

# Lipids in benthic diatoms: A new suitable screening procedure

Eva Cointet, Gaëtane Wielgosz-Collin, Vona Méléder, Olivier Gonçalves

## ▶ To cite this version:

Eva Cointet, Gaëtane Wielgosz-Collin, Vona Méléder, Olivier Gonçalves. Lipids in benthic diatoms: A new suitable screening procedure. Algal Research - Biomass, Biofuels and Bioproducts, 2019, 39, pp.101425. 10.1016/j.algal.2019.101425 . hal-02333689

# HAL Id: hal-02333689 https://hal.science/hal-02333689

Submitted on 22 Oct 2021

**HAL** is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers. L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.



Distributed under a Creative Commons Attribution - NonCommercial 4.0 International License

## 1 Lipids in benthic diatoms: a new suitable screening procedure

## 2 Short title: Screening and rapid selection of lipid rich benthic diatoms

3 Eva Cointet<sup>1</sup>, Gaëtane Wielgosz-Collin<sup>1</sup>, Vona Méléder<sup>1</sup>, Olivier Gonçalves<sup>2</sup>

<sup>1</sup> Université de Nantes, Laboratoire Mer Molécules Santé, EA 21 60, BP 92208, 44322 Nantes,
France

<sup>2</sup> Université de Nantes, GEPEA, UMR CNRS-6144, Bât.CRTT, 37 Boulevard de l'Université,
BP406, F-44602 Saint-Nazaire Cedex, France

### 8 Abstract

9 The selection of suitable and indigenous microalgae species is a fundamental requirement 10 in developing added-value bioactive compounds recoverable in the food, health, and cosmetics markets. In this work, an integrated screening approach was developed to characterize the lipid 11 12 rate of 33 diatom species (including 15 species studied for the first time) belonging to 16 genera 13 from the Nantes Culture Collection, with the main objective of discovering bioactive lipid 14 producers. For that purpose, a simple reliable method for establishing growth kinetics of strains 15 and semi-quantitative analysis of lipid rates was developed. Growth kinetics measurements 16 were achieved by daily minimal measurement fluorescence (F0) whereas lipid rate analyses 17 were performed by high-throughput Fourier Transform Infrared spectroscopy on entire cells 18 and lipid extracts. Results indicated that the method could be used directly on entire cells in 19 spite of the presence of silica for the FTIR approach (due to frustule). The total lipid rate was 20 species-dependant and ranged from 3.7% to 30.5% DW. Six strains out of 33 were found to 21 present a higher total lipid rate superior to 15% DW, and 11 showed medium lipid rates ranging 22 from 10% to 15% DW. The results revealed that five diatom species i.e. Amphora sp. NCC169, 23 Nitzschia sp. NCC109, Nitzschia alexandrina NCC33, Opephora sp NCC366 and Staurosira 24 sp. NCC182 presented interesting growth capabilities and should be further investigated as 25 potential sources for their original lipid rate.

26	
27 28	Keywords: FTIR spectroscopy, growth kinetics, benthic Diatoms, lipid rate, bioactive fatty
29	acids.
30	
31	Highlights
32	- Minimal fluorescence measurement characterized growth capabilities
33	- FTIR spectroscopy on whole cells characterized lipid rates
34	- Lipid rates of 15 strains were highlighted for the first time
35	- Five strains of benthic diatoms were selected for furthers biotechnology applications
36	
37	*Corresponding authors
38	Email: olivier.goncalves@univ-nantes.fr (Olivier Gonçalves), eva.cointet@univ-
39	nantes.fr (Eva Cointet), vona.meleder@univ-nantes.fr (Vona Méléder), Gaetane.Wielgosz-
40	Collin@univ-nantes.fr (Gaëtane Wielgosz-Collin).
41	Preprint submitted to Algal Research September 09, 2018
42	
43	Conflict of interest
44	The authors declare that there is no conflict of interest. No conflicts, informed consent, human
45	or animal rights are applicable to this work.
46	
47	Author's contribution
48	Eva Cointet, Gaëtane Wielgosz-Collin, Vona Méléder and Olivier Gonçalves designed and
49	supervised the research. Eva Cointet, Gaëtane Wielgosz-Collin, Vona Méléder and Olivier
50	Gonçalves conducted experiments. Eva Cointet, Gaëtane Wielgosz-Collin, Vona Méléder and

- 51 Olivier Gonçalves analyzed and interpreted the data and drafted the manuscript. Eva Cointet,
- 52 Gaëtane Wielgosz-Collin, Vona Méléder and Olivier Gonçalves critically reviewed the
- 53 manuscript. All authors read and approved the final version of the manuscript.
- 54

## 55 Acknowledgements

- 56 This work was supported by the regional Atlantic Microalgae research program (AMI), funded
- 57 by the Pays de la Loire region. We also express our sincere thanks to GEPEA staff in particular
- 58 Remy Coat and Delphine Kucma for support and advice on the FTIR spectrometer.

- 59 Abbreviation
- 60 ATR: Attenuated Total Reflectance
- 61 AW: Ash weight
- 62 DW: Dry weight
- 63 DHA: Docosahexaenoic acid
- 64 EPA: Eicosapentaenoic acid
- 65 FA: Fatty acid
- 66 F0: Minimum chlorophyll fluorescence
- 67 HTSXT-FTIR: Fourier-transform infrared spectroscopy high-throughput screening extension
- 68 LED: Late exponential day
- 69 LED biomass: Biomass corresponding to culture harvest days
- 70 MUFA: Monounsaturated fatty acid
- 71 NCC: Nantes Culture Collection
- 72 NDVI: Normalized Difference Vegetation Index
- 73 N: Nitrogen
- 74 PFD: Photon flux density
- 75 PAM: Pulse amplitude modulation
- 76 PAR: Photosynthetically active radiation
- 77 PUFA: Polyunsaturated fatty acid
- 78  $\rho$ : Reflectance
- 79 SD : Standard deviation
- 80 Si : Silica
- 81 SFA: Saturated fatty acid
- 82 TAG: Triacylglycerol
- 83 µmax: Maximum growth rate
- 84

