Check for updates

OPEN ACCESS

EDITED BY Roksana Majewska, North-West University, South Africa

REVIEWED BY Elianne Egge, Norwegian Institute for Water Research (NIVA), Norway Alberto G. Sáez, Complutense University of Madrid, Spain

*CORRESPONDENCE Se Hyeon Jang shjang@jnu.ac.kr

SPECIALTY SECTION

This article was submitted to Biogeography and Macroecology, a section of the journal Frontiers in Ecology and Evolution

RECEIVED 03 August 2022 ACCEPTED 29 November 2022 PUBLISHED 19 December 2022

CITATION

Jang SH (2022) Assessment of biodiversity, global distribution, and putative ecological niches of suessiacean dinoflagellates by DNA metabarcoding. *Front. Ecol. Evol.* 10:1010854. doi: 10.3389/fevo.2022.1010854

COPYRIGHT

© 2022 Jang. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.

Assessment of biodiversity, global distribution, and putative ecological niches of suessiacean dinoflagellates by DNA metabarcoding

Se Hyeon Jang*

Department of Oceanography, Chonnam National University, Gwangju, South Korea

Dinoflagellates in the family Suessiaceae, so-called suessiacean dinoflagellates, play diverse roles in aquatic ecosystems, being distributed from tropical to polar waters and from marine to freshwater habitats and encompassing free-living forms, symbionts, and parasites. Despite their importance due to the variety of ecological roles and biodiversity, very few studies have characterized small suessiacean species. Recent advances in molecular techniques could provide insights into the yet unexplored ecological roles they play in aquatic environments. Using a global DNA metabarcoding dataset, this study elucidated the hidden biodiversity, global distribution, and ecological characteristics of suessiacean dinoflagellates. The results of this study indicated that the family Suessiaceae was the sixth highest in terms of read count and the ninth highest in terms of amplicon sequence variant (ASV) richness from a total of 42 categorized dinoflagellate families, suggesting that their global abundance has been greatly underestimated. Furthermore, metabarcodes of suessiacean dinoflagellates were found to be cosmopolitan in distribution, although the ecological niche of each taxon was distinctly different within the group based on their latitudinal and vertical distribution patterns. Moreover, phylogenetic analysis discovered at least five new phylogenetic groups and three new individual species within the family. Collectively, the findings of this study highlight the significance of suessiacean dinoflagellates in global aquatic ecosystems and reveal the importance of big data obtained from environmental DNA in exploring the ecological functions of understudied species.

KEYWORDS

18S rRNA, amplicon sequencing, bloom, dinoflagellate, metagenomics, metaPR², Suessiaceae, metabarcoding

Introduction

Dinoflagellates (Alveolata: Dinophyceae) are among the most diverse and abundant groups of unicellular protists commonly found in aquatic environments. They are both evolutionarily and ecologically important since they form diverse lineages and have a variety of ecological roles such as primary producers, consumers, mutualists, and parasites; they can also cause harmful algal blooms (Coats, 1999; Jeong et al., 2010; Murray et al., 2016; Suggett et al., 2017; Jang et al., 2022). The dinoflagellate group currently consists of 18 orders, including Suessiales, and more than 2,000 extant species have so far been described (Gómez, 2012; Guiry and Guiry, 2022).

The family Suessiaceae belongs to the order Suessiales, which was first described by Fensome et al. (1993). The order Suessiales originally contained two families: Suessiaceae (fossil dinosporin cysts) and Symbiodiniaceae (extant symbionts). Although both families were merged into Suessiaceae by Moestrup et al. (2009a), they were later separated again along with the rapidly increasing biodiversity found within the groups (LaJeunesse et al., 2018). Since the first report of an extant species in the family Suessiaceae in 1999, numerous extant species in the group have been discovered and described in aquatic environments around the world (e.g., Montresor et al., 1999; Moestrup et al., 2009a,b; Jang et al., 2017b; Sampedro et al., 2022). Suessiacean species have been known to take various life forms including typical free-living cells and parasitic and symbiotic cells, thereby playing a variety of complex ecological roles in aquatic ecosystems (Levy et al., 2007; Siano et al., 2010; Gómez, 2012; Jang et al., 2017a). Although they all belong to the same phylogenetic clade, suessiacean species are found in marine and freshwater ecosystems at all latitudes because of their highly diversified ecophysiological characteristics (Montresor et al., 1999; Takahashi et al., 2015; Sampedro et al., 2022). There have been several records of blooms that were caused by members of this family and/or presumably suessiacean species based on morphological observations (e.g., Stoecker et al., 2000; Moestrup et al., 2009a; Moreira-González et al., 2021). However, understanding of these phenomena has been difficult due to the small size of the culprits (i.e., generally 7-15 µm in length) and the lack of effective species identification methods (Kang et al., 2019).

With the advent of both electron microscopy and genetic validation methods in recent decades, a sophisticated taxonomic classification and identification system has been established for the members of this family (Moestrup et al., 2009a). Moreover, with the growing popularity of molecular techniques (e.g., DNA metabarcoding, which allows simultaneous identification of many taxa within the environmental samples through DNA barcoding), the prevalence and dominance of suessiacean dinoflagellates within diverse protistan assemblages is gradually being revealed (Smith et al., 2017; Kellogg et al., 2019; Liu et al., 2020; Salmaso et al., 2020). The number of published environmental sequencing datasets has rapidly increased in recent years. In the past, such datasets existed primarily in an unprocessed state and thus were not easily accessible. However, the recent creation of metaPR², a

platform containing large, standardized datasets of 18S environmental rRNA sequences for protist groups, has dramatically improved data accessibility (Vaulot et al., 2022). This platform combines samples obtained from small-scale expeditions and standardizes methodological differences (e.g., bioinformatic workflows), thereby enabling meaningful data comparison on a global scale.

The objective of the current study was to provide insights into the hidden biodiversity, global distribution, and putative ecological niches of suessiacean dinoflagellates using a DNA metabarcoding dataset. The obtained results contributed to the better understanding of the ecological importance of the suessiacean group and further reveal the ecological niches these organisms occupy within aquatic ecosystems worldwide.

