



mutualistic algal-bacterial interactions involving vitamin B12 [9,10] or iron [11].

Comparative studies of iron metabolism in different species are complicated by the virtual impossibility of achieving the same iron conditions in different cultures, particularly in time-course experiments, while the analysis of complex natural samples is biased by heterogeneity even in the dominant species. The aim of our study was to establish cocultivation experiments where each species in the community would be distinguishable by flow cytometry and present in quantities enabling homogenous detection of proteins, within a reasonable timeframe to observe the effect of nutritional changes. Such a system would provide equal iron conditions for each member of the consortia in time and allow us to study dynamic changes in the growth and proteomes of individual species.

## 2. Materials and methods

### 2.1. Cell culture

*Amphidinium carterae* (CCMP1314), *Bigelowiella natans* (CCMP2755), *Eutreptiella gymnastica* (K-0333), *Emiliania huxleyi* (CCMP371), *Heterocapsa triquetra* (CCMP449), *Phaeodactylum tricornutum* (CCMP2561), *Tetraselmis* sp. (CCMP961), *Thalassiosira oceanica* (CCMP1005) and *Thalassiosira pseudonana* (CCMP1335) were grown at 18 °C under a 12 h/12 h light ( $50 \mu\text{mol m}^{-2} \text{s}^{-1}$ ) /dark regime in filtered modified f (Mf) medium, as described previously [12]. The composition of the Mf medium was as follows: 40 g/l sea salts; 75 mg/l  $\text{NaNO}_3$ ; 2.66 mg/l  $\text{NH}_4\text{NO}_3$ ; 22.8 mg/l  $\text{Na}_2\text{-SiO}_3 \cdot 5\text{H}_2\text{O}$ ; 15 mg/l  $\text{NaH}_2\text{PO}_4$ ; 1 ml of trace metal stock (200 mg/l  $\text{MnCl}_2 \cdot 4\text{H}_2\text{O}$ ; 40 mg/l  $\text{ZnSO}_4 \cdot 7\text{H}_2\text{O}$ ; 20 mg/l  $\text{Na}_2\text{MoO}_4 \cdot 2\text{H}_2\text{O}$ ; 14 mg/l  $\text{CoCl}_2 \cdot 6\text{H}_2\text{O}$ ; 10 mg/l  $\text{Na}_3\text{VO}_4 \cdot n\text{H}_2\text{O}$ ; 10 mg/l  $\text{NiCl}_2$ ; 10 mg/ml  $\text{H}_2\text{SeO}_3$ ) and 1 ml of vitamin stock (20 mg/l thiamine-HCl, 1 mg/ml biotin, 1 mg/ml B12). The medium was buffered with 1 g/l HEPES (pH 7.5). Iron-rich conditions were achieved by the addition of 0.1  $\mu\text{M}$  ferric citrate (1:20). To establish copper-deficient conditions, 10  $\mu\text{M}$  BCS (bathocuproinedisulfonic acid disodium salt) was added to the growth medium. All chemicals, including growth medium reagents, were purchased from Sigma–Aldrich (USA).

### 2.2. Flow cytometry

Before each cocultivation experiment, starting cultures of *Amphidinium carterae*, *Bigelowiella natans*, *Eutreptiella gymnastica*, *Emiliania huxleyi*, *Heterocapsa triquetra*, *Phaeodactylum tricornutum*, *Tetraselmis* sp., *Thalassiosira oceanica* and *Thalassiosira pseudonana* were maintained under iron-rich (Mf medium with the addition of 0.1  $\mu\text{M}$  ferric citrate) or iron-limited (Mf medium without iron addition) conditions for seven days. Cell counts for each species were determined on a Guava easyCyte 8HT flow cytometer (Luminex Corporation, USA). To study the effect of copper availability, *T. oceanica* and *T. pseudonana* cultures were additionally maintained under copper-deficient (Mf medium with the addition of 10  $\mu\text{M}$  BCS) or copper-sufficient (without BCS addition) conditions. Starting cultures for the five consortia species (Fig. 1) contained  $2.6 \times 10^4$  *A. carterae* and *Tetraselmis* sp. cells and  $5.2 \times 10^4$  *B. natans*, *E. huxleyi* and *T. oceanica* cells. Cultures were combined and grown for seven days under appropriate iron conditions in three biological replicates. On the seventh day, consortia were analyzed using a BD LSRFortessa™ SORP flow cytometer (BD Biosciences, USA) with a 488 nm laser (100 mW) for excitation and PerCP-Cy5.5 (BP710/50) and FITC (BP530/30) emission filters corresponding to red and green fluorescence parameters. Starting cultures for dual *Thalassiosira* cocultivation (Fig. 2) contained  $7.5 \times 10^4$  *T. oceanica* and *T. pseudonana* cells. Cultures were combined, grown for seven days

under appropriate iron and copper conditions in three biological replicates and analyzed using a Guava easyCyte 8HT flow cytometer with a 488 nm laser (150 mW) for excitation and Red-B (BP695/50) and Green-B (BP525/30) emission filters corresponding to red and green fluorescence parameters. Starting cultures in the consortia to study the effect of ferrioxamine B contained  $5.2 \times 10^4$  *B. natans* cells,  $2.6 \times 10^4$  *A. carterae* cells and  $2.6 \times 10^4$  cells of either *Tetraselmis* sp. or *E. gymnastica*. Cultures were combined, allowed to grow for seven days under iron-limited (without iron addition) or iron-rich (addition of 0.1  $\mu\text{M}$  ferric citrate (1:20) or 0.1  $\mu\text{M}$  ferrioxamine B (1:1.1)) conditions and measured using a Guava easyCyte 8HT flow cytometer with a 488 nm laser (150 mW) for excitation and Red-B (BP695/50) and Green-B (BP525/30) emission filters corresponding to red and green fluorescence parameters. All data were analyzed using FlowJo v10 software (BD Biosciences).