### 85 1 Introduction

86 In the last two decades, a large body of research has focused on finding new strains of 87 microalgae capable of producing high lipid content for a wide range of applications including 88 pharmaceutical, cosmetics and alternative biofuels [1-4]. In the kingdom of microalgae, 89 diatoms are very accessible resources, since they are ubiquitously found in most aquatic 90 environments (rivers, oceans, coastal areas). They constitute a unicellular eukaryotic group with 91 a typical species-specific siliceous cell wall (also known as frustule). They present different 92 life-forms that could be benthic (microphytobenthos) or planktonic (phytoplankton). Marine 93 diatoms can grow quickly and store large amounts of lipids [5]. Their lipids are mainly 94 composed of a neutral fraction with traces of sterols and polar lipids [6]. Neutral lipids 95 constitute the reserve fraction, with triacylglycerol (TAG) accounting for more than 60% of the 96 total lipids [7]. Their PUFAs are mainly composed of eicosapentaenoic acid (EPA, C20:5 n-3) 97 [8] but some strains were also found to present docosahexaenoic acid (DHA, C22:6 n - 3) [9]. 98 The biosynthesis of the lipids varies within the different diatom species, their growth stages, 99 and environmental parameters [10,11]. Previous studies [5–9] have demonstrated their ability 100 for lipid production, more specifically for the PUFA fraction (DHA and EPA), recognized for 101 its broad spectrum bioactivities (anti-carcinogenic, immune modulation, anti-diabetic, anti-102 obesity and anti-thrombotic properties) [12]. Unfortunately, the Diatoms group is poorly 103 studied and constitutes therefore an underexploited resource [13] even if the number of their 104 genera and species is estimated to be between 250 and 100,000 [14]. Bioprospecting efforts 105 should therefore be encouraged in order to assess this potential. Basically, bioprospecting would 106 be achieved if the identified microalgae could be exploited at an industrial scale for their 107 biomass or their high value lipid compounds [1]. Therefore, during the screening approach, 108 specific focus should be performed on the efficient identification of the appropriate microalgae 109 strains, i.e. those characterized by high productivity (biomass and lipids), high resistance to 110 contamination and high tolerance to a wide range of environmental parameters [15–18]. Native 111 species adapt to local environmental changes and should be thus resilient and competitive 112 enough regarding these criteria. However, systematic estimation of the growth rates requires a 113 time-consuming series of measurements in order to estimate biomass evolution. The cell count 114 approach is among the most widely used. Alternatively, other parameters could be measured as 115 proxy for the cell numbers, if it could be shown to be linearly correlated. Typical proxy 116 measurements are *in vivo* fluorescence [19], optical density and biomass direct estimation (such 117 as dry weight, pigment content) [20] and in vivo or in solvent spectroscopy [21]. The 118 concentrations of protein, carbohydrates and lipids in cultures could also be used as proxy 119 measures depending of the robustness of their linear relationship with either cell numbers or 120 biomass. Finally, the cell number is recognized as being a robust reference method if "counting 121 methods" are easily available and could be applied to a given biological system. Only *in vivo* 122 fluorescence and spectroscopy seem to be faster than cell counting and are easy to use. For 123 these reasons, one of the objectives of this study is to test both techniques as an alternative to 124 counting in the screening process. Conventional methods used for lipid determination, 125 systematically require solvent extraction and gravimetric determination. These methods are 126 time consuming, need extensive manipulations, use high amounts of biomass (10-15 mg [22]) 127 and have a low throughput screening rates. Consequently, a faster measurement of the lipid 128 content is needed [23]. As for counting methods, alternative approaches exist, that can be 129 roughly classified into invasive and non-invasive techniques. Fluorescent based technologies 130 are the most commonly used and require fluorescent dyes like Bodipy. However, it is an indirect 131 measure that has several issues such as sample preparation before staining, careful choice of 132 dye especially in microalgae due to the presence of chlorophylls within chloroplasts, leading to 133 non-quantitative information [24]. Vibrational spectroscopy such as Raman [25] could be a 134 good alternative for investigating lipid content since it can image and chemically identify the

135 lipids without labelling. However, autofluorescence signals from the chloroplast will 136 overwhelm the Raman signal. Increasing the acquisition time or incident power can solve this 137 issue, although irreversible photo damage may result, leading to loss of the semi-quantitative 138 information, limiting therefore its use in the context of high-throughput screening. Infrared 139 spectroscopy has advantages over the above techniques, since it limits photodamage, is not 140 influenced by autofluorescence, and presents robust systems such as high-throughput screening 141 for chemical spectra acquisition for large quantities of samples. Coat et al. demonstrated [26] 142 that it was robust and sensitive enough to quantify the lipids and that directly on entire 143 microalgae cells. The second objective of this study was to test this technique as an alternative 144 to gravimetric determination of lipid content.

145 In the present work, we propose to explore the potential for original lipid sourcing of the benthic 146 diatoms hosted in the Nantes Culture Collection (NCC) bank. First - to identify the NCC strains 147 that could potentially produce interesting fatty acids – a bibliographic inventory of current and 148 past knowledge of the principal genus and species hosted in the NCC bank was conducted. It 149 focused on the families of molecules with high added value for pharmacology, health, nutrition, 150 and cosmetics such as PUFAs, taking also into account the influence of cultural conditions 151 [27,28]. The selected species were then, investigated to gain basic knowledge on their biological 152 characteristics, to highlight their chemo diversity (in terms of protein, carbohydrates, silica and 153 lipid rates), and finally on their potential for high-value fatty acid molecule biosynthesis. To 154 select the most promising NCC strains, an original workflow was developed, integrating 155 different steps including the analysis of the NCC strain growth and their rapid biochemical 156 profiling through HTSXT-FTIR. The results obtained in the present study are discussed 157 hereafter.

### 158 2 Material and methods

### 159 2.1 Strains cultivation

160 Diatom strains from the NCC were selected and cultivated in 250 mL Erlenmeyer flasks filled 161 with 150 mL of F/2 culture medium, enriched in silica using 0.47  $\mu$ m filtered natural sea water 162 [29, 30]. Vitamins and carbonates were added before autoclave sterilization (Autoclave Vertical 163 Lequeux AUV 100L), salinity was adjusted at 28 and pH was fixed at 7.8 to reduce nutrient 164 precipitation. Inoculation of each strain was performed from the stock cultures with an initial concentration of 30 000 cells.mL<sup>-1</sup>. The diatom strains were thus grown at 16°C with a photon 165 flux density (PFD) of 127  $\mu$ mol photons m<sup>-2</sup> s<sup>-1</sup> provided under continuous light to the bottom 166 167 of flasks by flat led pannel (LP EPURE-Chateaugiron, France).

### 168 2.2 Growth parameter estimations

169 To retrieve the growth parameters on the screened strains, the growth rate ( $\mu$ max in day<sup>-1</sup>) and 170 the end of the exponential phase were identified. The growth rate identifies the faster growing 171 strains. The end of the exponential phase, known to be the period of lipid accumulation [31], 172 identifies the harvest day for lipid analyses. These parameters were retrieved using daily 173 biomass estimation. All erlen flasks and stir bars were autoclaved. Before sampling, flasks were 174 agitated by magnetic stirring for 2 minutes allowing cell and nutrient homogenization and 175 aggregate destruction.

176 Alternative techniques were tested to replace the cell counting by hemocytometer (here 177 Neubauer;  $n \ge 300$ ) which is a time-consuming technique.,

178 - Minimum chlorophyll fluorescence measurement (F0) by fluorometry PAM (Water-PAM,

179 Waltz, Germany). This parameter, proportional to Chl *a* content, was used as a proxy of the

180 vegetal biomass [32]. Measurements were made directly on the microalgal suspension.

 $\begin{array}{rl} 181 & - \operatorname{Reflectance}(\rho) \mbox{ of the cells by spectroradiometry (Jaz, Ocean Optics, USA) in the PAR domain (400-700 nm). Reflectance values were used to calculate the Normalized Difference Vegetation Index (NDVI) following the equation. (1), known to be proportional to Chl$ *a* $content and used as a biomass proxy [21]. Measurements were made on filtered microalgae using CML microfiber filters with a 25 mm diameter and a 0.7 µm pore diameter and a 25mm Whatman filter funnel. \\ \end{array}$ 

187 
$$NDVI = \frac{\lambda 750 - \lambda 675}{\lambda 750 + \lambda 675}$$
 eq. (1)

188 With  $\lambda$ 750: maximal reflectance wavelength, and  $\lambda$ 675: Chl *a* absorption wavelength 189

Daily measurements were performed on each sample of culture to follow the growth kinetics (at the beginning of the growth phase and during three days, between 3 mL and 5 mL of cultures were sampled, and then 2 mL until the end of the growth). To extract and compare the growth parameters from the alternative techniques and the cell count approach, the Gompertz model [33] was used to fit the growth data (equation. 2) using MATLAB software. It consisted of a latency phase followed by an exponential phase and a stabilization of the curve at its maximum phase.

197 
$$f(x) = A \times e^{-e(\mu max \times \frac{e^{1}}{A} \times (\lambda - x) + 1)}$$
 eq. (2)

198 With A: maximum cell concentration in the natural logarithm of the biomass (number of cells.

199 mL<sup>-1</sup>, F0 or NDVI);  $\mu$  max: Maximum growth rate (day<sup>-1</sup>);  $\lambda$  : Latency (days).

The *A* parameter allows calculation of the biomass (LED<sub>biomass</sub>) obtained at the late exponential
day (LED) (equation. 3). This corresponded to the harvest day for the lipid analyses.