Materials and methods

Defining taxonomic groups within suessiacean dinoflagellates

Nine genera (Ansanella, Asulcocephalium, Biecheleria, Biecheleriopsis, Leiocephalium, Pelagodinium, Piscinoodinium, Polarella, and Yihiella) have so far been assigned to the family Suessiaceae based on both morphology and molecular phylogeny (Table 1). In this study, all amplicon sequence variants (ASVs)which are single DNA sequences recovered from a highthroughput marker-gene data analysis (Callahan et al., 2017)belonging to the family Suessiaceae were initially categorized at the genus level before further analyses were conducted. This is because many suessiacean species are belong to monospecific genera. Moreover, in some genera within the Suessiaceae group, the 18S rRNA gene does not have sufficient resolution (Jang et al., 2017b; Raho et al., 2018; Jang et al., 2022). Due to the above, the data were classified as "Ansanella, Asulcocephalium, Biecheleria, Biecheleriopsis, Leiocephalium, Pelagodinium, Piscinoodinium, Polarella, and Yihiella," and sequences that did not match these genera but belonged to the Suessiaceae family were categorized as "Unidentified." The ASVs that had initially been incorrectly named "Protodinium," were integrated into the "Biecheleriopsis" category according to the current taxonomic classification system (Takahashi et al., 2014; Jang et al., 2015). To date, no 18S gene sequence has been reported for true Protodinium (Lohmann) Kofoid & Swezy, although its ultrastructure had been investigated by Dodge (1974). Nevertheless, phylogenetic analysis was performed on all ASVs belonging to the "Protodinium" category, thereby confirming that all the ASVs belonged to the Biecheleriopsis clade (Supplementary Figure S1).

Dataset selection and processing

All of the Dinophyceae metabarcoding datasets gathered from worldwide sampling projects were obtained from the

	Taxon	Cell length (mean, µm)	Trophic mode	Life form	Presence of pusule	Presence of cyst	Habitat of isolates	Temperature	Salinity	Bloom- forming record	Refs
1	Ansanella granifera	10–15 (12.6)	Mixo	FL	0	0	M, Estuarine/coastal	NA	NA	0	a
2	Ansanella catalana	9.6–15.5 (12.5)	Photo	FL	0	0	M, Coastal	NA	NA	NA	b
3	Ansanella natalensis	9.7–14.2 (12.3)	Photo	FL	NA	Х	M, Coastal/tidal pool	NA	NA	0	с
4	Asulcocephalium miricentonis	10-16 (13)	Photo	FL	NA	0	Freshwater	NA	NA	NA	d
5	Aureodinium pigmentosum	10	Photo	FL	Х	0	M, Coastal	NA	NA	NA	e
6	Biecheleria pseudopalustris	27-30	Photo	FL	NA	0	Freshwater	NA	NA	0	f
7	Biecheleria baltica	17-35 (26.9)	Photo	FL	0	0	M, Brackish	0-6	3-30	0	g
8	Biecheleria halophila	10-27	Photo	FL	NA	0	M, Brackish/hypersaline	5-30	Hypersaline to brackish	NA	h
9	Biecheleria cincta	9–15 (11.1)	Mixo	FL	NA	0	M, Coastal	NA	NA	NA	i
10	Biecheleria brevisulcata	10.5–18 (13.9)	Photo	FL	0	0	M, Coastal	NA	NA	NA	j
11	Biecheleria tirezensis	9–15	Photo	FL	NA	0	Hypersaline inland pond	5-25	2-56	NA	k
12	Biecheleriopsis adriatica	12.5–15 (13.1)	Photo	FL	0	0	M, Coastal	NA	NA	0	1
13	Leiocephalium pseudosanguineum	28-42 (33.7)	Photo	FL	NA	0	Freshwater	NA	NA	NA	d
14	Pelagodinium bei	8.8-11.4 (10)	Photo	Sym	Х	NA	M, Coastal	NA	NA	NA	m
15	Piscinoodinium sp.	NA	Hetero	Par	0		Freshwater	NA	NA	O, Fish-kill	n
16	Piscinoodinium pillulare	62–162 (102.7)	Photo	Par	NA		Freshwater	NA	NA	O, Fish-kill	0
17	Polarella glacialis	10–15 (10.9)	Photo	FL	Х	0	M, Sea ice	NA	NA	0	р
18	Protodinium simplex	7-9	Photo	FL	0	NA	M, Coastal	NA	NA	NA	q
19	Prosoaulax lacustris	8-14	Mixo	FL	0	0	Freshwater	NA	NA	NA	r
20	Prosoaulax multiplex	8-10	Mixo	FL	0	NA	Freshwater	NA	NA	NA	r
21	Prosoaulax viridis	12-14	Photo	FL	0	NA	Freshwater	NA	NA	NA	r
22	Yihiella yeosuensis	7.9-10.6 (9.6)	Mixo	FL	0	0	M, Coastal	10-25 and <30	NA	NA	s

TABLE 1 Comparison of the taxonomic and ecophysiological characteristics and records of extant species presumably belonging the family Suessiaceae.

Trophic mode: Photo, phototroph; Mixo, mixotroph; Hetero, heterotroph. Life form: FL, free-living form; Sym, symbiont; Par, parasite. Habitat: M, marine. NA, not available. a, Jeong et al. (2014); Lee et al. (2014); Moreira-González et al. (2021); b, Sampedro et al. (2022); c, Dawut et al. (2018); d, Takahashi et al. (2015); e, Dodge (1967); f, Moestrup et al. (2009a); g, Kremp et al. (2005); h, Biecheler (1952); Moestrup et al. (2009a); I, Siano et al. (2011); j, Takahashi et al. (2014); k, Raho et al. (2018); l, Moestrup et al. (2009); Benico et al. (2019); m, Siano et al. (2010); n, Levy et al. (2007); o, Lom and Schubert (1983), Martins et al. (2001); p, Montresor et al. (1999); Stoecker et al. (2000); q, Dodge (1974); r, Calado and Moestrup (2005); s, Jang et al. (2017a,b); Jang and Jeong (2020); Kang et al. (2020). Taxa names in bold indicate that the taxonomic classification has been verified by both morphological and molecular phylogenetic analysis. Temperature is the tested temperature range at which species showed positive growth.

newly created metaPR² v.1.0.3 database,¹ which is a database of 18S rRNA metabarcodes that have been reprocessed with a pipeline based on the dada2 R package (Callahan et al., 2016). Taxonomic classifications were assigned using the Protist Ribosomal Reference database (PR²; Guillou et al., 2012). The detailed bioinformatic workflow is described by Vaulot et al. (2022).