### 2.3. Proteomic analysis

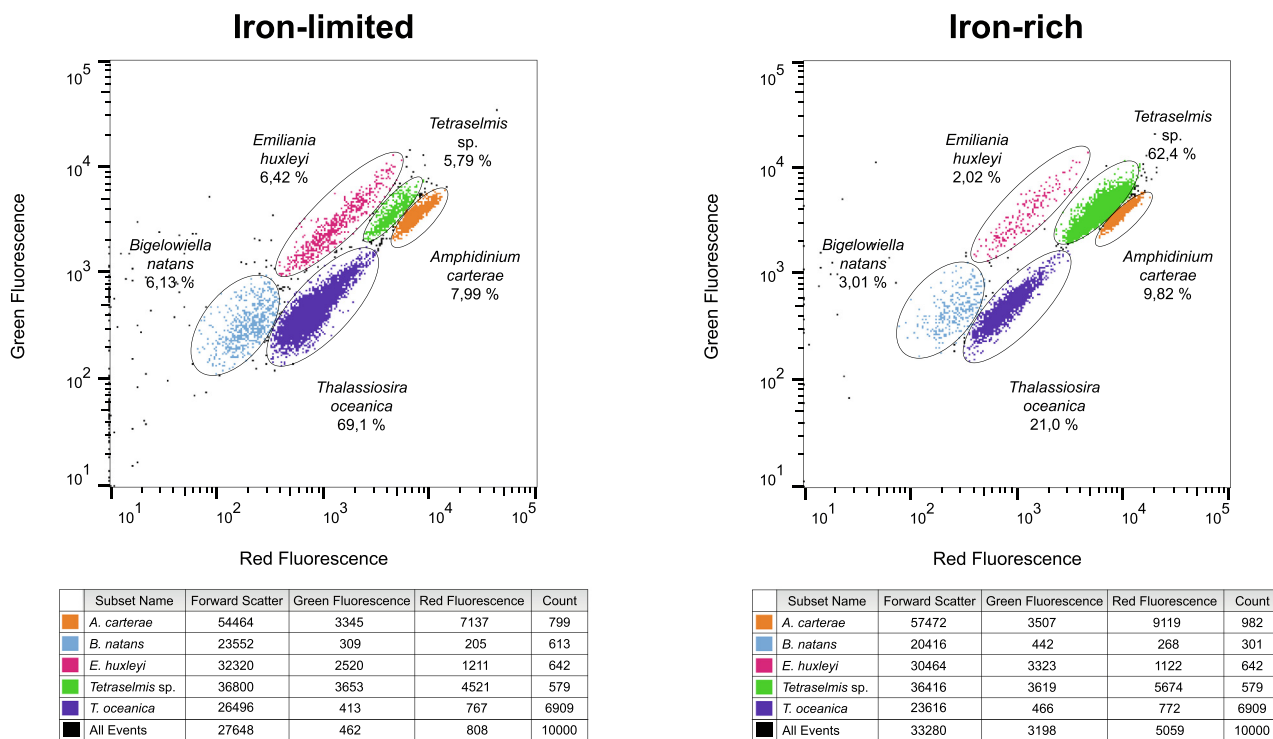
Label-free whole-cell comparative proteomic analysis of *Amphidinium carterae*, *Bigelowiella natans*, *Heterocapsa triquetra* and *Phaeodactylum tricornutum* mixed cultures was performed in independent biological triplicates. Iron-rich (maintained in Mf medium with 0.1  $\mu\text{M}$  ferric citrate) and iron-limited (Mf medium without iron addition) starting cultures containing  $6 \times 10^4$  *A. carterae* cells,  $1.25 \times 10^5$  *B. natans* cells,  $1.25 \times 10^5$  *P. tricornutum* cells and  $2 \times 10^4$  *H. triquetra* cells were combined and allowed to grow for one day under appropriate iron conditions. At the beginning of the experiment, 0.1  $\mu\text{M}$  ferric citrate was added to achieve iron enrichment in iron-limited cultures. At given timepoints (1, 6 and 24 h), cells were counted using flow cytometry and centrifuged (1000g; 5 min; 4 °C), and the dry pellet was subjected to proteomic analysis according to [13]. Detailed characteristics of the proteomic analysis are summarized in Table S2.

### 2.4. Statistical analysis

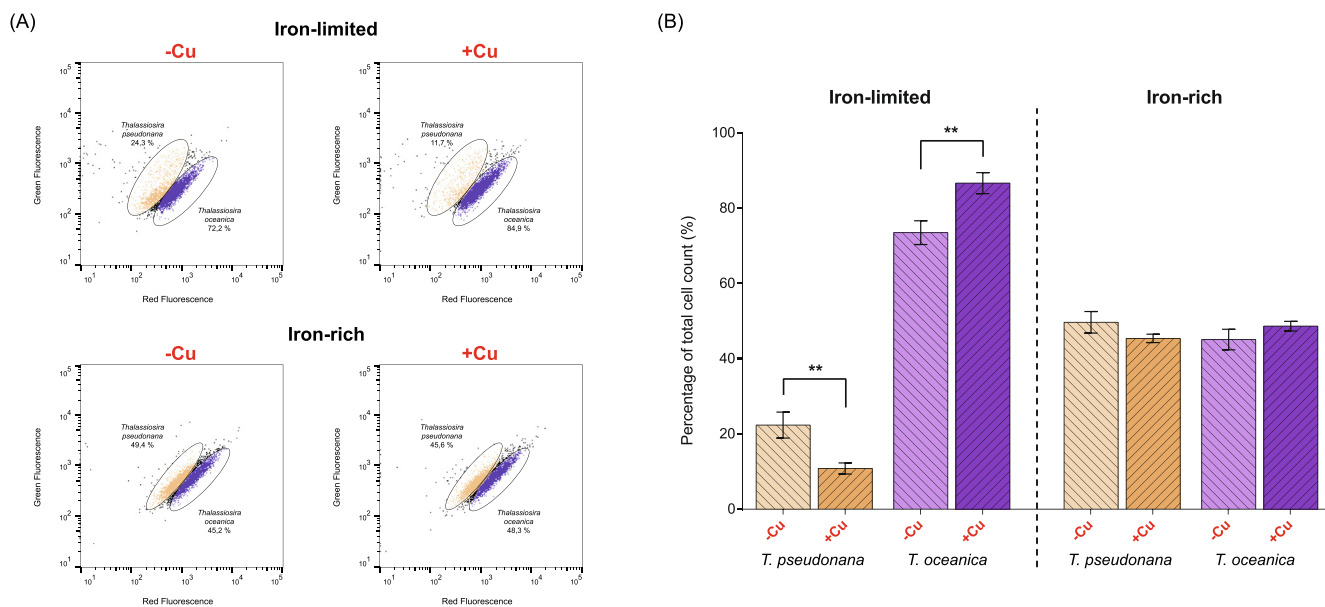
Single-OMIC analyses do not provide a deep understanding of biological systems. Thus, two-step normalization was employed to overcome hidden variation due to different cell numbers and variable expression levels. First, size-factor vector normalization was used, where the normalizing factor was estimated from cell counts using flow cytometry. Next, quantile normalization was used on cell count-normalized data, which is a technique for making two (or more) distributions identical in statistical properties. We used the *preprocessCore* package in R software [14]. This method uses the concept of a quantile–quantile plot in n-dimensions and is amenable for normalizations of multi-OMIC data. To detect the changes in variation due to two-step normalization, we used (s)PLS-DA: (sparse) partial least squares discriminant analysis in the R package *mixOmics* [15] and the area under the curve (AUC) for the extraction of sensitivity values, specificity of discriminations and corresponding p values.

