environments (Wu et al. [2020](#page-9-21); Liu et al. [2022](#page-8-32)). We thus suggest that the uniqueness in water chemistry conditions was driven by increased phosphorus concentrations and electrical conductivity, selecting a reduced set of species, and thus resulting in poorer and unique communities.

In addition to water chemistry, the increase in compositional uniqueness with the decrease in mean air temperature during the driest period of the year suggests the importance of wetland hydroperiod in selecting unique communities of aquatic plants. This is because hydroperiod is known to infuence species richness and community structure (Neif [1996;](#page-9-22) Mitsch and Gosselink [2000](#page-9-15); Maltchik et al. [2007](#page-9-23); Schneider et al. [2018](#page-9-10)). During the driest period, high temperatures can cause increased desiccation of wetlands, which can favor the emergent life-form (Trindade et al. [2018](#page-9-11)). This can lead to some species becoming more common in the overall coastal plain (see Fig. [4b](#page-5-1)) and, as a result, reduce LCBD.

The absence of a defned spatial structure in LCBD indicates that the spatial location of the wetlands in the landscape was not a key factor in determining the compositional uniqueness of the macrophyte communities. The lack of a spatial pattern may refect the high dispersal potential of aquatic plants (Viana et al. [2016](#page-9-24)), which, despite being considered passive dispersers, can reach long distances transported by diferent vectors (Soons [2006](#page-9-25); Soons et al. [2016\)](#page-9-26) such as water, wind, animals, and humans (Santamaría [2002;](#page-9-9) Lacoul and Freedman [2006;](#page-8-16) Chambers et al. [2008](#page-8-17); Lobato-de Magalhães et al. [2023](#page-8-33)). Therefore, our results indicate that niche processes exert more infuence than dispersal limitation on the compositional uniqueness of wetland macrophyte communities, at least at a regional scale as the one studied here (-640 km) .

The result that species with high SCBD values had intermediate to broad distributions was already shown for freshwater organisms (e.g., Pozzobom et al. [2020;](#page-9-7) Schneck et al. [2022\)](#page-9-4). It could be understood that species with higher SCBD values have less dispersal limitation and greater colonization capacity. Moreover, 41% of the total species had SCBD values above the global average SCBD, indicating that a large number of species contributed to the variation in community compositions along the coastal plain. This is consistent with the high value of global beta diversity we found, suggesting that compositional diferences between communities are mediated to a greater extent by the replacement of species with high SCBD than by species with restricted occurrences and low SCBD.

Floating species stood out as having the highest SCBD, similarly as found by Pozzobom et al. ([2020](#page-9-7)). This lifeform is strongly dependent on the presence of water and on the limnological characteristics of the wetland (Lacoul and Freedman [2006](#page-8-16)), being good competitors for resources (Henry-Silva et al. [2008\)](#page-8-34). Despite the potential dependence of foating species from the water column's nutrient concentrations, no correlation of SCBD with water chemistry uniqueness was observed either for foating or other lifeforms. However, the positive correlation between SCBD and climate variables indicates that the species that most contributed to beta diversity occurred at wetlands characterized by high mean air temperature and precipitation at specifc periods of the year. Temperature and precipitation can afect the species richness and composition of macrophyte communities (Lacoul and Freedman [2006](#page-8-16); Maltchik et al. [2007](#page-9-23)). For example, temperature can strongly infuence the distribution of emergent and foating species, as they remain exposed to the air, unlike submerged species that develop underwater in a more stable environment (Viana et al. [2016](#page-9-24)). High temperatures during the driest period can also afect the water balance of wetlands, causing the desiccation of environments and, consequently, infuencing both the richness and composition of communities (Maltchik et al. [2007](#page-9-23)). Moreover, precipitation can be one of the main limiting factors for the diversity of aquatic plants owing to fuctuations in water levels (Lacoul and Freedman [2006;](#page-8-16) Maltchik et al. [2007\)](#page-9-23). Intermittent wetlands, that remain only with saturated soil during a period of the year, limit the presence of submerged species and most foating species, favoring the colonization of emergent species, which can lead to a high contribution to beta diversity, as we found here.

Conclusion

When partitioning the total beta diversity of macrophyte communities, it was shown that local environmental factors and climate were the main correlates of compositional uniqueness. More unique communities had lower species richness and occurred in environmentally more unique sites with reduced mean air temperature at the driest period of the year. Furthermore, SCBD was related to climatic variables, and foating species stood out in their relative importance to overall beta diversity. These results enhance our understanding of the organization of macrophyte metacommunities in wetlands. Studies as the one here are essential to shed light on why certain local communities and some species contribute more to beta diversity than others, especially considering the increasing human impacts on wetlands around the world, mostly related to landscape modifcation for agriculture, livestock farming, and urbanization, in addition to ongoing climate change that may intensify the efects of these human activities.

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Data availability The data will be made available upon request to the corresponding author.

Declarations

Conflict of interest The authors declare no competing interests.

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