For the current analysis, 38 datasets including 3,284 samples collected from oceanic, coastal, and freshwater lakes and rivers (terrestrial ecosystems were excluded) were investigated out of 41 datasets available from the metaPR² v.1.0.3 database. The data analyzed in this study are summarized in Supplementary Table S1. Both the V4 and V9 regions of the 18S ribosomal sequences containing at least 100 total reads per ASV were selected for the analysis (Supplementary Figure S2). The total read number per sample was normalized to 100 so that the value displayed in the different panels corresponded to the percentage of total protist reads (i.e., the number of reads for each ASV in a given sample was divided by the total number of reads in the sample and then multiplied by 100). The sample types included in the analysis were water, ice, epibiota, and sediment, and the data were retrieved without a specific screen for cell size fractions. Taxa selection was performed according to the classification criterion of the metaPR² database: "Alveolata" for Supergroup, "Dinoflagellata" for Division, "Dinophyceae" for Class, "Suessiales" for Order, and "Suessiaceae" for Family. The physical and chemical environmental conditions during sampling and other available metadata associated with samples were obtained from the metaPR² website and are summarized in Supplementary Table S2. For further statistical verification, the read distributions of different genera associated with various factors (i.e., water temperature, salinity, latitude, and depth) were compared using Chi-squared homogeneity tests of contingency tables, which use observed vs. expected values (generated according to standard formulas) to calculate the Chi-squared statistics (Sokal and Rohlf, 1987).

Multiple sequence alignment and phylogenetic analysis of 18S rRNA genes

18S rRNA sequences belonging to the family Suessiaceae were downloaded from the PR² database to construct a phylogenetic tree. The database includes sequences of strains in which taxonomic identification was verified along with numerous environmental sequences. Only sequences of the 18S rRNA region that were longer than 800 bp were selected from the database, while sequences from new species that had not been registered in the database (e.g., *Ansanella natalensis* and *A. catalana*) were added manually. Additionally, five sequences belonging to a different family but within order Suessiales were selected as an outgroup. A total of 234 sequences were aligned

using the ClustalW algorithm implemented in MEGA v.11 (Tamura et al., 2021), of which 146 were uncultured environmental sequences while the other 88 were from cultured strains. The final alignment contained 1,680 aligned nucleotide positions of 18S rRNA gene.

The aligned dataset was used to construct a phylogenetic tree *via* the maximum-likelihood (ML) statistical method. The dataset was tested for the best-fitting substitution model in MEGA v.11 (Tamura et al., 2021), with the model indicated by the Akaike Information Criterion (AIC) as the best-fitting one (the TN93 + G model) being chosen (Tamura et al., 2021). The tree was visualized and edited using iTOL v.6 (Letunic and Bork, 2021).

Results and discussion

Taxonomic composition and relative abundance based on metabarcoding data

Most of the ASVs were taxonomically assigned to one of the 41 taxa at the family level, with the remaining sequences assigned to the "Unidentified" category (Figure 1A). The family Gymnodiniaceae contained the highest read abundances in the Dinophyceae metabarcoding dataset, which was consistent with previous findings, as Gymnodiniaceae is one of the most common families worldwide, both in terms of frequency of occurrence and abundance (Kudela and Gobler, 2012; Thessen et al., 2012; Kodama et al., 2021). Of the 42 family groups of dinoflagellates, Suessiaceae was the sixth highest in terms of read abundance and highest in terms of ASV the ninth richness (Supplementary Table S3). The amount of DNA in dinoflagellates is known to be directly correlated with cell size (LaJeunesse et al., 2005; Murray et al., 2016; Liu et al., 2021). Although suessiacean species are among the smallest cells in the dinoflagellate group, the high read abundances observed in this study suggest that their abundance in nature may have been heavily underestimated.

In the metabarcoding datasets of the family Suessiaceae, the highest read abundances were found for *Biecheleria* and *Biecheleriopsis* (=*Protodinium*; Figure 1B). Although relatively recently Moestrup et al. (2009a,b) re-established the two genera based on both ultrastructure and phylogenetic relationships, some species in those genera have been reported as *Gymnodinium* for approximately half a century, with several records of blooms (Biecheler, 1952; Moestrup et al., 2009a).

When compared with the high read abundance in the genus *Polarella*, ASV richness was surprisingly low, suggesting that *Polarella* might have evolved to dominate certain environments instead of increasing species diversity to survive in multiple environments (Figure 1B). In contrast, the genus *Pelagodinium* had a higher ASV richness and lower read abundance, which may have resulted from symbiosis and diverse genetic pools being created through relationships with its host organisms (Spero, 1987; Siano et al., 2010). Additionally, the large number of both

¹ https://shiny.metapr2.org



reads and ASVs in the "Unidentified" category suggests that the biodiversity of the family Suessiaceae remains largely unexplored. A further analysis of 20 ASVs belonging to the "Unidentified" category showed that only two of them contributed greatly to the total read abundance those ASVs belonged to phylogenetically unknown groups (Supplementary Figure S3).

Global distribution and habitat

Members of the family Suessiaceae have been identified in both marine and freshwater environments (Table 1). According to the metabarcoding analysis results, reads of all genera in Suessiaceae were found in marine environmental samples, whereas the majority of reads collected in freshwater ecosystems were limited to *Asulcocephalium*, *Biecheleria*, and *Biecheleriopsis* (Figures 2A,B). The two monospecific genera *Asulcocephalium* and *Leiocephalium* were established based on isolates from freshwater samples, while the genus *Biecheleria* has been reported to contain both marine and freshwater species (Moestrup et al., 2009a; Takahashi et al., 2015). However, the discovery of large numbers of reads belonging to *Biecheleriopsis* in freshwater samples suggests a hidden ecophysiological diversity of the species within this genus.

A few dinoflagellate groups that have colonised freshwater habitats play a key role in understanding the evolution of microbial lineages (Logares et al., 2007). Despite the overall lack of knowledge regarding the marine-freshwater transition, scientists have provided phylogenetic data supporting these relationships (Logares et al., 2007; Annenkova et al., 2015). Salinity is a key factor in determining the distribution of the marine-freshwater boundary. Thus, the fact that many suessiacean species possess osmoregulatory organelles (e.g., pusular systems) may explain the frequent marine-freshwater transitions among lineages within this family (Table 1; Dodge, 1972). It is also worth noting that most suessiacean species have a known cyst stage, which may further facilitate the evolutionary transition.