### 2.5. Iron uptake

The incorporation of iron into protein complexes was analyzed by blue native PAGE as described in [16]. Prior to iron uptake experiments, cultures were grown in iron-deficient Mf medium (without added Fe) for 7 days. Then, 0.1  $\mu\text{M}$   $^{55}\text{Fe}$  (29,600 MBq  $\text{mg}^{-1}$ ) was added in the form of ferric citrate (1:20), ferric EDTA (1:10), ferrioxamine B (FOB; 1:1.1) or enterobactin (FeENT; 1:1.1) to the cell cultures and incubated for 24 h. Stock solutions of  $^{55}\text{Fe}$ -labeled siderophores (FOB, FeENT) were prepared according to [4]. The cells were harvested by centrifugation and washed three times with ice-cold cultivation medium. Subsequently, the cells



**Fig. 1.** Effect of iron availability on representative microalgal consortia. Flow cytograms of microalgal consortia containing five microalgal species (*B. natans*, *E. huxleyi*, *Tetraselmis* sp., *A. carterae* and *T. oceanica*) grown for one week under iron-limited or iron-rich conditions. Tables under flow cytograms contain median values for Forward Scatter, Green Fluorescence and Red Fluorescence parameters together with cell counts for each species. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



**Fig. 2.** Effect of iron and copper availability on coastal and oceanic *Thalassiosira*. (A) Flow cytograms with gates of two cocultivated species (*T. pseudonana* and *T. oceanica*) grown for one week under iron-limited or iron-rich conditions and copper-deprived (-Cu) or copper-sufficient (+Cu) conditions. (B) Percentage of total cell count for *T. oceanica* and *T. pseudonana* under iron-limited or iron-rich conditions and copper deprived (-Cu) or copper sufficient (+Cu) conditions, measured in three replicates (mean  $\pm$  SD, \*\* p less than 0.01).

were disrupted by sonication in the presence of 1% digitonin, and protein complexes were separated by blue native PAGE using the Novex Native PAGE Bis-Tris Gel 4–16% system (Invitrogen) according to the manufacturer’s protocol. The gels were vacuum-dried and autoradiographed for 5 days using a BAS-IP TR 2025 E tritium storage phosphor screen (GE Life Sciences) and visualized using a Typhoon FLA 7000 (GE Life Sciences).

### 2.6. Siderophore utilization

FOB coupled to a fluorescent moiety, nitrobenz-2-oxa-1,3-diazole (FOB-NBD), was previously synthesized as described by [17]. *A. carterae*, *B. natans*, *Tetraselmis* sp. and *E. gymnastica* were grown in iron-deficient Mf medium (without iron addition) in independent biological triplicates for seven days. FOB-NBD

(1  $\mu\text{M}$ ) was added to the cell cultures and incubated for 1, 3 and 6 h in the dark at 18 °C. Cultures were measured using a Guava easy-Cyte 8HT flow cytometer with a 488 nm laser (150 mW) for excitation and Yellow-B (BP583/26) emission filter to detect DFOB-NBD accumulated within cells. Data were analyzed using FlowJo v10 software.

### 3. Results

We were able to set up a series of experiments with different combinations of species distinguishable by flow cytometry, allowing us to study the effect of iron on the fitness of each member of the consortia. Species were chosen based on their ability to grow at the same temperature and light intensity at relatively similar rates, differences in iron requirements (low-iron-adapted *E. huxleyi* and *T. oceanica* vs. species with higher iron demand), distinguishability by flow cytometry and the availability of axenic strains. For all species, genomic and/or transcriptomic data are available, allowing interpretation of results at molecular level, particularly in proteomic analysis. The discriminability of chosen species in each experiment was ensured by setting the flow cytometric parameters for monoxenic cultures, in most cases red and green fluorescence corresponding to autofluorescence of their chlorophyll, phycoerythrin and carotenoid pigments. Importantly, the cell populations were analyzed under changing iron availability. As shown in Fig. S1, the cell population parameters changed significantly for *Amphidinium carterae*, *Eutreptiella gymnastica*, *Phaeodactylum tricorutum*, *Tetraselmis* sp., *Thalassiosira oceanica* and *Thalassiosira pseudonana*.

Fig. 1 illustrates a cocultivation system containing five species: the chlorarachniophyte *Bigelowiella natans*, the coccolithophore *Emiliania huxleyi*, the flagellated chlorophyte *Tetraselmis* sp., the dinoflagellate *Amphidinium carterae* and the diatom *Thalassiosira oceanica*. Species are clearly distinguishable under both iron-rich and iron-limiting conditions using red and green fluorescence, and as expected, low iron availability provided a competitive advantage for *E. huxleyi* and *T. oceanica*, species adapted to iron-limited ocean regions. Iron limitation resulted in a more than 3-fold increase in the community proportion of both microalgae after one week.