202 
$$LED_{biomass} = exp(A + log(Bmin))$$
 eq. (3)

203 With Bmin = Initial biomass (number of cells.mL<sup>-1</sup>, F0 or NDVI);  $LED_{biomass}$  = biomass of the 204 late exponential day (cell.mL<sup>-1</sup>, F0 or NDVI)

The comparison of the three thechniques, and the selection of the fastest one to estimate the growth parameters was done using a panel of 6 very different strains, chosen for their different growth kinetics and their different morphology (aggregate of cells, cells in chains or solitary cells) : *Amphora* sp. 1 NCC260, *Entomoneis* sp. 1 NCC350, *Entomoneis* sp. 6 NCC335, *Entomoneis paludosa* NCC18.2, *Extubocellulus cribriger* NCC229 and *Navicula* sp. 2 NCC226.

212

#### 2.3 Diatom strain characterisation

At the end of the exponential phase (LED), when the cells were harvested for HTSXT-FTIR analyses (see §2.4), several analysis were perforemd to collect more information about the strains:

- the cell length and the width were estimated using the image of light microscopy (OLYMPUS
CH40, ×400; n=150).

- the dry weight (DW) of the biomass was estimated by filtering 150 mL of algal suspension through a microfiber filter, Whatman 47 mm diameter,  $0.7 \,\mu$ m pore. The filters containing the cells were washed using 10 mL of ammonium formiate (3%) to the remove salt. The wet filters were frozen at -80°C and freeze-dried under a vacuum. DW (g.L<sup>-1</sup>) and  $\mu$ max (day<sup>-1</sup>) were then used to estimate the strain productitivty (Px) in g.L<sup>-1</sup>.day<sup>-1</sup> (equation. 4).

223 
$$Px = \mu \max \times DW \qquad \text{eq. (4)}$$

- the strains total lipid rate was assessed by gravimetric assay, to compare it to the infrared semiquantitative measurments (HTSXT-FTIR, see § 2.4). Biomass filtered, washed and freeze-dried
for dry weight estimation were used for lipid content estimation. The filters were macerated in
flasks using 100 mL of solvent per gram of biomass (dichloromethane-methanol (1:1 V/V))
[34]. Maceration at ambient temperature was performed for 24H on a vibrating tray (Edmund
Bühler GmbH, SM-30). After maceration, the mixture was filtered on pleated filters, 190 mm
diameter, 10µm pore, to remove the filter debris and the silica fragments. The filtrates were

transferred into a separatory funnel with 20 mL of distilled water and shaken for 5 min. The lipid fraction (organic phase) was then separated from the separatory funnel, dried using an anhydrous sodium sulfate salt, filtered, evaporated and weighed to obtain the crude lipid extract (CLE) value. Total lipid rate (TLR) was finally expressed in % of the DW (equation. 5).

235 
$$TLR = \frac{CLE}{DW} \times 100 \qquad \text{eq. (5)}$$

- the silica content of the cells was also determined to ensure the normalization of the FTIR
semi-quantitative results (see § 2.4). Cultures were harvested by filtering new 150 mL of the
algal suspension using the same recovery cell procedure used for dry weight estimation. Filters
were then freeze-dried, weighed (DW) and heated at 400°C for four hours in a muffle oven and
weighed (AW) and the silica proportion evaluated in % of DW by equation. 6 :

241 
$$Silica \ content = \frac{AW}{DW} \times 100$$
 eq. (6)

#### 242

#### 2.4 Molecular profiles measured by infrared spectroscopy

The FTIR spectra acquisition on entire cells was performed according to Coat et al. 2014 243 recommendations [26]. It consisted in concentrating the cells up to  $10^6 - 10^8$  cells.mL<sup>-1</sup> by 244 245 centrifugation (10 000g for 5 min) using Sigma 3K30 centrifuge. The supernatant was removed, and the pellet resuspended in an ammonium formiate isotonic solution (68 g.L<sup>-1</sup>). This process 246 247 was repeated twice to wash out the cells from the growth medium in order to avoid medium 248 contribution on the FTIR spectra. The cells were thus resuspended in 1mL in an isotonic 249 solution. Ammonium formiate solution prevents cell lyses during washing [35]. For the FTIR 250 spectra acquisition, a Bruker tensor 27 FTIR spectrometer equipped with a HTSXT plate reader 251 module coupled to OpusLab v 7.0.122 software (Bruker Optics, Germany) was used. Rinsed 252 cell aliquots of 5 µL were deposited on a 384 well microplate, void-dried in a vacuum desiccator 253 for at least 24 hours. FTIR spectra were then recorded in transmission mode directly on the 254 microplate loaded with the dried samples. This method was chosen since it is fast and non255 invasive on intact diatom cells, their biochemical signatures expressed in term of total lipids, 256 total proteins and total carbohydrates superimposed partially with the silica signal of the diatom 257 frustul. To confirm the whole cells FTIR spectra results, estimation of the lipid rate was also 258 performed on crude lipid extract, using attenuated total reflectance sampling system (ATR), 259 that was more suitable forcrude organic extracts. For the acquisition of the ATR spectra,  $10 \,\mu L$ 260 of crude lipid extract (see §2.3. [34]) were deposited directly on the Bruker tensor 27 FTIR spectrometer lens. The absorbance spectra were all collected between 4 000 cm<sup>-1</sup> and 700 cm<sup>-1</sup> 261 262 with 30 scans and averaged. The spectra were analyzed by relatively straightforward methods 263 such as peak ratios or integral ratios [36]. The lipid signature was associated to the CH<sub>2</sub>-CH<sub>3</sub> signal ( $\sim 3000 - 2800 \text{ cm}^{-1}$ ) and the ester bond (Eb) signal ( $\sim 1740 \text{ cm}^{-1}$ ). The carbohydrate 264 265 signature was associated to the C-O-C signal of the polysaccharides (~1200-900 cm<sup>-1</sup>) [37]. The protein signature was associated to the amide II band (~1540 cm<sup>-1</sup>) of the N-H of the amides 266 267 associated to the proteins. The silica signature was associated to the Si-O signal of the silicate 268 frustule (~1068 cm<sup>-1</sup>) [38]. To estimate the relative content of the lipids, carbohydrates and proteins, their respective peak heights (i.e. ester bond +  $(CH_2 + CH_3)$ , ~1159 cm<sup>-1</sup> and amide II) 269 270 were standardized to the silica peak [39]. (equation 7). For the crude lipid extract spectra, the 271 ratio used for that purpose was the ester bond and the  $CH_2 + CH_3$  signals standardized with the 272 total spectrum area (equation 8). FTIR and ATR ratio were expressed in arbitrary units 273 abundance (a.u).

274 
$$FTIR = \frac{Peak \ height \ (S)}{Silica \ peak \ high} eq. \ (7)$$

S = lipids (
$$eb+(CH_2+CH_3)$$
) or carbohydrates (~1159 cm<sup>-1</sup>) or amide II (~1540 cm<sup>-1</sup>)

276 
$$ATR = \frac{Peak area (eb+CH_2+CH_3)}{Total spectra area} eq. (8)$$

The Pearson product-moment correlation was carried out to test the positive correlation between the growth curves obtained with the cell count (Cells.mL<sup>-1</sup>), fluorescence (F0) and reflectance (NDVI).

281 Comparison of the growth rate and LED estimated from the three techniques for the selected 282 species were performed using ANOVA when the data presented normal distribution or the 283 Kruskal – Wallis test when the data distribution was not normal. It was systematically followed 284 by the Tuckey post hoc test. The ANOVA was also performed on the growth rate (µmax), 285 production (Px) and lipid rate (TLR) results to identify the strains with the highest performance. 286 A multivariate correspondence analysis was performed on the FTIR ratio normalized by silica 287 for lipids, protein and carbohydrates to assess the dispersion of the biochemical information 288 across the screened species and to identify if strains could be classified according to this 289 information. This method was chosen since it analyzes binary, ordinal and nominal data without 290 distributional assumptions (unlike traditional multivariate techniques) and also to preserve the 291 categorical nature of the variables. The correspondence analysis provided a unique graphical 292 display showing how the variable response categories were related [40].