The five samples with the highest abundance of the *Polarella* genus were all taken from the Arctic region (Figure 2C). Specifically, the reads of *Polarella* accounted for 25–65% of the total eukaryotic reads in these five samples, indicating that this genus may be a common bloom-forming taxon in polar regions.



FIGURE 2

Number of reads in the metaPR² dataset annotated to each genus (family Suessiaceae) among the samples collected from (A) marine (oceanic and coastal) and (B) freshwater (lakes and rivers) ecosystems. (C) Distribution map showing the five samples with the highest abundance of each genus among the surveyed samples. The diameter of each circle (based on the scale bars) represents the percentage (%) of reads belonging to each genus within the entire protist community.

Unlike Polarella, the genus Biecheleria tends to predominate in a wide range of aquatic environments without clear environmental restrictions. Biecheleria baltica is known to live in cold waters, whereas other Biecheleria species are mainly found in temperate waters (Kremp et al., 2005; Siano et al., 2009; Takahashi et al., 2014; Raho et al., 2018). For example, most isolates of Biecheleria cincta were collected from temperate waters (Siano et al., 2009; Kang et al., 2011; Luo et al., 2013). However, the morphology of a cold-water dwelling strain of B. cincta, RCC2013, perfectly matched that of the type strains of other temperate strains, while its 18S and 28S rRNA sequences were identical to those of its warmer water counterparts (Siano et al., 2009; Balzano et al., 2012). On the other hand, the highly variable internal transcribed spacer (ITS) region exhibited a faster rate of evolution among strains of *B. cincta*, suggesting that this species has evolved ability to rapidly adapt to new environments (Luo et al., 2013).

Ecophysiological diversity and differentiated ecological niches

This study investigated the relative read abundance of each genus within the family Suessiaceae in relation to water temperature and salinity (Figures 3A,B). Similar to the temperature dependence of the growth rates of common dinoflagellate species (Paerl, 2014), for many genera, high proportions of read counts were distributed between water temperatures of 15 to 30°C (Figure 3A). However, reads attributed to the genus Leiocephalium generally occupied high-temperature intervals, with a significant proportion of the reads occupying the 30–35°C interval (Chi-square homogeneity test, p < 0.01). This suggests that the taxon was likely a warm-water species. The read distribution of Polarella indicated that the members of this genus were cold-water species, which is consistent with the observed field data (Stoecker et al., 2000). Moreover, given that Yihiella showed positive growth rates at 10-30°C in lab-based experiments (Kang et al., 2020), the fact that more than 97% of Yihiella reads were distributed precisely within a 10-30°C temperature interval demonstrates that combining metabarcoding data sets provides a promising means of understanding taxon-specific ecophysiology. When the reads of each genus were classified by salinity, considerable proportions of the reads attributed to the genera Asulcocephalium, Biecheleriopsis, and Polarella were observed at a 0-5 psu interval, including freshwater samples (Chi-square homogeneity test, p < 0.01; Figure 3B). Polarella is commonly distributed in and around ice samples, and its cyst stage might improve osmotic resistance. Considering the above, it is proposed that metabarcoding analyses may provide novel insights into the ecophysiological diversity of genera whose distributions have previously been recorded exclusively in either freshwater or marine environments. For example, through the current analysis it was possible to detect the probable existence of marine-dwelling species in the genera Asulcocephalium and Leiocephalium and freshwater species in the genus Biecheleriopsis.

To understand the ecological niches of suessiacean species in the context of their known ecophysiological characteristics, the distribution of each genus within its natural environment was classified by horizontal and vertical criteria (i.e., latitude and water depth; Figures 3C,D). The read distributions of genera in accordance with latitude and water depth were significantly different, as supported by the Chi-square test for homogeneity (both p < 0.01). Polarella and Biecheleria comprised most of the suessiacean species in Arctic and Antarctic waters (Figure 3C). Unlike other genera, the read abundances of Ansanella and Yihiella were low in tropical waters. The ecological niches of the suessiacean genera according to water depth showed a more pronounced difference (Figure 3D). The reads of genus Pelagodinium and "Unidentified" category dominated the deepwater layers (i.e., mesopelagic and bathypelagic). The vertical distribution of Pelagodinium, which is only 10 µm in long, could reach the deep-water layer because these microorganisms live as symbionts in several hosts such as foraminifera (Siano et al., 2010). Moreover, the high number of "Unidentified" reads in the mesopelagic zone suggests that this environment may be inhabited by a yet unexplored diversity of Suessiaceae. Two ASVs, 536fcef820 and caffe54124, accounted for a high proportion of the "Unidentified" category in the mesopelagic group (236-562 m) collected from various regions in the Arctic and Antarctic (Supplementary Table S4). Information about their taxonomy could be obtained through phylogenetic study (See next section for details).

Biodiversity estimations based on phylogenetic analysis

A phylogenetic analysis based on the 18S rRNA sequences obtained from the PR² database was performed to estimate the phylogenetic biodiversity of the family Suessiaceae (Figure 4). Although there were slight variations in the phylogenetic position depending on the method the trees were analyzed, at least five new phylogenetic groups and three phylogenetically novel sequences were commonly identified among the analyzed phylogenetic trees (Figure 4; Supplementary Figures S3B, S4). The 18S rRNA sequences belonging to Group A differed by up to 4% from those of the Asulcocephalium genus. Considering the level of differences in the 18S rRNA sequence among different genera in family Suessiaceae (i.e., 1.2–5.3%), this group is now believed to be a new genus (Jeong et al., 2014; Jang et al., 2017b). The environmental sequences belonging to Unknown Group B differed by approximately 1-3% from those of Asulcocephalium miricentonis, suggesting that these sequences may belong to new species within the genus. The sequences in this group were globally distributed, being found in lakes in Luxembourg and France, as well as in the Columbia River estuary in the United States (Lefranc et al., 2005; Kahn et al., 2014). Group C contained a variety of sub-clades with sequence differences ranging from 2 to 4% relative to other known species, suggesting that this group have a high species diversity. The sequences