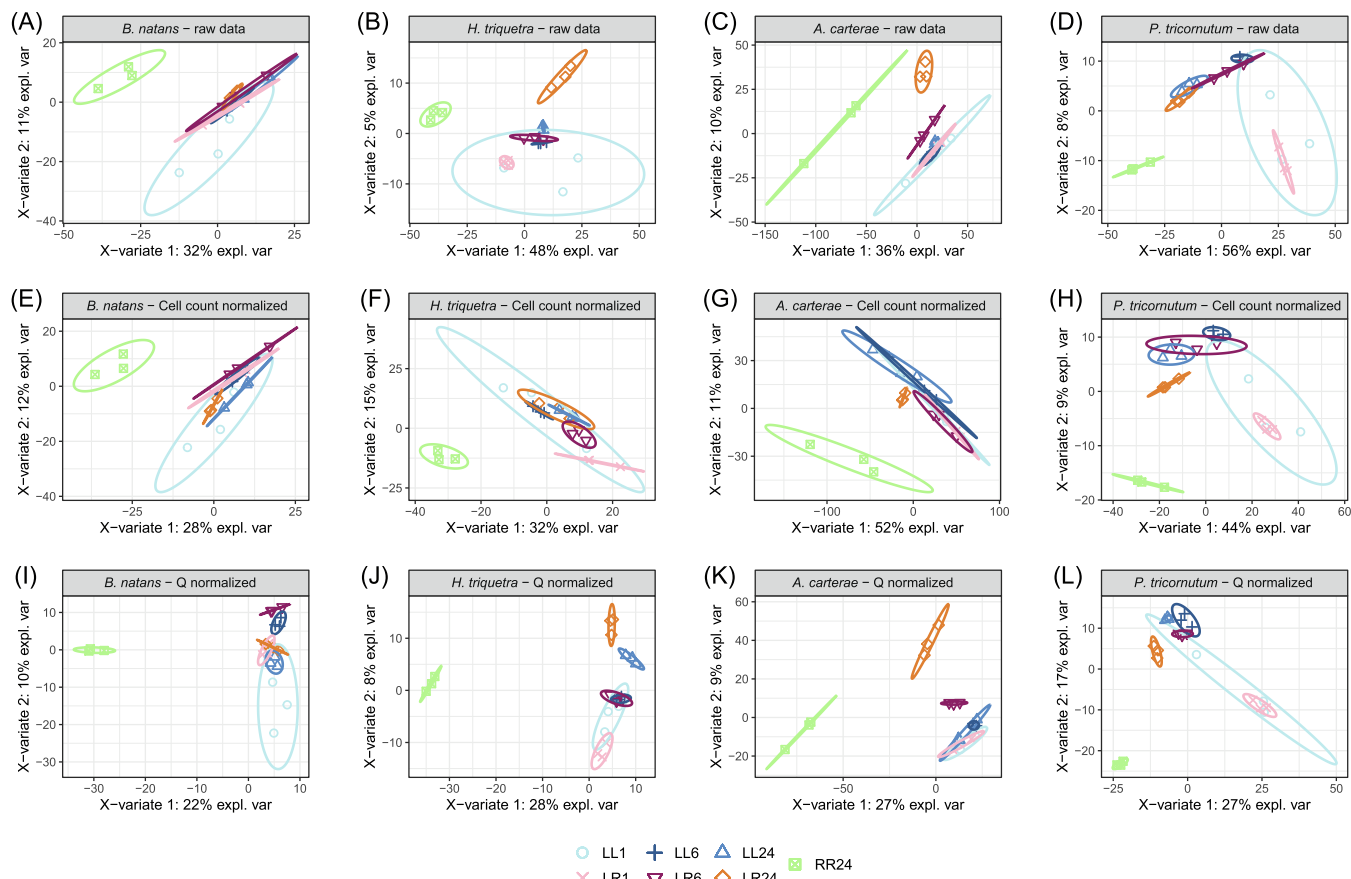
An exemplary experiment demonstrating adaptation to metal availability is depicted in Fig. 2. In this dual culture, two *Thalassiosira* species were cocultivated. While *T. oceanica* is an open-ocean, low-iron-adapted diatom employing copper-containing plastocyanin for electron transport from the cytochrome *b<sub>6</sub>f* complex to PSI [18], *T. pseudonana* is a coastal strain with high iron demand and plastocyanin has been replaced by cytochrome *c<sub>6</sub>* [19]. Consistent with these differences, cultivation under iron-limited conditions supported the growth of *T. oceanica*, while copper deprivation favored *T. pseudonana* when iron was limiting.

In an attempt to observe complex cellular responses to changing iron availability at the molecular level, we employed label-free comparative proteomics to analyze algal consortia of four selected species. Iron-limited cocultures were supplemented with iron (LR) and compared at different time points over a 24-hour time course with cells maintained under conditions of iron limitation (LL). After 24 h, proteomic profiles were also compared with cells maintained under conditions of long-term iron sufficiency (RR). Flow cytograms of the consortia at 24 h and 6 days after iron enrichment are depicted in Fig. S2. Proteins detected from all studied organisms are shown in Table S1. We detected 6100 unique proteins throughout all species and conditions: 3717 proteins from *A. carterae*, 972 proteins from *P. tricorutum*, 737 proteins from *H. triquetra* and 735 proteins from *B. natans*.

We used sparse partial least squares discriminant analysis (sPLS-DA) and the area under the curve (AUC) [15] to determine whether specific conditions of our experiment yielded significant changes in the proteomic profiles. Graphical results of sPLS discriminations (Fig. 3) demonstrate that the predictive performance for all comparisons was improved after cell count normalization. While long-term iron-rich cells (RR24 in Fig. 3) revealed perfect discrimination on all sPLS-DA panels regardless of the type of normalization (Comp. 2: AUC = 1,  $p = 0.006$ ), iron-limited cells 24 h after enrichment (LR24 in Fig. 3) showed better predictive performances after cell count and quantile normalization (two-step normalization). The suitability of the two-step normalization is demonstrated in Fig. 3C, G, K, where iron-limited *A. carterae* cells were well separated 6 h after iron supplementation.

Upon iron enrichment, we were able to observe the downregulation of the homologs of proteins named the iron-starvation-induced proteins (or ISIPs) and upregulation of the light-harvesting complex subunits and fructose biphosphate aldolase class II, in all analyzed species. For simplicity, we demonstrate an iron-induced response by analysis of preselected proteins whose abundance was expected to be affected by iron status (Table 1) in the proteomic data obtained for *P. tricorutum* and *A. carterae*, the two species with the best proteomic coverage. Within 1 h after iron enrichment, only 9 out of 102 preselected proteins detected in these two species had changed more than 2-fold (8 in *P. tricorutum* and 1 in *A. carterae*). Within 6 h after iron addition, the number of affected proteins increased to 23 (13 in *P. tricorutum* and 10 in *A. carterae*). After 24 h, 47 proteins had changed more than 2-fold (23 in *P. tricorutum* and 24 in *A. carterae*), similar to the difference observed between long-term iron-rich and iron-limited conditions. In general, the fastest induced proteins (which changed more than 2-fold within 6 h after iron enrichment) were the subunits of photosystem I (PSI): PsaC, PsaD, PsaE and PsaL; photosystem II (PSII): PsbV; cytochrome *b<sub>6</sub>/f* - PetA and ATP synthase - AtpE; the enzyme magnesium chelatase, which is involved in chlorophyll synthesis; and the iron-containing enzyme fructose biphosphate aldolase class II (FBAlI), which is replaced by metal-free FBAl [20]. Iron starvation-induced proteins and the *P. tricorutum* cellular repressor of E1A stimulated genes 1 (CREG1) were downregulated more than 2-fold 6 h after iron enrichment. These proteins are known to be major markers of iron limitation [12,21]. Proteins that changed more than 2-fold only 24 h after iron enrichment included other ISIPs, flavodoxins (downregulated) and ascorbate peroxidase, PsbC, SOD1 (upregulated). An interesting difference between *A. carterae* and *P. tricorutum* in the response to iron starvation was the regulation of light-harvesting complex subunits (LHCX). While one of the 3 detected LHC subunits (LHCX2) of *P. tricorutum* was upregulated under iron-limited conditions, which was also reported by [22], all 12 detected homologs of *A. carterae* LHCX were downregulated or unchanged, including the probable homolog of LHCX2 (CAMPEP\_0176611302). LHCX2 is believed to be a regulator of nonphotochemical quenching (NPQ), the capacity of which is increased under iron-limited conditions [22]. The different responses of NPQ regulation to iron could reflect the different general light response flexibilities of both species. In their natural environment, bloom-forming dinoflagellates live in a stable stratified layer at the subsurface, usually below approximately 10 m depth, where illumination can sometimes be reduced to 1% [23]. As a result, *A. carterae* is genotypically adapted to low quantum flux densities and lacks an effective mechanism for de-excitation when excess light is absorbed [24]. On the other hand, planktonic diatoms, inhabiting turbulent surface waters, acclimatize to fluctuating light conditions better than dinoflagellates [23]. Diatoms are well known for their general light-response flexibility and potential for tuning their photosynthetic efficiency by NPQ under prolonged and potentially unfavorable conditions (reviewed in [25]).