The Pearson product-moment correlation was used to test the correlation between the calculation methods using the FTIR spectra semi-quantitative information with the total lipid quantification reference method (the gravimetric approach). The Pearson product-moment correlation and the comparison of the growth parameters were carried out using SigmaStat 3.1 software. The Past3 software was used for the correspondence analysis approach. All experiments were performed in triplicate.

Finally, all the information and tests were combined and used for the validation of the screening methodology to characterize the diatom strains of the NCC and the selection of candidates presenting the best potential in terms of growth capabilities and lipid rates.

### 302 3 Results

### 303 3.1 Determination of the growth parameters

The latency, exponential and stationnary phases were observable whatever the technique used to establish the growth curve for the 6 strains selected for their different kinetic behaviour (Fig. 1). Moreover, the cell count, NDVI and F0 data were all correlated (Tab.1) confirming the same growth pattern. Cell count and NDVI were positively correlated (p<0.001) as cell count and F0 (p<0.001). R values for the NDVI varied from 0.70 to 0.90 and for F0 measurements from 0.60 to 0.93.



Figure1. Example of growth curves measured for *Amphora* sp 1 NCC260 by (A) cell count, (B) fluorometry PAM (F0) and (C) radiometry (NDVI). Points corresponding to cell concentration according to time. Line curves corresponding to the Gompertz model fitted to cell concentration as a function of time. n=3, vertical bar = SD. The arrows indicate the late exponential day estimated by the Gompertz model.

315

#### 317 **Table 1.** Pearson product correlation between radiometry (NDVI) and cell count and

Species	NDVI	F0
Amphora sp. 1 NCC260	0.90	0.93
Entomoneis paludosa NCC18.2	0.86	0.82
Entomoneis sp. 1 NCC335	0.86	0.81
Entomoneis sp. 6 NCC350	0.80	0.60
Extubocellulus cf cribriger NCC229	0.70	0.90
Navicula sp. 2 NCC226	0.80	0.78

318 fluorometry PAM (F0) and cell count. Correlation was significant (p <0.001)

319

320 There were no significant differences (p > 0.05) between the technique used to estimate the 321 growth rate (µmax) and the late exponential day (LED) for the six tested species, except for the 322 µmax value estimated for *Entomoneis paludosa* (Tab. 2). For example, *Amphora* sp. 1 reached 323 the late exponential phase at the day c.a. 13 (LED, Fig. 1, Tab. 2) with a mean µmax of c.a. 324 0.81 (Tab. 2). At this time, the maximum biomass was reached by the cell count indicator with  $4.5 \pm 0.2 \times 10^6$  cells.mL<sup>-1</sup> by PAM fluorometry with F0 values  $2785 \pm 609$ , and by radiometry 325 326 with NDVI reaching  $0.47 \pm 0.05$ . Because the fluorimetry is used extensively for the 327 measurement of extracted Chl *a*, for the estimation of the phytoplankton Chl *a in vivo* [19,41] 328 and do not need filtration of high amounts of culture (contrary to NDVI), it was selected as an 329 fast and reliable alternative approach to the cell count to determine the growth rates of all 330 selected diatom strains in this study. Regarding *Entomoneis paludosa*, a new experiment using 331 only PAM measurments, in the same culture conditions but without counting and NDVI 332 estimation were conducted. µmax values obtained were 0.52, 0.55, 0.55, leading to an average 333 value of  $0.54 \pm 0.016$ . A second statistical test performed on these new data concluded no 334 significant difference for  $\mu$  max and LED (p = 0.47).

Table 2. Values of the growth parameters (maximum growth rate,  $\mu$ max (in d<sup>-1</sup>) and late exponential day, LED (in days)) retreived from the Gompertz model using six species employed for the comparison of the cell count approach with two alternative techniques: Fluorometry

338 PAM and radiometry. The calculated P value corresponded to the ANOVA test except for the 339 (\*) values that were obtained using the Kruskal-Wallis test. N=3, independent measurements,  $\pm$  SD.

Species	Techniques	µmax (day-1)	LED (day)	P value (µmax)	P Value (LED)
Amphora sp 1	Cell count	$0.76 \pm 0.10$	$13 \pm 1$	P-0.8	<b>D-</b> 0.16*
Ampnora sp. 1	Pam	$0.78 \pm 0.30$	$14 \pm 1$	r=0.0	r=0.10 <sup>+</sup>
NCC200	Spectroradiometer	$0.88 \pm 0.25$	$12 \pm 2$		
Entomoneis	Cell count	$0.50 \pm 0.03$	$12 \pm 1$	D < 0.051	D 0 07*
paludosa	Pam	$0.95 \pm 0.23^{1}$	$10 \pm 0$	P≤0.05 <sup>1</sup>	P=0.07*
NCC18.2	Spectroradiometer	$0.47 \pm 0.01$	$10 \pm 0$		
Entomoneis	Cell count	$0.53 \pm 0.10$	$14 \pm 1$	D 0 27	D 0 14*
sp. 6	Pam	$0.54 \pm 0.12$	$12 \pm 1$	P=0.27	P=0.14*
NCC335	Spectroradiometer	$0.32 \pm 0.14$	$12 \pm 2$		
Entomoneis	Cell count	$0.24 \pm 0.01$	$16 \pm 2$		
sp. 1	Pam	$0.37 \pm 0.12$	$14 \pm 1$	P=0.29	P=0.09
NCC350	Spectroradiometer	$0.35 \pm 0.06$	$14 \pm 1$		
Extubocellulus	Cell count	$0.68 \pm 0.04$	$14 \pm 1$	D 0 10	D 0 14
cf cribriger	Pam	$0.81 \pm 0.01$	$9 \pm 0$	P=0.10	P=0.14
NCC229	Spectroradiometer	$0.83 \pm 0.07$	$10 \pm 3$		
Manifestar and 2	Cell count	$0.91 \pm 0.04$	$8 \pm 0$	D 0 42*	D 0 79*
Navicula sp. 2	Pam	$1.02 \pm 0.23$	8 ± 2	P=0.42*	P=0.78**
NCC220	Spectroradiometer	$0.87 \pm 0.02$	$9 \pm 2$		
<sup>1</sup> Entomoneis pal	udosa µmax value for	the second run v	vas 0.54 and ass	ociated P value was 0.	47

342

### 3.1.1 Diatom strain characteristics

343 Among the 68 screened strains, 33 were cultivated successfully and 36 did not grow 344 (supplementary data 1). This information is reported in Tab. 3, (with the NCC reference, the 345 sampling location, the cell size, the LED, the growth rate, the silica content, the DW and lipid 346 rate). Globally the cell length varied from  $58 \pm 14 \,\mu\text{m}$  (*Craspedostauros* sp. 2 NCC218) to 4.8 347  $\pm$  0.7 µm (*Extubocellulus cf cribriger* NCC229). The cell width varied from 22.6  $\pm$  4.1 µm 348 (Lithodesmium sp NCC353) to  $2.9 \pm 0.4 \mu m$  (Fallacia sp. 1 NCC303). The end of the 349 exponential phase, corresponding to the harvest day (LED), varied from day 6 for Surirella sp. 350 1 NCC270 to day 16 for Craspedostauros britannicus NCC228 and Navicula sp. 1 NCC113 351 (ANOVA, p < 0.001). Three groups were therefore identified depending on their growth rate: 352 group A, included Nitzschia alexandrina NCC33 and Entomoneis sp. 5 NCC302 with respective growth rates of  $1.89 \pm 0.10$  and  $1.50 \pm 0.18$  day<sup>-1</sup>, group B with 13 species (i.e 40%) 353 354 of the total number of strain) presented a growth rate ranging from  $1.19 \pm 0.08$  to  $0.81 \pm 0.09$ 

355 day<sup>-1</sup> and group C with 18 species (54%) had a growth rate below 0.8 day<sup>-1</sup> with a minimum at 356  $0.22 \pm 0.05 \text{ day}^{-1}$ .