Relative read abundance of each genus (family Suessiaceae) according to (A) water temperature and (B) salinity of the surveyed samples. The color scheme represents the water temperature $(-5-35^{\circ}C)$ and salinity (0-100 psu). Relative read abundance of each genus classified by (C) horizontal (i.e., latitude) and (D) vertical (i.e., water depth) criteria.

belonging to Group D were collected from colder regions such as the North Pole and Sweden (Bachy et al., 2011; Majaneva et al., 2012), and the members of this clade are therefore expected to share similar ecophysiological features with *Polarella glacialis*. However, in addition to a 1–2% sequence difference between the two groups, morphological analyses are necessary in order to confirm that Group D represents a new species. Moreover, the sequences in Group E are presumed to be those of freshwater species, as they originated from high mountain lakes (Triadó-Margarit and Casamayor, 2012). However, this clade did not appear to belong to any other genus based on its phylogenetic position. In addition, three individual sequences (GQ483664, HQ438122, and EU087256) that do not form clades but diverged from the near groups could also represent new species. Finally, although the resolution of the



18S rRNA gene for intrageneric classification of the genus *Biecheleria* was too low, the high number of environmental sequences obtained from various aquatic waters suggests that the genus *Biecheleria* may have diverse ecological roles in global aquatic ecosystems.

Metabarcoding approach for suessiacean dinoflagellate species

Because the average cell length of species in the family Suessiaceae is only $14.5 \,\mu\text{m}$ (except for *Piscinoodinium* species, which vary in length depending on their life cycle; Table 1), metabarcoding approach is essential for distribution and

ecophysiological studies of these small species in the field. By using the recent and well-established taxonomic classification system of suessiacean dinoflagellates, the metabarcoding data is beginning to reveal the ecology and diversity of individual species. As an example, two environmental sequences (JQ516748 and EF526743) with high homologies to the genus *Yihiella* were found in the coral microbiome and anoxic water in fjords, respectively, allowing assumption of the potential ecological niches of *Yihiella*-like species (Behnke et al., 2010; Kimes et al., 2013). In addition, the metabarcoding analysis is also expected to provide more information about blooms caused by small suessiacean species. The results of this study have also confirmed that the metabarcoding approach could be used as a tool to provide new information to other multidisciplinary studies of the family Suessiaceae. For access to a variety of species, however, genetic information about species that have not yet been barcoded, such as *Aureodinium* and *Prosoaulax*, should be revealed in the future.

Conclusion

This study is the first to reveal the global species diversity, distribution, and ecological niches of the family Suessiaceae in aquatic ecosystems through the analysis of a large metabarcoding dataset. Out of the 42 family groups of dinoflagellates, Suessiaceae were the sixth in terms of read abundance and the ninth in terms of ASV richness, suggesting that their abundance in the natural environment has been significantly underestimated. Furthermore, at least five new phylogenetic groups and three individual novel sequences within the family were discovered based on 18S rRNA environmental sequences. These sequences are likely to indicate the presence of new species. Metabarcodes and associated environmental information from the surveyed samples provided novel insights into the ecophysiological characteristics of individual taxa, and even their putative ecological niches. The findings of this study highlight the importance of suessiacean dinoflagellates in aquatic ecosystems worldwide and demonstrate that big data obtained from environmental DNA constitute a promising tool for characterizing the ecological functions of understudied species.

Data availability statement

The original contributions presented in the study are included in the article/Supplementary material, further inquiries can be directed to the corresponding author.

Author contributions

The author confirms being the sole contributor of this work and has approved it for publication.

References

Annenkova, N. V., Hansen, G., Moestrup, Ø., and Rengefors, K. (2015). Recent radiation in a marine and freshwater dinoflagellate species flock. *The ISME J.* 9, 1821–1834. doi: 10.1038/ismej.2014.267

Bachy, C., López-García, P., Vereshchaka, A., and Moreira, D. (2011). Diversity and vertical distribution of microbial eukaryotes in the snow, sea ice and seawater near the north pole at the end of the polar night. *Front. Microbiol.* 2:106. doi: 10.3389/fmicb.2011.00106

Balzano, S., Gourvil, P., Siano, R., Chanoine, M., Marie, D., Lessard, S., et al. (2012). Diversity of cultured photosynthetic flagellates in the Northeast Pacific and Arctic oceans in summer. *Biogeosciences* 9, 4553–4571. doi: 10.5194/bg-9-4553-2012

Behnke, A., Barger, K. J., Bunge, J., and Stoeck, T. (2010). Spatio-temporal variations in protistan communities along an O2/H2S gradient in the anoxic Framvaren Fjord (Norway). *FEMS Microbiol. Ecol.* 72, 89–102. doi: 10.1111/j.1574-6941.2010.00836.x

Benico, G. A., Takahashi, K., Lum, W. M., Yñiguez, A. T., Azanza, R. V., Leong, S. C. Y., et al. (2019). First report of *Biecheleriopsis adriatica* in Bolinao,

Funding

This work was supported by the National Research Foundation of Korea (NRF) grant funded by the Korean government (MSIT; nos. 2022R1C1C1004755 and 2022M3I6A1085991 awarded to SJ).

Acknowledgments

Many thanks to Daniel Vaulot and collaborators for developing the publicly available database metaPR², as well as to Wordvice (https://wordvice.com) for English language editing. Two reviewers and editor made valuable comments that improved an earlier draft of this manuscript.

Conflict of interest

The author declares that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Publisher's note

All claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors and the reviewers. Any product that may be evaluated in this article, or claim that may be made by its manufacturer, is not guaranteed or endorsed by the publisher.

Supplementary material

The Supplementary material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fevo.2022.1010854/ full#supplementary-material

northwestern Philippines and its wide distribution in Southeast Asia and adjacent waters. *Philipp. J. Nat. Sci.* 24, 34–41.

Biecheler, B. (1952). Recherches sur les Peridiniens. Bull. Biol. Fr. Belg. 36, 1-149.