**Fig. 3.** Divergent patterns of protein abundances in raw and normalized datasets. Sparse PLS discriminant analysis revealed that raw data (A, B, C, D), cell count-normalized data (E, F, G, H) and quantile-normalized data after cell count normalization (I, J, K, L) had different predictive performances. We observed clear discriminations after cell count normalizations and even clearer discriminations after quantile normalizations, which further improved most of these discriminations (e.g., A, E, I). LL: long-term iron limitation, RR: long-term iron sufficiency, LR: iron enrichment. The number denotes time (hours) after beginning an experiment (after iron enrichment of LR cells).

Interestingly, while changes in the expression of the proteins most significantly affected by iron resupply were generally similar or more pronounced in cells maintained continuously under iron-rich conditions, the levels of ISIPs (and *Creg1* in *P. tricornutum*) were lower in resupplied cells than in those cultivated under conditions of long-term iron sufficiency. We believe that cells grown under long-term iron-sufficient conditions maintain a stable level of basal expression of these strong iron stress markers, while it is possible that sudden iron enrichment led to their overrepression. This can be explained by the continuous utilization of iron sparing pathways in long-term iron-deprived cells.

An important observation was made when the siderophore ferrioxamine B (FOB) was used as an iron source in cultures containing *B. natans* and *A. carterae* with *Tetraselmis* sp. (Fig. 4A), or the euglenid *E. gymnastica* (Fig. 4B). In contrast to other members of the consortia, the growth of *A. carterae* was stimulated by the addition of iron in the form of FOB. This observation indicates the presence of machinery responsible for siderophore acquisition. We thus decided to investigate the ability to acquire iron from siderophores in *A. carterae* as well as in other species whose growth in these cocultures was suppressed when iron was supplied as FOB. We exposed *A. carterae*, *B. natans*, *Tetraselmis* sp. and *E. gymnastica* monocultures to  $^{55}\text{Fe}$  chelated by citrate (a relatively weak iron chelator), EDTA (a strong chelator) or two siderophores (hydroxamate-type FOB and catecholate-type enterobactin). The incorporation of iron from those sources into cellular proteins was visualized after separation on blue native electrophoresis gels.

The results are presented in Figs. 5A and S3, where it is evident that only *A. carterae* was able to effectively utilize iron from FOB, consistent with our flow cytometry results. None of the species tested in our study showed efficient incorporation of iron into cellular proteins when iron was chelated by enterobactin, including *A. carterae*, indicating that this dinoflagellate preferably acquires hydroxamate-type siderophores. Experiments with the fluorescent conjugate of desferrioxamine B complexed with iron (FOB-NBD) further demonstrated the capacity for siderophore iron utilization by *Amphidinium*. The fluorescence of this siderophore conjugate is quenched by iron; therefore, the release of iron from siderophores can be monitored by flow cytometry. Fig. 5B, C presents an effective acquisition of iron from FOB by *A. carterae* traced in time, which contrasts with the absence of iron release from the siderophore by the rest of the members of the algal consortia (Fig. S4). These observations are additionally supported by our complex proteomic analysis, where we identified among *A. carterae* proteins downregulated by iron resupply, a potential siderophore binding protein that showed a 2.5-fold decrease 24 h after iron enrichment (CAMPEP\_0176544322, Table S1). It is a homolog of the *P. tricornutum* FBP1 protein that was recently shown to participate in iron acquisition from hydroxamate siderophores [26]. Homologs of FBP1 protein, identified in different marine microalgae, were shown to share a common ancestor with hydroxamate siderophore lipoprotein receptors found in gram-positive bacteria. The protein from *A. carterae* appears to be among the closely related homologs to the actinobacterial iron siderophore ABC transporter solute binding proteins [26].

**Table 1**

Effect of iron availability on the abundance of selected *A. carterae* and *P. tricornutum* proteins. Data represent fold change in protein abundance in iron-limited (LL) cells 24 h after iron supply (LR) and differences between iron-limited cells and cells grown under long-term iron-rich conditions (RR). *A. carterae* (highlighted in green) and *P. tricornutum* (highlighted in red) cells were cocultivated in a consortium that included *B. natans* and *H. triquetra*. An asterisk (\*) in the protein name denotes fold change higher than 2-fold as early as 6 h after iron enrichment.