357 To ensure the standardization of the FTIR results for inter species comparison purposes, the 358 total silica rate was evaluated for the 33 species. It showed a significant difference (ANOVA, 359 p < 0.01), where five species (i.e. 15% of the total number of strains) had a silica content of c.a. 360 40% of the dry weight with a maximum of  $46.11 \pm 4.58\%$  for *Entomoneis* sp 1 NCC350. Three 361 species (i.e. 9% of the total number of strains) presented a silica content of c.a. 23% of the dry 362 weight with a minimum of  $22.9 \pm 2.6\%$  for *Conticriba weissflogii* CCMP1336. In the other 363 species, representing more than 75% of the total number of strains, the differences were not 364 significant (ANOVA, p = 0.055), supporting a stable silica content situated at around 35% DW. The dry weight (DW) biomass values of the assessed strains ranged from  $0.502 \pm 0.039$  g.L<sup>-1</sup> 365 (*Craspedostauros britannicus* NCC195) to  $0.065 \pm 0.001$  g.L<sup>-1</sup> (*Entomoneis* sp. 3 NCC351). 366 For three strains (9% of the total number of strains) the DW was greater than 0.30 g.L<sup>-1</sup>. For 27 367 strains (81%) the biomass was greater than 0.10 g.L<sup>-1</sup> but lower than 0.30 g.L<sup>-1</sup>. For the three 368 remaining strains (9%) the biomass was lower than  $0.10 \text{ g.L}^{-1}$ . 369

The lipid rate estimated with the gravimetric method ranged from  $30.5 \pm 0.7\%$  DW (*Nitzschia* sp. 5 NCC109) to  $3.7 \pm 1.1\%$  DW (*Brockmaniella brockmanii* NCC161). For three strains (9%) the lipid rate was greater than 20% DW. For 14 strains (42%) the lipid rate was greater than 10% DW. In the remaining 16 strains (48%) the lipid rate was lower than 10% DW.

Biomass productivity varied substantially among the tested strains (Fig. 2A) and ranged from  $0.36 \pm 0.02 \text{ g.L}^{-1}.\text{day}^{-1}$  (*Nitzschia alexandrina* NCC33) to  $1.4 \pm 0.3 \times 10^{-2} \text{ g.L}^{-1}.\text{day}^{-1}$ (*Entomoneis* sp. 3 NCC351). The results were found to be statistically different among those strains (ANOVA, p < 0.001). Finally, the strains were clustered into three groups according to the following parameters (Fig. 2): group 1 with productivity between  $0.35 \pm 0.02$  and  $0.19 \pm 0.04 \text{ g.L}^{-1}.\text{day}^{-1}$ ; group 2 with productivity ranging from  $0.17 \pm 0.08$  to  $0.09 \pm 0.02 \text{ g.L}^{-1}.\text{day}^{-1}$ ;

- 380 group 3 with lower productivity ranging from  $7.5 \pm 0.4 \times 10^{-2}$  to  $1.4 \pm 0.3 \times 10^{-2}$  (g.L<sup>-1</sup>.day<sup>-1</sup>).
- 381 The most productive strains were those exhibiting the highest  $\mu$  max associated to the highest
- 382 DW. But they did not correspond to the richest in terms of total lipid rate (Fig. 2B).

384

Table 3. Characteristics and sampling locations of the investigated diatoms species. All data were obtained by experimental measurements. N=3, independent measurement, ±
 SD.