Calado, A. J., and Moestrup, Ø. (2005). On the freshwater dinoflagellates presently included in the genus *Amphidinium*, with a description of *Prosoaulax* gen. Nov. *Phycologia* 44, 112–119. doi: 10.2216/0031-8884(2005)44[112,OTFDPI]2.0.CO;2

Callahan, B. J., McMurdie, P. J., and Holmes, S. P. (2017). Exact sequence variants should replace operational taxonomic units in marker-gene data analysis. *The ISME J.* 11, 2639–2643. doi: 10.1038/ismej.2017.119

Callahan, B. J., McMurdie, P. J., Rosen, M. J., Han, A. W., Johnson, A. J. A., and Holmes, S. P. (2016). DADA2: high-resolution sample inference from Illumina amplicon data. *Nat. Methods* 13, 581–583. doi: 10.1038/NMETH.3869

Coats, D. W. (1999). Parasitic life styles of marine dinoflagellates. J. Eukaryot. Microbiol. 46, 402–409. doi: 10.1111/j.1550-7408.1999.tb04620.x

Dawut, M., Sym, S. D., and Horiguchi, T. (2018). Re-investigation of *Gymnodinium* natalense (Dinophyceae), a tidal pool dinoflagellate from South Africa and the proposal of a new combination Ansanella natalensis. Phycol. Res. 66, 300–309. doi: 10.1111/pre.12329

Dodge, J. D. (1967). Fine structure of the dinoflagellate Aureodinium pigmentosum gen. et sp. nov. Br. Phycol. Bul. 3, 327–336. doi: 10.1080/00071616700650211

Dodge, J. D. (1972). The ultrastructure of the dinoflagellate pusule: a unique osmo-regulatory organelle. *Protoplasma* 75, 285–302. doi: 10.1007/BF01279820

Dodge, J. D. (1974). A redescription of the dinoflagellate *Gymnodinium simplex* with the aid of electron microscopy. *J. Mar. Biol. Assoc. U. K.* 54, 171–177. doi: 10.1017/S0025315400022141

Fensome, R. A., Taylor, F. J. R., Norris, G., Sarjeant, W. A. S., Wharton, D. I., and William, G. L. (1993). A Classification of Living and Fossil Dinoflagellates: Micropaleontology. Hanover, PA: Sheridan Press.

Gómez, F. (2012). A quantitative review of the lifestyle, habitat and trophic diversity of dinoflagellates (Dinoflagellata, Alveolata). *Syst. Biodivers*. 10, 267–275. doi: 10.1080/14772000.2012.721021

Guillou, L., Bachar, D., Audic, S., Bass, D., Berney, C., Bittner, L., et al. (2012). The Protist ribosomal reference database (PR2): a catalog of unicellular eukaryote small sub-unit rRNA sequences with curated taxonomy. *Nucleic Acids Res.* 41, D597– D604. doi: 10.1093/nar/gks1160

Guiry, M. D., and Guiry, G. M. (2022). AlgaeBase. Available at: https://www. algaebase.org (Accessed December 02, 2022).

Jang, S. H., and Jeong, H. J. (2020). Spatio-temporal distributions of the newly described mixotrophic dinoflagellate *Yihiella yeosuensis* (Suessiaceae) in Korean coastal waters and its grazing impact on prey populations. *Algae* 35, 45–59. doi: 10.4490/algae.2020.35.2.24

Jang, S. H., Jeong, H. J., Kwon, J. E., and Lee, K. H. (2017a). Mixotrophy in the newly described dinoflagellate *Yihiella yeosuensis*: a small, fast dinoflagellate predator that grows mixotrophically, but not autotrophically. *Harmful Algae* 62, 94–103. doi: 10.1016/j.hal.2016.12.007

Jang, S. H., Jeong, H. J., Moestrup, Ø., Kang, N. S., Lee, S. Y., Lee, K. H., et al. (2015). Morphological, molecular and ecophysiological characterization of the phototrophic dinoflagellate *Biecheleriopsis adriatica* from Korean coastal waters. *Eur. J. Phycol.* 50, 301–317. doi: 10.1080/09670262.2015.1054892

Jang, S. H., Jeong, H. J., Moestrup, Ø., Kang, N. S., Lee, S. Y., Lee, K. H., et al. (2017b). *Yihiella yeosuensis* gen. et sp. nov. (Suessiaceae, Dinophyceae), a novel dinoflagellate isolated from the coastal waters of Korea. *J. Phycol.* 53, 131–145. doi: 10.1111/jpy.12486

Jang, S. H., Na, S. I., Lee, M. J., and Yoo, Y. D. (2022). Assessing the utility of mitochondrial gene markers in the family Suessiaceae (Dinophyta) with phylogenomic validation. *Mol. Phylogenet. Evol.* 177:107625. doi: 10.1016/j. ympev.2022.107625

Jeong, H. J., Jang, S. H., Moestrup, O., Kang, N. S., Lee, S. Y., Potvin, E., et al. (2014). *Ansanella granifera* gen. et sp. nov. (Dinophyceae), a new dinoflagellate from the coastal waters of Korea. *Algae* 29, 75–99. doi: 10.4490/algae.2014.29.2.075

Jeong, H. J., Yoo, Y. D., Kim, J. S., Seong, K. A., Kang, N. S., and Kim, T. H. (2010). Growth, feeding and ecological roles of the mixotrophic and heterotrophic dinoflagellates in marine planktonic food webs. *Ocean Sci. J.* 45, 65–91. doi: 10.1007/ s12601-010-0007-2

Kahn, P., Herfort, L., Peterson, T. D., and Zuber, P. (2014). Discovery of a *Katablepharis* sp. in the Columbia River estuary that is abundant during the spring and bears a unique large ribosomal subunit sequence element. *Microbiol. Open* 3, 764–776. doi: 10.1002/mbo3.206

Kang, H. C., Jeong, H. J., Lim, A. S., Ok, J. H., You, J. H., Park, S. A., et al. (2020). Effects of temperature on the growth and ingestion rates of the newly described mixotrophic dinoflagellate *Yihiella yeosuensis* and its two optimal prey species. *Algae* 35, 263–275. doi: 10.4490/algae.2020.35.8.20

Kang, H. C., Jeong, H. J., Ok, J. H., You, J. H., Jang, S. H., Lee, S. Y., et al. (2019). Spatial and seasonal distributions of the phototrophic dinoflagellate *Biecheleriopsis adriatica* (Suessiaceae) in Korea: quantification using qPCR. *Algae* 34, 111–126. doi: 10.4490/algae.2019.34.5.25

Kang, N. S., Jeong, H. J., Yoo, Y. D., Yoon, E. Y., Lee, K. H., Lee, K. et al. (2011). Mixotrophy in the newly described phototrophic dinoflagellate *Woloszynskia cincta* from western Korean waters: feeding mechanism, prey species and effect of prey concentration. *J. Eukaryot. Microbiol.* 58, 152–170. doi: 10.1111/j.1550-7408.2011.00531.x