| Protein name          | Organism | Protein ID             | 24 h LL-LR | 24 h LL-RR |
|-----------------------|----------|------------------------|------------|------------|
| Ascorbate peroxidase* | Ac       | CAMPEP_0176532796      | 4,6        | 4,0        |
| Ascorbate peroxidase* | Pt       | tr B7S491 B7S491_PHATC | 1,1        | 6,5        |
| AtpE*                 | Ac       | CAMPEP_0176614664      | 1,7        | 5,2        |
| AtpE                  | Pt       | sp AOT0D1 ATPE_PHATC   | 1,3        | 1,7        |
| AtpG                  | Ac       | CAMPEP_0176550046      | 1,6        | 1,1        |
| AtpG                  | Ac       | CAMPEP_0176641968      | 1,8        | 1,4        |
| AtpG                  | Pt       | sp AOT0E8 ATPF2_PHATC  | 1,8        | 1,1        |
| CREG1                 | Ac       | CAMPEP_0176541126      | -2,1       | -4,3       |
| CREG1*                | Pt       | tr B7G9B3 B7G9B3_PHATC | -23,5      | -2,0       |
| Fba classI            | Ac       | CAMPEP_0176532332      | 1,2        | -1,1       |
| Fba classI            | Ac       | CAMPEP_0176622298      | -1,2       | -2,0       |
| Fba classI            | Pt       | tr B7GE67 B7GE67_PHATC | -5,3       | -4,3       |
| Fba classII           | Ac       | CAMPEP_0176610888      | 1,9        | 2,8        |
| Fba classII           | Ac       | CAMPEP_0176614222      | -1,2       | -1,1       |
| Fba classII           | Ac       | CAMPEP_0176531794      | -1,3       | -1,1       |
| Fba classII*          | Ac       | CAMPEP_0176638318      | 1,4        | 1,5        |
| Fba classII           | Pt       | tr B7G4R3 B7G4R3_PHATC | -1,7       | 1,0        |
| Fba classII*          | Pt       | tr B7S3N8 B7S3N8_PHATC | 4,6        | 4,4        |
| Fba classII           | Pt       | tr B7G9G9 B7G9G9_PHATC | 1,4        | 4,3        |
| Flavodoxin            | Ac       | CAMPEP_0176557388      | -1,5       | -4,3       |
| Flavodoxin            | Ac       | CAMPEP_0176611622      | -1,5       | -3,9       |
| Flavodoxin            | Pt       | tr B7GCM3 B7GCM3_PHATC | -6,3       | -2,9       |
| Gsr_2                 | Ac       | CAMPEP_0176670554      | 1,4        | 1,3        |
| Gsr_2                 | Ac       | CAMPEP_0176627754      | -1,1       | -1,6       |
| Gsr_2                 | Ac       | CAMPEP_0176625460      | 1,0        | -2,3       |
| Gsr_2                 | Ac       | CAMPEP_0176635824      | -1,2       | -1,4       |
| Gsr_2                 | Ac       | CAMPEP_0176642616      | 1,1        | -1,8       |
| Gsr_2                 | Pt       | tr B7G326 B7G326_PHATC | -1,7       | -1,2       |
| Gsr_2                 | Pt       | tr B7G9G3 B7G9G3_PHATC | 1,1        | 1,2        |
| Gsr_2                 | Pt       | tr B7FZC3 B7FZC3_PHATC | NA         | 1,3        |
| Gsr_2                 | Pt       | tr B7G9Q1 B7G9Q1_PHATC | -2,1       | 1,5        |
| Gsr_2                 | Pt       | tr B7FVM3 B7FVM3_PHATC | -1,3       | -1,1       |
| ISIP2*                | Ac       | CAMPEP_0176513402      | -4,6       | -1,7       |
| ISIP2*                | Ac       | CAMPEP_0176599704      | -5,2       | -2,8       |
| ISIP2*                | Ac       | CAMPEP_0176611892      | -7,8       | -1,4       |
| ISIP2                 | Pt       | tr B7FYL4 B7FYL4_PHATC | -1,6       | -2,2       |
| ISIP2a                | Pt       | tr B7FYL2 B7FYL2_PHATC | -6,4       | -2,4       |
| ISIP2b*               | Pt       | tr B7G9B1 B7G9B1_PHATC | -13,8      | -4,5       |
| ISIP3                 | Ac       | CAMPEP_0176533694      | -4,1       | -2,6       |
| ISIP3*                | Pt       | tr B7G4H8 B7G4H8_PHATC | -6,5       | -4,8       |
| RbcL                  | Ac       | CAMPEP_0176611690      | 1,3        | 1,8        |
| RbcL                  | Pt       | sp Q9TK52 RBL_PHATC    | -1,1       | 1,3        |
| Lhcx                  | Ac       | CAMPEP_0176610792      | 3,0        | 2,4        |
| Lhcx                  | Ac       | CAMPEP_0176557516      | 1,1        | 1,9        |
| Lhcx                  | Ac       | CAMPEP_0176610966      | 2,2        | 4,0        |
| Lhcx                  | Ac       | CAMPEP_0176638146      | 2,2        | 1,6        |
| Lhcx                  | Ac       | CAMPEP_0176532122      | 1,5        | 1,3        |
| Lhcx                  | Ac       | CAMPEP_0176621150      | 1,5        | 2,0        |
| Lhcx                  | Ac       | CAMPEP_0176532000      | 1,4        | 1,6        |
| Lhcx                  | Ac       | CAMPEP_0176610776      | 2,4        | 2,4        |
| Lhcx                  | Ac       | CAMPEP_0176536776      | 1,4        | 1,3        |
| Lhcx                  | Ac       | CAMPEP_0176638270      | 1,5        | 1,1        |
| Lhcx                  | Ac       | CAMPEP_0176611302      | 1,7        | 1,8        |
| Lhcx                  | Ac       | CAMPEP_0176638538      | 1,5        | 1,7        |
| Lhcx                  | Pt       | tr B7FYL0 B7FYL0_PHATC | -1,1       | 1,3        |
| Lhcx*                 | Pt       | tr B7FVF9 B7FVF9_PHATC | -1,6       | 1,8        |
| Lhcx2                 | Pt       | tr B7FR60 B7FR60_PHATC | -5,5       | -4,7       |
| Magnesium chelatase*  | Ac       | CAMPEP_0176575976      | 2,3        | 3,1        |
| Magnesium chelatase   | Pt       | tr AOT0B5 AOT0B5_PHATC | 1,8        | 1,3        |
| Magnesium chelatase   | Pt       | tr B7FTA2 B7FTA2_PHATC | 1,5        | 2,8        |
| Magnesium chelatase*  | Pt       | tr B5Y3F4 B5Y3F4_PHATC | 3,1        | 1,8        |
| PetA                  | Ac       | CAMPEP_0176611648      | 1,6        | 1,8        |
| PetA*                 | Ac       | CAMPEP_0176535836      | 5,5        | 6,1        |
| PetA                  | Pt       | sp AOT0C9 CYF_PHATC    | 2,4        | 2,9        |
| PetB                  | Ac       | CAMPEP_0176617416      | 1,5        | -1,2       |
| PetB                  | Pt       | sp AOT0B8 CYB6_PHATC   | 3,1        | 3,6        |
| PsaA                  | Ac       | CAMPEP_0176651446      | 1,8        | -1,5       |
| PsaA                  | Pt       | sp AOT0M7 PSAB_PHATC   | 2,9        | 5,1        |
| PsaD                  | Ac       | CAMPEP_0176533106      | 2,9        | 2,1        |
| PsaD                  | Ac       | CAMPEP_0176564748      | 2,0        | 1,8        |
| PsaD*                 | Ac       | CAMPEP_0176538974      | 8,8        | 9,3        |

Table 1 (continued)

| Protein name | Organism | Protein ID             | 24 h LL-LR | 24 h LL-RR |
|--------------|----------|------------------------|------------|------------|
| PsaD         | Pt       | tr A0T0B9 A0T0B9_PHATC | 4,4        | 3,5        |
| PsaL         | Ac       | CAMPEP_0176639782      | 2,5        | 1,3        |
| PsaL         | Ac       | CAMPEP_0176557554      | 2,3        | 1,5        |
| PsaL*        | Ac       | CAMPEP_0176553508      | 2,9        | -1,1       |
| PsaL*        | Ac       | CAMPEP_0176533490      | 2,3        | 1,6        |
| PsaL*        | Pt       | sp A0T0M6 PSAL_PHATC   | 2,4        | 3,9        |
| PsbC         | Ac       | CAMPEP_0176554406      | 2,1        | 1,5        |
| PsbC         | Pt       | tr A0T096 A0T096_PHATC | 2,6        | 3,5        |
| PsbV*        | Ac       | CAMPEP_0176612574      | 2,9        | 3,9        |
| PsbV*        | Pt       | sp A0T0C6 CY550_PHATC  | 3,3        | 5,1        |
| SOD1         | Ac       | CAMPEP_0176541592      | 1,0        | 1,3        |
| SOD1         | Ac       | CAMPEP_0176525294      | 1,2        | 1,9        |
| SOD1         | Pt       | tr B7G0L6 B7G0L6_PHATC | 1,0        | 1,9        |