Caracian.	NCC strain	Compline location	Cell siz	ze (µm)	LED	μmax	Silica content	Biomass	TLR	D-f
Species	identification	Sampling location	Length	Width	(day)		(%)	$(g.L^{-1})$	(% DW)	Ker
Nitzschia alexandrina	NCC33	France, NW Atlantic coast	$11.0 \pm 1.2$	$3.7 \pm 0.4$	$11 \pm 0$	1.89 ± 0.10	Δ 27.2 ± 3.8	$0.189 \pm 0.004$	$12.7 \pm 3.2$	[15,42-49]
Entomoneis sp. 5	NCC302	France, NW Atlantic coast	$22.4 \pm 3.5$	$15.0 \pm 2.2$	$9 \pm 0$	$1.50 \pm 0.18$	$38.9 \pm 0.7$	$0.132 \pm 0.025$	$6.9 \pm 2.4$	[50-54]
Entomoneis sp. 2	NCC20	France, NW Atlantic coast	$30.5 \pm 4.6$	$18.5 \pm 3.2$	$8 \pm 0$	$1.19 \pm 0.08$	$34.3 \pm 2.8$	$0.244 \pm 0.042$	$10.3 \pm 2.7$	[50-54]
Staurosira sp.	NCC182	France, NW Atlantic coast	$6.9 \pm 1.4$	$5.5 \pm 1.2$	$8 \pm 2$	$1.17 \pm 0.09$	$28.9 \pm 5.1$	$0.262 \pm 0.084$	$25.1 \pm 1.2$	[16]
Fallacia sp. 1	NCC303	Greenland, east coast	$6.4 \pm 0.7$	$2.9 \pm 0.4$	$12 \pm 2$	$1.12 \pm 0.14$	$37.4 \pm 4.5$	$0.154 \pm 0.016$	$14.2 \pm 1.9$	-
Fallacia sp. 2	NCC304	Greenland, east coast	$6.4 \pm 0.8$	$3.1 \pm 0.4$	$12 \pm 0$	$1.07 \pm 0.15$	$31.8 \pm 4.9$	$0.265 \pm 0.028$	$9.2 \pm 3.3$	-
Entomoneis sp. 7	NCC445	France, NW Atlantic coast	$10.4 \pm 1.5$	$4.1 \pm 0.7$	$9 \pm 2$	$1.02 \pm 0.05$	$41.4 \pm 2.9$	$0.122 \pm 0.005$	$10.2 \pm 2.8$	[50-54]
Entomoneis paludosa	NCC18.1.1	France, NW Atlantic coast	$18.4 \pm 3.3$	$10.7 \pm 1.9$	$11 \pm 1$	$0.96 \pm 0.03$	$37.8 \pm 4.0$	$0.130 \pm 0.016$	$5.3 \pm 0.3$	[50-54]
Entomoneis sp. 4	NCC301	France, NW Atlantic coast	$23.9 \pm 3.4$	$17.3 \pm 2.2$	$7 \pm 1$	$0.92 \pm 0.14$	$26.7 \pm 3.9$	$0.171 \pm 0.012$	$6.7 \pm 1.5$	[50-54]
Pseudonitzschia americana	PNA06 KER	France, NW Atlantic coast	$6.6 \pm 0.8$	$4.5 \pm 0.5$	$9 \pm 2$	$0.89 \pm 0.09$	B $_{36.4\pm0.6}$	$0.099 \pm 0.019$	$5.7 \pm 1.6$	-
Surirella sp. 1	NCC270	France, NW Atlantic coast	$6.8 \pm 1.3$	$5.0 \pm 1.6$	6 ± 1	$0.85 \pm 0.31$	$33.7 \pm 3.5$	$0.173 \pm 0.033$	$19.3 \pm 2.8$	-
Navicula sp. 2	NCC226	France, NW Atlantic coast	$9.1 \pm 1.3$	$5.6 \pm 0.7$	8 ± 2	$0.82 \pm 0.05$	$41.4 \pm 1.5$	$0.131 \pm 0.015$	$8.7 \pm 2.5$	[15,45,47,49,55,58]
Opephora sp. 1	NCC366	France, NW Atlantic coast	$5.4 \pm 0.8$	$3.7 \pm 0.8$	$14 \pm 1$	$0.82 \pm 0.16$	$37.8 \pm 8.4$	$0.233 \pm 0.010$	$11.5 \pm 3.1$	-
Entomoneis paludosa	NCC18.2.1	France, NW Atlantic coast	$18.8 \pm 1.8$	$11.2 \pm 2.5$	$12 \pm 1$	$0.81 \pm 0.05$	$36.0 \pm 3.9$	$0.150 \pm 0.003$	$7.3 \pm 1.0$	[50-54]
Extubocellulus cf cribriger	NCC229	France, NW Atlantic coast	$4.8 \pm 0.7$	$3.9 \pm 0.5$	$9 \pm 0$	$0.81 \pm 0.09$	$33.7 \pm 2.3$	$0.155 \pm 0.003$	$14.2 \pm 4.8$	[52,59,60]
Amphora sp. 1	NCC260	France, NW Atlantic coast	$9.8 \pm 1.3$	$3.7 \pm 0.5$	$13 \pm 0$	$0.78 \pm 0.30$	$36.2 \pm 2.6$	$0.176 \pm 0.041$	$18.5 \pm 4.2$	[49,55,58,61,62]
Conticriba weissflogii	CCMP1336	USA, NE Atlantic coast	$15.6 \pm 2.5$	$10.8 \pm 1.4$	$12 \pm 0$	$0.59 \pm 0.15$	$22.9 \pm 2.6$	$0.277 \pm 0.035$	$7.2 \pm 1.7$	-
Brockmaniella brockmanii	NCC161	France, NW Atlantic coast	$9.2 \pm 2.4$	$4.3 \pm 0.6$	$10 \pm 0$	$0.58 \pm 0.01$	$37.5 \pm 0.2$	$0.185 \pm 0.025$	$3.7 \pm 1.1$	-
Craspedostauros britannicus	NCC195	France, NW Atlantic coast	$37.8 \pm 8.8$	$11.0 \pm 2.2$	$9 \pm 0$	$0.53 \pm 0.09$	$44.7 \pm 0.1$	$0.502 \pm 0.039$	$8.2 \pm 1.8$	-
Conticriba weissflogii	NCC133	Morocco,Oum R'bia estuary	$14.3 \pm 1.7$	$12.1 \pm 1.7$	$7 \pm 0$	$0.53 \pm 0.08$	$34.6 \pm 1.2$	$0.181 \pm 0.015$	$6.4 \pm 0.7$	-
Licmophora sp. 1	NCC253	France, NW Atlantic coast	$20.0 \pm 3.9$	$12.4 \pm 1.6$	$11 \pm 0$	$0.51 \pm 0.02$	$37.8 \pm 5.7$	$0.161 \pm 0.049$	$13.5 \pm 1.1$	-
Amphora sp. 2	NCC169	France, NW Atlantic coast	$9.0 \pm 1.2$	$5.8 \pm 1.2$	$13 \pm 3$	$0.48 \pm 0.14$	$33.8 \pm 4.8$	$0.157 \pm 0.024$	$16.0 \pm 2.6$	[49,55,58,61,62]
Craspedostauros sp. 1	NCC228	France, NW Atlantic coast	$55 \pm 14$	$14.9 \pm 4.2$	$16 \pm 4$	$0.46 \pm 0.22$	$C 25.2 \pm 0.7$	$0.384 \pm 0.042$	$5.6 \pm 1.4$	-
Craspedostauros sp. 2	NCC218	France, NW Atlantic coast	$58 \pm 14$	$13.6 \pm 3.4$	$12 \pm 0$	$0.45 \pm 0.18$	$26.0 \pm 4.1$	$0.178 \pm 0.047$	$5.9 \pm 1.4$	-
Cymatosira belgica	NCC208	France, NW Atlantic coast	$5.6 \pm 0.6$	$4.7 \pm 0.7$	$12 \pm 0$	$0.44 \pm 0.12$	$35.5 \pm 3.4$	$0.118 \pm 0.043$	$14.6 \pm 3.0$	-
Amphora acutiuscula	NCC216	Viet Nam, South east coast	$10.0 \pm 1.0$	$5.6 \pm 0.8$	$11 \pm 0$	$0.43 \pm 0.07$	$32.4 \pm 0.7$	$0.144 \pm 0.041$	$13.7 \pm 5.1$	[49,55,58,61,62]
Lithodesmium sp	NCC353	Australia, Moreton bay	$29.3 \pm 5.4$	$22.6 \pm 4.1$	9 ± 1	$0.43 \pm 0.02$	$34.1 \pm 6.1$	$0.129 \pm 0.006$	$7.1 \pm 2.9$	-
Navicula sp. 1	NCC113	Morocco,Oum R'bia estuary	$17.1 \pm 2.9$	$5.1 \pm 1.2$	$16 \pm 0$	$0.42 \pm 0.02$	$25.0 \pm 1.0$	$0.168 \pm 0.035$	$23.1 \pm 6.4$	[15,45,47,49,55,58]
Entomoneis sp. 6	NCC335	France, Mediterranean Sea	$13.9 \pm 1.9$	$7.7 \pm 1.9$	$12 \pm 1$	$0.38 \pm 0.03$	$36.8 \pm 4.7$	$0.226 \pm 0.036$	$3.7 \pm 1.1$	[50-54]
Entomoneis sp. 1	NCC350	France, Mediterranean Sea	$29.0 \pm 4.0$	$17.5 \pm 2.7$	$14 \pm 0$	$0.36 \pm 0.13$	$46.1 \pm 4.6$	$0.098 \pm 0.048$	$8.8 \pm 0.1$	[50-54]
Craspedostauros britannicus	NCC199	France, NW Atlantic coast	$31.2 \pm 3.2$	$8.8 \pm 1.6$	$12 \pm 2$	$0.35 \pm 0.14$	$40.0 \pm 2.9$	$0.421 \pm 0.053$	$12.5 \pm 1.2$	-
Nitzschia sp. 5	NCC109	France, NW Atlantic coast	$33.1 \pm 4.1$	$10.1 \pm 1.5$	$12 \pm 1$	$0.31 \pm 0.05$	$23.0 \pm 1.5$	$0.239 \pm 0.026$	$30.5 \pm 0.7$	[15,42–49]
Entomoneis sp. 3	NCC351	France, Mediterranean Sea	$16.6 \pm 3.7$	$12.3 \pm 3.0$	$13 \pm 0$	$0.22 \pm 0.05$	$38.6 \pm 5.8$	$0.065 \pm 0.001$	$13.3 \pm 4.6$	[50–54]



**Figure 2.** Values of the parameters measured for the screened strains includes strain productivity (A), lipid rates as measured with the gravimetric method (B), lipid ratio measured semi-quantitatively by the FTIR approaches, [(eb+CH3+CH3)/si] (C) and [area eb+CH2+CH3)/Total area] multiplied by 100 for scaling purposes (D). Notations a, b, and c correspond to the maximum and minimum values for groups 1, 2 and 3. N=3, independent measurements, ± SD.

- 398 3.2 FTIR analysis
- 399

#### 3.2.1 FTIR spectrum interpretation

400 HTSXT-FTIR analysis was performed on the 33 assayed species (Tab. 3). The lipid 401 rate was associated to three main signals on the recorded spectra (Fig. 3A), i.e. through the 402 two vibrations of the fatty acid carbon chains (v CH<sub>2</sub> and v CH<sub>3</sub>) (v C-H ~ 2923 and 2852 cm<sup>-</sup> <sup>1</sup>) [26] and of the ester bond function (Eb) (vC=O ~ 1750 cm<sup>-1</sup>) [63]. The other major bands 403 404 corresponded to the principal cellular components such as the proteins (the amide I band vC=O ~1650 cm<sup>-1</sup>; the amide II band  $\delta$  N=H ~1540 cm<sup>-1</sup>), the nucleic acids (v P=O ~1230 cm<sup>-1</sup>) 405 406 <sup>1</sup>) and the carbohydrates band superimposed on the silica band ( $\sim 900 - 1200 \text{ cm}^{-1}$ ). For details 407 see Wagner et al., 2010 [64]. Whereas the infrared signature obtained on the whole cells showed superimposed bands of silica and carbohydrates at 1078 cm<sup>-1</sup> (Fig. 3A), the signature 408 409 obtained on the crude lipid extract (Fig. 3B) did not exhibit this band, but a well defined ester 410 bond (Eb) band at 1750 cm<sup>-1</sup> and well-defined bands for the CH<sub>2</sub>-CH<sub>3</sub> signature at 3000-2800 411 cm<sup>-1</sup>.