Kellogg, C. T., McClelland, J. W., Dunton, K. H., and Crump, B. C. (2019). Strong seasonality in arctic estuarine microbial food webs. *Front. Microbiol.* 10:2628. doi: 10.3389/fmicb.2

Kimes, N. E., Johnson, W. R., Torralba, M., Nelson, K. E., Weil, E., and Morris, P. J. (2013). The *Montastraea faveolata* microbiome: ecological and temporal influences on a Caribbean reef-building coral in decline. *Environ. Microbiol.* 15, 2082–2094. doi: 10.1111/1462-2920.12130

Kodama, T., Watanabe, T., Taniuchi, Y., Kuwata, A., and Hasegawa, D. (2021). Micro-size plankton abundance and assemblages in the western North Pacific subtropical gyre under microscopic observation. *PLoS One* 16:e0250604. doi: 10.1371/journal.pone.0250604

Kremp, A., Elbrachter, M., Schweikert, M., Wolny, J. L., and Gottschling, M. (2005). *Woloszynskia Halophila* (Biecheler) comb. Nov.: a bloom-forming cold-water Dinoflagellate co-occurring with *Scrippsiella hangoei* (Dinophyceae) in the Baltic Sea. *J. Phycol.* 41, 629–642. doi: 10.1111/j.1529-8817.2005.00070.x

Kudela, R. M., and Gobler, C. J. (2012). Harmful dinoflagellate blooms caused by *Cochlodinium* sp.: global expansion and ecological strategies facilitating bloom formation. *Harmful Algae* 14, 71–86. doi: 10.1016/j.hal.2011.10.015

LaJeunesse, T. C., Lambert, G., Andersen, R. A., Coffroth, M. A., and Galbraith, D. W. (2005). *Symbiodinium* (pyrrhophyta) genome sizes (DNA content) are smallest among dinoflagellates. *J. Phycol.* 41, 880–886. doi: 10.1111/j.0022-3646.2005.04231.x

LaJeunesse, T. C., Parkinson, J. E., Gabrielson, P. W., Jeong, H. J., Reimer, J. D., Voolstra, C. R., et al. (2018). Systematic revision of Symbiodiniaceae highlights the antiquity and diversity of coral endosymbionts. *Curr. Biol.* 28, 2570–2580.e6. doi: 10.1016/j.cub.2018.07.008

Lee, S. K., Jeong, H. J., Jang, S. H., Lee, K. H., Kang, N. S., Lee, M. J., et al. (2014). Mixotrophy in the newly described dinoflagellate *Ansanella granifera*: feeding mechanism, prey species, and effect of prey concentration. *Algae* 29, 137–152. doi: 10.4490/algae.2014.29.2.137

Lefranc, M., Thénot, A., Lepere, C., and Debroas, D. (2005). Genetic diversity of small eukaryotes in lakes differing by their trophic status. *Appl. Environ. Microbiol.* 71, 5935–5942. doi: 10.1128/AEM.71.10.5935-5942.2005

Letunic, I., and Bork, P. (2021). Interactive tree of life (iTOL) v5: an online tool for phylogenetic tree display and annotation. *Nucleic Acids Res.* 49, W293–W296. doi: 10.1093/nar/gkab301

Levy, M. G., Litaker, R. W., Goldstein, R. J., Dykstra, M. J., Vandersea, M. W., and Noga, E. J. (2007). *Piscinoodinium*, a fish-ectoparasitic dinoflagellate, is a member of the class Dinophyceae, subclass Gymnodiniphycidae: convergent evolution with *Amyloodinium*. J. Parasitol. 93, 1006–1015. doi: 10.1645/GE-3585.1

Liu, Y., Hu, Z., Deng, Y., Shang, L., Gobler, C. J., and Tang, Y. Z. (2021). Dependence of genome size and copy number of rRNA gene on cell volume in dinoflagellates. *Harmful Algae* 109:102108. doi: 10.1016/j.hal.2021.102108

Liu, L., Wang, Z., and Lu, S. (2020). Diversity and geographical distribution of resting stages of eukaryotic algae in the surface sediments from the southern Chinese coastline based on metabarcoding partial 18S rDNA sequences. *Mar. Ecol.* 41, 1–17. doi: 10.1111/maec.12585

Logares, R., Shalchian-Tabrizi, K., Boltovskoy, A., and Rengefors, K. (2007). Extensive dinoflagellate phylogenies indicate infrequent marine–freshwater transitions. *Mol. Phylogenet. Evol.* 45, 887–903. doi: 10.1016/j.ympev.2007.08.005

Lom, J., and Schubert, G. (1983). Ultrastructural study of *Piscinoodinium pillulare* (Schäperclaus, 1954) Lom, 1981 with special emphasis on its attachment to the fish host. *J. Fish Dis.* 6, 411–428. doi: 10.1111/j.1365-2761.1983.tb00096.x

Luo, Z., Yang, W., Xu, B., and Gu, H. (2013). First record of *Biecheleria cincta* (Dinophyceae) from Chinese coasts, with morphological and molecular characterization of the strains. *Chin. J. Oceanol. Limnol.* 31, 835–845. doi: 10.1007/s00343-013-2315-8

Majaneva, M., Rintala, J. M., Piisilä, M., Fewer, D. P., and Blomster, J. (2012). Comparison of wintertime eukaryotic community from sea ice and open water in the Baltic Sea, based on sequencing of the 18S rRNA gene. *Polar Biol.* 35, 875–889. doi: 10.1007/s00300-011-1132-9

Martins, M. L., Moraes, J. R. E., Andrade, P. M., Schalch, S. H. C., and Moraes, F. R. D. (2001). *Piscinoodinium pillulare* (Schäperclaus, 1954) Lom, 1981 (Dinoflagellida) infection in cultivated freshwater fish from the northeast region of São Paulo state, Brazil: parasitological and pathological aspects. *Braz. J. Biol.* 61, 639–644. doi: 10.1590/S1519-69842001000400013

Moestrup, Ø., Lindberg, K., and Daugbjerg, N. (2009a). Studies on woloszynskioid dinoflagellates IV: the genus *Biecheleria* gen. Nov. *Phycol. Res.* 57, 203–220. doi: 10.1111/j.1440-1835.2009.00540.x