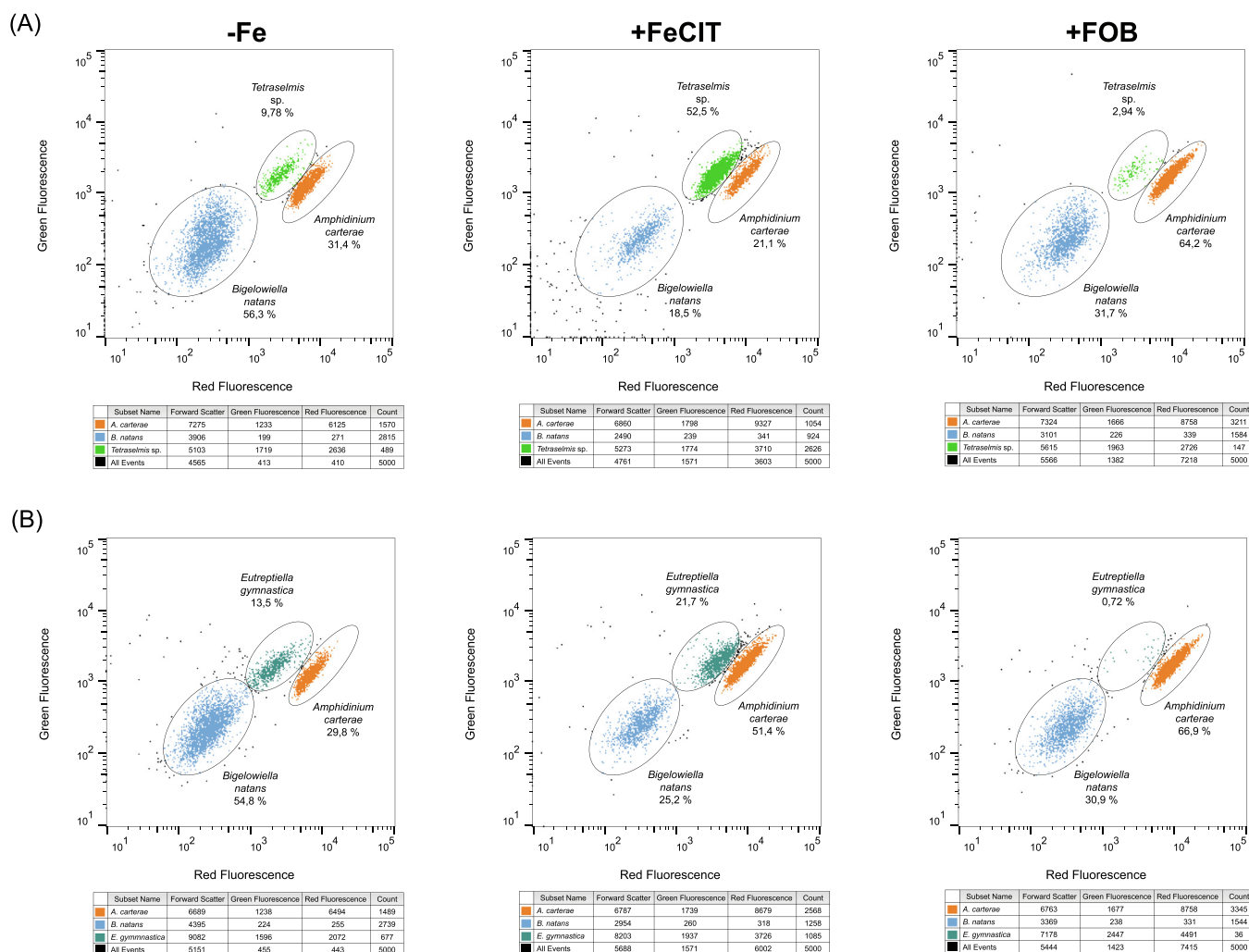
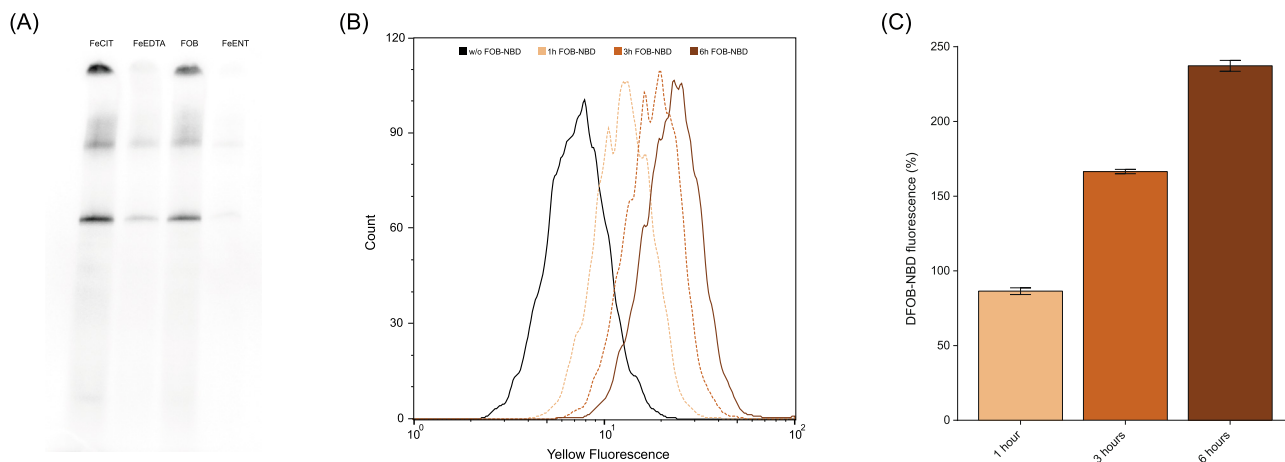


Fig. 4. Effect of FOB siderophore on cocultivated microalgae. Flow cytograms of two microalgal consortia, each containing three algal species ((A) *B. natans*, *Tetraselmis* sp., *A. carterae*; (B) *B. natans*, *E. gymnastica*, *A. carterae*) grown under iron-limited condition (-Fe), with iron supplemented in the form of ferric citrate (+FeCIT) and with iron provided as ferrioxamine B (+FOB). Tables under flow cytograms contain median values for Forward Scatter, Green Fluorescence and Red Fluorescence parameters together with cell counts for each species. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