The lipid ratio estimated from the FTIR data measured on the entire cells (Fig.2C) ranged from  $1.70 \pm 0.59$  (*Nitzschia* sp. 5 NCC109) to  $0.49 \pm 0.04$  (*Entomoneis paludosa* NCC18.1.1). It was thus possible to cluster the assessed strains into three groups. Group 1 showed a maximum ratio at  $1.69 \pm 0.18$  for *Craspedostauros britannicus* NCC195 and a minimum at  $0.61 \pm 0.01$  for *Entomoneis* sp 5 NCC302, group 2 showed a maximum ratio at  $1.34 \pm 0.07$  for *Fallacia* sp 1 NCC303 and a minimum at  $0.49 \pm 0.04$  for *Entomoneis paludosa* 

418 NCC18.1.1 and group 3 showed a maximum ratio at  $1.70 \pm 0.59$  for *Nitzschia* sp NCC109 419 and minimum at  $0.56 \pm 0.02$  for *Lithodesmium sp* NCC35.3.



Figure 3. Example of averaged FTIR spectra recorded on entire cells or on the corresponding lipid extract. (A) *Staurosira* sp NCC182 FTIR signature recorded on the entire cells and (B) *Staurosira* sp NCC182 FTIR signature recorded on a crude lipid extract. The grey area corresponds to the variation of the FTIR signal associated to the standard deviation for n=3 independent measurements.

The lipid ratio estimated from the FTIR data recorded on the lipid extracts (Fig.2D) ranged from  $49.3 \pm 8.5$  (*Amphora* sp. 2 NCC169) to  $16.5 \pm 3.1$  (*Entomoneis* sp. 6 NCC335). Three groups were also proposed regarding this criterion, group 1 showed a maximum ratio at 38.84  $\pm 0.63$  for *Staurosira* sp. NCC182 and a minimum ratio at 22.8  $\pm 1.8$  for *Entomoneis* sp. 5 NCC302, group 2 a maximum ratio at 39  $\pm 2$  for *Extubocellulus* sp. NCC229 and a minimum at 16.5  $\pm 1.2$  for *Craspedostauros britannicus* NCC228 and group 3 with a maximum ratio at 49.3  $\pm 8.3$  for *Amphora* sp. 2 NCC169 and a minimum at 23  $\pm 2$  for *Entomoneis* sp. 3 NCC351.

The silica amount did not appear to significantly impact on the lipid FTIR signature except in three species for which the FTIR lipid ratio fell between the two FTIR signature sampling methods (i.e. on entire cells or on lipid extract). These were Craspedostauros *brittanicus* NCC195, *Navicula* sp. 4 NCC113 and *Conticriba weissflogii* CCMP1336. For the other species with different silica content, the lipid signature remained stable in both FTIR sampling methods.

440

441 3.2.2 Multivariate analysis of the FTIR spectra recorded on entire cells

442 In order to assess the main differences in terms of biochemical composition among the 33 443 screened strains, a correspondence analysis approach using the lipid, protein and carbohydrate 444 bands normalized to the silica amounts was performed. The resulting map (Fig. 4) is a 445 classification of the data on two main dimensions. Dimension 1 represents 81% of the initial 446 information and could be associated to the variation of the lipid composition of the assessed 447 strains, ranging from the lowest to the highest amount of total lipids from right to left on the 448 map. Two strains, Staurosira sp. NCC182 and Amphora sp. 2 NCC169 presented the highest 449 amount in total lipids. Along dimension 2, representing 19% inertia, the strains associated to 450 that dimension were mainly opposed on the basis of their protein and carbohydrate content. 451 Craspedostauros sp. 2 NCC218 was rich in proteins, whereas in Brockmaniella brockmanii 452 NCC161 the main fraction was associated to the carbohydrates.

These results indicate that the 2 most notable differences or largest deviations in the sample were observed first between *Staurosira* sp. NCC182, *Amphora* sp. 2 NCC169 and the other species for their lipid rates, and secondly between the strains *Craspedostauros* sp. 2 NCC218, *Brockmaniella brockmanii* NCC161 and the other species by their respective protein and carbohydrate composition. This analysis summarizes the main biochemical characteristics of the strains hosted in the NCC bank in a single step. Although the distance between the

459 macromolecular content and the species were not mathematically defined, their closeness on 460 the map could be used as a guideline to interpret their biochemical characteristics: the squares 461 correspond to the strains particularly rich in lipids, the triangles, the strains rich in 462 carbohydrates and the dots, the strains particularly rich in proteins.





465 Figure 4. Correspondence analysis map calculated on the basis of the macromolecular content
466 as evaluated by FTIR on all the assayed strains of the NCC. N=3 independent measurements.

467

464

468 3.3 Comparison of the lipid amounts estimated by the gravimetric469 method and the FTIR approaches.

470 A significant positive correlation was found for all the techniques (gravimetric and 471 FTIR) ( $p < 1.10^{-7}$ ) with a Pearson correlation score R superior to 0.53. For the 33 analyzed 472 species, 14 presented a high lipid ratio (> 12% DW) using the gravimetric measurements: 473 *Nitzschia alexandrina* NCC33, *Staurosira* sp. NCC182, *Fallacia* sp. 1 NCC303, *Surirella* sp. 474 1 NCC270, Extubocellulus cf cribriger NCC229, Amphora sp. 1 NCC260, Licmophora sp.1 475 NCC253, Amphora sp. 2 NCC169, Cymatosira belgica NCC208, Amphora acutiuscula 476 NCC216, Navicula sp. 1 NCC113, Craspedostauros britannicus NCC199, Nitzschia sp. 5 477 NCC109 and Entomoneis sp.3 NCC351 (Fig. 2B, Fig. 5). The FTIR method applied on entire 478 cells identified 12 species rich in lipids (FTIR lipid ratio > 1.20) with nine species identified 479 in common with the gravimetric method: NCC33, NCC182, NCC303, NCC270, NCC169, 480 NCC216, NCC113, NCC199 and NCC109 (Fig. 2C, Fig. 5). FTIR for the lipid extract 481 analyses identified 12 species rich in lipids (ATR lipid ratio > 30) with eight species identified 482 in common with the gravimetric approach: NCC182, NCC303, NCC270, NCC229, NCC169, 483 NCC216, NCC113 and NCC109 (Fig 2D, Fig. 5). 484 The correspondence analyses (Fig.4) performed on the FTIR profiles obtained in the entire 485 cells gave supplementary information and identified seven species particularly rich in lipids:

486 NCC182, NCC270, NCC169, NCC113, NCC366, NCC109 and NCC33. These species were

487 also identified by the gravimetric method with the exception of NCC366, only identified by

488 the FTIR method on crude lipid extract.



FTIR on entire cells

Figure 5 Venn diagram showing the degree of overlap among the different approaches used to identify the lipid rich diatoms. In the gravimetric method circle, 14 strains were identified as rich in lipids: 4 only with this method (NCC260, NCC208, NCC253, NCC351), one strains were also identified as rich and lipid by the FTIR on lipid extract (NCC229), and two strains were also identified as rich in lipids by the FTIR on entire cells (NCC33, NCC199). One strain was identified by FTIR on lipid extract and FTIR on whole cells (NCC366) and seven strains were identified as rich in lipids by all three methods (NCC109, NCC182, NCC113, NCC270, NCC169, NCC303, NCC216). 