Moestrup, Ø., Lindberg, K., and Daugbjerg, N. (2009b). Studies on woloszynskioid dinoflagellates V. ultrastructure of *Biecheleriopsis* gen. Nov., with description of *Biecheleriopsis adriatica* sp. nov. *Phycol. Res.* 57, 221–237. doi: 10.1111/j.1440-1835.2009.00541.x

Montresor, M., Procaccini, G., and Stoecker, D. K. (1999). *Polarella glacialis*, gen. Nov., sp. nov. (Dinophyceae): Suessiaceae are still alive! *J. Phycol.* 35, 186–197. doi: 10.1046/j.1529-8817.1999.3510186.x

Moreira-González, A. R., Alonso-Hernández, C. M., Arencibia-Carballo, G., Betanzos-Vega, A., Morton, S. L., and Richlen, M. L. (2021). First report of an *Ansanella granifera* bloom associated with eutrophication in cuban waters, caribbean region. *Harmful Algae News* 67, 10–11.

Murray, S. A., Suggett, D. J., Doblin, M. A., Kohli, G. S., Seymour, J. R., Fabris, M., et al. (2016). Unravelling the functional genetics of dinoflagellates: a review of approaches and opportunities. *Perspect. Phycol.* 3, 37–52. doi: 10.1127/pip/2016/0039

Paerl, H. W. (2014). Mitigating harmful cyanobacterial blooms in a human-and climatically-impacted world. *Life* 4, 988–1012. doi: 10.3390/life4040988

Raho, N., Fraga, S., Abad, J. P., and Marín, I. (2018). *Biecheleria tirezensis* sp. nov. (Dinophyceae, Suessiales), a new halotolerant dinoflagellate species isolated from the athalassohaline Tirez natural pond in Spain. *Eur. J. Phycol.* 53, 99–113. doi: 10.1080/09670262.2017.1386328

Salmaso, N., Boscaini, A., and Pindo, M. (2020). Unraveling the diversity of eukaryotic microplankton in a large and deep perialpine lake using a high throughput sequencing approach. *Front. Microbiol.* 11:789. doi: 10.3389/fmicb.2020.00789

Sampedro, N., Reñé, A., Matos, J., Fortuño, J. M., and Garcés, E. (2022). Detection of the widespread presence of the genus *Ansanella* along the Catalan coast (NW Mediterranean Sea) and the description of *Ansanella catalana* sp. nov. (Dinophyceae). *Eur. J. Phycol.* 57, 125–142. doi: 10.1080/09670262.2021.1914861

Siano, R., Kooistra, W. H., Montresor, M., and Zingone, A. (2009). Unarmoured and thin-walled dinoflagellates from the Gulf of Naples, with the description of *Woloszynskia cincta* sp. nov. (Dinophyceae, Suessiales). *Phycologia* 48, 44–65. doi: 10.2216/08-61.1

Siano, R., Montresor, M., Probert, I., Not, F., and de Vargas, C. (2010). *Pelagodinium* gen. Nov. and *P. béii* comb. nov., a dinoflagellate symbiont of planktonic foraminifera. *Protist* 161, 385–399. doi: 10.1016/j.protis.2010.01.002

Smith, K. F., Kohli, G. S., Murray, S. A., and Rhodes, L. L. (2017). Assessment of the metabarcoding approach for community analysis of benthic-epiphytic dinoflagellates using mock communities. *N. Z. J. Mar. Freshwater Res.* 51, 555–576. doi: 10.1080/00288330.2017.1298632

Sokal, R. R., and Rohlf, F. J. (1987). *Introduction to Biostatistics*. New York, NY: Freeman.

Spero, H. J. (1987). Symbiosis in the planktonic foraminifer, *Orbulina universa*, and the isolation of its symbiotic dinoflagellate, *Gymnodinium béii* sp. nov. *J. Phycol.* 23, 307–317. doi: 10.1111/j.1529-8817.1987.tb04139.x

Stoecker, D. K., Gustafson, D. E., Baier, C. T., and Black, M. M. (2000). Primary production in the upper sea ice. *Aquat. Microb. Ecol.* 21, 275–287. doi: 10.3354/ ame021275

Suggett, D. J., Warner, M. E., and Leggat, W. (2017). Symbiotic dinoflagellate functional diversity mediates coral survival under ecological crisis. *Trends Ecol. Evol.* 32, 735–745. doi: 10.1016/j.tree.2017.07.013

Takahashi, K., Moestrup, Ø., Jordan, R. W., and Iwataki, M. (2015). Two new freshwater woloszynskioids *Asulcocephalium miricentonis* gen. et sp. nov. and *Leiocephalium pseudosanguineum* gen. et sp. nov. (Suessiaceae, Dinophyceae) lacking an apical furrow apparatus. *Protist* 166, 638–658. doi: 10.1016/j. protis.2015.10.003

Takahashi, K., Sarai, C., and Iwataki, M. (2014). Morphology of two marine woloszynskioid dinoflagellates, *Biecheleria brevisulcata* sp. nov. and *Biecheleriopsis adriatica* (Suessiaceae, Dinophyceae), from Japanese coasts. *Phycologia* 53, 52–65. doi: 10.2216/13-192.1

Tamura, K., Stecher, G., and Kumar, S. (2021). MEGA11: molecular evolutionary genetics analysis version 11. *Mol. Biol. Evol.* 38, 3022–3027. doi: 10.1093/molbev/msab120

Thessen, A. E., Patterson, D. J., and Murray, S. A. (2012). The taxonomic significance of species that have only been observed once: the genus *Gymnodinium* (Dinoflagellata) as an example. *PLoS One* 7:e44015. doi: 10.1371/journal. pone.0044015

Triadó-Margarit, X., and Casamayor, E. O. (2012). Genetic diversity of planktonic eukaryotes in high mountain lakes (Central Pyrenees, Spain). *Environ. Microbiol.* 14, 2445–2456. doi: 10.1111/j.1462-2920.2012.02797.x

Vaulot, D., Sim, C. W. H., Ong, D., Teo, B., Biwer, C., Jamy, M., et al. (2022). metaPR²: a database of eukaryotic 18S rRNA metabarcodes with an emphasis on protists. *Mol. Ecol. Res.* 22, 3188–3201. doi: 10.1111/1755-0998.13674