#### 4. Discussion

Determining the effect of changing iron conditions on phytoplankton is important and challenging. In our study, we

established a cocultivation system with different combinations of species that allowed us to follow the effects of iron availability on members of the consortia by simple enumeration based on differences in fluorescence properties. Choosing species that have,



**Fig. 5.** Utilization of iron from FOB siderophore by *A. carterae*. (A) Incorporation of <sup>55</sup>Fe into *A. carterae* protein complexes determined by blue native electrophoresis separation of total cell extracts. Iron was supplemented in four different forms: FeCIT – ferric citrate (1:20), FeEDTA – ferric EDTA (1:10), FOB – ferrioxamine B (1:1.1), and FeENT – enterobactin (1:1.1). (B, C) *A. carterae* cells grown in iron-deficient medium for 7 days were supplemented with 1  $\mu$ M of the fluorescent conjugate of desferrioxamine B complexed with iron (FOB-NBD) and incubated for 1, 3 and 6 h. Intracellular accumulation of a nonquenched siderophore analog (after removal of iron) was measured on a flow cytometer using a yellow fluorescence detector (583/26 nm) and blue excitation laser (488 nm). (B) Representative histogram. (C) Fluorescence of DFOB-NBD (mean  $\pm$  SD, n = 3). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

at least to some degree, available genomes/transcriptomes, enabled us to study the molecular mechanisms behind adaptation to iron limitation via a proteomic analysis of complex samples. We were able to detect significant iron-induced changes in algal proteomes, including well-known markers of iron limitation, such as ISIPs, FBA, LHCX and subunits of PSI, ATP synthase and Cytochrome b6/f [20,22,27,28]. Time course analysis revealed a dynamic response to iron enrichment evidenced by a number of proteins that significantly changed as early as 6 h after iron supplementation. Changes in proteomes between iron-rich and iron-limited cells appear to be reached within 24 h after iron supply to iron-limited species.

Our study provides a proof-of-concept that it is possible, when suitable species and conditions are chosen, to reveal proteins whose expression is most significantly affected by nutrients in complex algal cultures, thus representing candidate markers for nutrient (and other) stress in natural marine phytoplankton. Such an experimental design represents an alternative to cocultivation systems where species are separated by membranes permeable to nutrients and metabolites but not cells. This system was successfully employed, for example, to describe the impact of *K. brevis* allelopathy on competing phytoplankton [29]. The advantage of our experimental design lies in the fact that it allows physiological and molecular analyses of phytoplankton consortia while allowing physical contact between the species. This design can be employed in studies involving processes within the phycosphere, such as bacterial-algal mutualism.

Importantly, our study showed that it is possible to analyze, with reasonable efficiency, proteomic changes in mixed cultures for species without well-annotated genomes, with analysis employing available transcriptomes. It is axiomatic that proteomic analyses of a multispecies model system have limitations, which were observable in the case of *B. natans* and *H. triquetra* in our study. Fewer than 750 proteins were detected for each of the two species. However, proteome coverage can be expanded by increasing the mass spectrometry detection capacity, e.g., by employing peptide or predigestion protein fractionation prior to proteomic analysis. Alternatively, FACS may be used for the separation of microalgal populations to allow maximal proteome coverage for each species in the consortium.

We touched an important methodological question of how to normalize proteomic data from complex ecological mixtures. The

combination of sPLS discriminant analysis and the extraction of p values from AUC analysis helped us to identify the effect of two types of consecutive normalizations. The raw data in Fig. 3A, B, C, D show high variances and group overlaps due to noise coming from different cell numbers per species. When we applied size-factor vector normalization from the cell counts, the variances slightly decreased, but some overlaps were still visible (Fig. 3E, F, G, H). To decrease the influence of outliers and differences in the abundances within proteomes, we used quantile normalization (second step) on cell count-normalized data. The effect of two-step normalization is obvious in Fig. 3I, J, K, L where the ellipses over the group data are smaller and overlap less with other groups. The important message here is that the predictive performance of proteomic analyses strongly depends on the type of data normalization, and that both the initial variance and the influence of outliers may well be sustained when using the two-step normalization presented in this manuscript.

Little is known about iron acquisition in *Amphidinium carterae*, although this model dinoflagellate was used more than 40 years ago to suggest the significance of grazing on phytoplankton in iron recycling in marine environment [30]. The main finding that emerged from our study was the ability of *A. carterae* to utilize iron from FOB siderophores. Reports about the use of siderophore-bound iron by eukaryotic phytoplankton are rare [11,31,32], and molecules involved in this iron uptake pathway are only suggested for the model diatom *P. tricornutum* [4,26]. It is now believed that siderophores represent an important part of ocean microbial iron cycling, showing changing abundance and composition across ocean regions with varying iron availability [33]. The ability to utilize iron from xenosiderophores may give *A. carterae* an advantage in ecosystems where such form of iron is abundant. In fact, cocultivation with bacteria has been shown to promote the growth of *A. carterae* in nutrient-limited media, including conditions of trace-metal limitation [34]. Importantly, our proteomic analysis revealed that the *A. carterae* homolog of siderophore binding protein was dynamically regulated by iron availability. The fact that this protein has been shown to be involved in siderophore acquisition in the taxonomically distant diatom *P. tricornutum* highlights the effect of a nutritionally poor ocean environment on molecular evolution. This fascinating phenomenon is particularly obvious through the virtually universal presence of phytoferritins in marine eukaryotic phytoplankton. Notably, the iron enrichment-



induced downregulation of these recently discovered major players in iron uptake was also detected in all species of our coculture model. Both phytoferritin-mediated and siderophore-bound iron uptake mechanisms are most likely based on elaborate machinery involving endocytosis [35]; thus, this adaptation to life under iron-limited conditions requires complex fine-tuning.

Our study demonstrates an efficient tool that allowed us to follow community dynamics in mixed cultures of model eukaryotic phytoplankton species and determine concomitant changes at the molecular level. We believe that such an approach, complementary to field investigation, may be employed to better understand phytoplankton responses to environmentally relevant changes in nutrient availability, pH or temperature.

### CRediT authorship contribution statement

**Ronald Malych:** Data curation, Investigation, Visualization, Writing – original draft. **Pavel Stopka:** Formal analysis, Methodology, Writing – review & editing. **Jan Mach:** Methodology, Validation, Writing – review & editing. **Eva Kotabová:** Investigation, Methodology. **Ondřej Prášil:** Validation, Writing – review & editing. **Robert Sutak:** Conceptualization, Funding acquisition, Project administration, Supervision, Validation, Writing – original draft.

### Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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In a memory of Emmanuel Lesuisse.

### Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.csbj.2021.12.023>.

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