#### 505 3.4 Strain selection

506 The selection of the strains exhibiting both high biomass productivity and high lipid rates, was 507 performed using whole sample distribution based on the lipid rates as estimated by the FTIR 508 approaches, gravimetry and strain biomass productivity as estimated by the fluorometry. On 509 the boxplots summarizing this data (Fig. 6), the colored dots represent the species with the 510 highest potential for biotechnology applications based on lipid molecules: Nitzschia 511 alexandrina NCC33, Staurosira sp NCC182 and Opephora sp NCC366 presented a lipid ratio 512 whatever the considered technique and productivity above the median. Amphora sp 2 NCC169 513 and Nitzschia sp 5 NCC109 were also identified with an above median lipid ratio, but with 514 lower productivity. Both these species were finally selected for their high lipid rate, even 515 though their productivity needs to be improved.





**Figure 6.** Boxplots summarizing the sample distribution criteria as measured with FTIR methods, gravimetry for the lipid rate and flurorimetry for productivity. FTIR data was expressed in arbitrary units. Lipid rate in %DW and Px in g.L<sup>-1</sup>.day<sup>-1</sup> FTIR results were

multiplied by 20 for scaling purposes. The Px was multiplied by 100 for scaling purposes. 33
strains were assayed in independent biological triplicates.

523 4 Discussion

#### 524 4.1.1 Determination of growth by fluorimetry

525 In this study a rapid and precise method for the estimation of cell abundance was needed to 526 efficiently establish the growth parameter of over 60 benthic diatom species. The use of 527 microscope counting chambers is slow, tedious and imprecise. The use of particle counters is 528 feasible only for those phytoplankton species within a certain size range that do not form 529 chains and have long appendages [65]. In vivo fluorescence has been successfully used in the 530 past to monitor the growth of phytoplankton culture [19, 20, 32, 41, 66]. In vivo fluorescence 531 measurement is rapid, sensitive and can be used with all types of diatoms cell structures, i.e. 532 on solitary cells such as *Entomoneis* and *Navicula* genera and on chain-forming diatoms, such 533 as Extubocellulus genus or aggregates of cells such as Amphora genus. However, in vivo 534 fluorescence is a measurement of the increase in chlorophyll and chlorophyll per cell varies 535 greatly with light intensity and cellular nutritional status so it can only be used to measure 536 growth when culture conditions are constant. Changes in light and other culture conditions 537 can lead to a change in chlorophyll a content. In this case F0 will also change, introducing a 538 bias in growth rate estimation. Reflectance can also be used to monitor the diatom growth 539 rate, as demonstrated in this study; the NDVI was highly correlated with the cell count as *in* 540 vivo fluorescence (R> 0.70). Méléder et al, 2003 [21] have already demonstrated this 541 correlation on monospecific benthic diatom cultures with Entomoneis paludosa and Navicula 542 ramosissima. Compared to fluorometry this technique required more culture sampling and a 543 filtration step which took longer to set up. Fluorometry was more sensitive than 544 spectroradiometry and required less material, which made it ideal for very low amounts of 545 biomass. *In vivo* fluorometry demonstrated several advantages: ease of use, real-time
546 measurement, non-destructive sampling.

547

#### 4.1.2 Determination of the lipid rate by FTIR

548 The total lipid evaluation by gravimetry has been used for more than 50 years [67], but this 549 technique is clearly not compatible with screening efforts involving large numbers of samples 550 because of processing time required particularly in the extraction phase. Furthermore, large 551 volumes of samples are systematically needed for the measurements. It also requires sufficient 552 amounts of dried biological sample, thus making it unsuitable for high frequency monitoring 553 of small scale microalgal cultivation. Feng et al., (2013) [68] suggested that the presence of 554 chlorophyll could also affect the accuracy of the method. In comparison to conventional 555 chemical analysis, FTIR spectroscopy presented striking advantages due to its high reliability, 556 sensitivity and speed of the measurement [64]. An IR spectrometer coupled to a microtiter 557 plate reader open the possibility of high throughput analysis of a few nanograms of cell 558 material [69]. Coat et al, (2014) [26] demonstrated that the repeatability of FTIR signal 559 reached excellent values (10%), but only for a limited range of analyzed quantities of matter 560  $(10^6 \text{ to } 10^8 \text{ cells. mL}^{-1}).$ 

In the present study we have demonstrated that FTIR was a suitable technique to evaluate the lipid ratio of diatoms. The use of the FTIR technique was even more rapid, due to the use of direct fresh biomass. The results obtained on entire cells and lipid crude extracts were similar, suggesting that measurement on entire cells did not improve the lipid quantification. Measurement on whole cells could be considered sufficient to get a first idea on their intracellular lipid rate. In addition, removing the silica did not seem necessary in view of the present results to improve the lipid semi-quantification.

However, there are some limitations with this non-invasive technique. Even though the FTIR
results between entire cells and crude extracts were similar, we did not obtain a perfect linear

570	correlation with the traditional lipid extraction. Nevertheless, the FTIR method has the
571	advantage of simultaneously detecting the relative amount of lipids, carbohydrates and
572	proteins, even though those components overlapped, implying a certain degree of inaccuracy.
573	The different steps required for the lipid extraction can also produce a bias in the evaluation
574	of the lipid quantity, added to the inaccuracy of weighing of the lipid matter, making it less
575	precise than the spectrometric approach. The heterogeneity observed in the present FTIR
576	results could be also associated to the utilization of different strains (33 strains in the current
577	study). These are not described in the previous studies evaluating lipid quantification with
578	FTIR where only one species was used [26, 39, 70]. FTIR did not differentiate polar/apolar
579	lipids, or the different types of fatty acids produced by the strains. Lipid analysis by
580	chromatographic techniques coupled to mass spectrometry will be needed to further identify
581	the presence of interesting molecules like EPA or DHA. Nevertheless, the present study opens
582	the way to rapid and reliable semi-quantification of total amounts of intracellular lipids in
583	diatoms using a fast, non-invasive approach.
584	
585	

#### 594 4.1.3 Method assessments

This study highlighted the efficiency of PAM and FTIR measurements as fast techniques to characterize both the growth and lipid content of microalgae (Tab.4). The use of PAM fluorometry was three times faster than cell counting. Where 15 minutes were necessary to count 3 samples (8.25 hours for 99 samples) and 10 minutes to measure reflectance by spectroradiometry (5.5 hours for 99 samples), only 5 minutes were necessary to measure F0 by PAM fluorometry (2.75 hours for 99 samples).

<b>Tuble +</b> Dyuluulon of three methods for algue growth kinetie determinut	manor	ucucinina	KIIICUC	giuwui	aigai	10	ous	meun		unv	01	auon	Lvalua		1 avi	501
---	-------	-----------	---------	--------	-------	----	-----	------	--	-----	----	------	--------	--	-------	-----

Evaluation index	Counting	NDVI	РАМ
Cultivation scale	Large	Large-small	Large-small
Monitoring frequency	High	Medium	High
Sample state	Liquid	Filtered	Liquid
Volume consumed	5 - 1 mL	5- 3 mL	>1 mL
Time consumed	8.25 h	5.5 h	2.75 h
Equipment	Counting chambers	Spectroradiometer	PAM fluorometer
Reliability	Low	High	High

602

603 For lipid extraction, dichloromethane methanol solvent is usually used [34, 71–73]. Even 604 though extraction was very effective, this method is known to have environmental and health 605 risks [71]. Moreover, it is expensive: for 99 extractions, 10 L of each solvent was necessary 606 costing 234 € (9.68 €/L of methanol and 13.72 €/L of dichloromethane (Fischer Scientific). 607 The time necessary for the lipid extraction using Bligh and Dyer method was time-consuming 608 (Tab. 5) due to the time needed for maceration and lipid separation. 5.5 weeks were necessary 609 to perform the extraction of 99 samples (ca. 7920 hours). Nile red, a lipid soluble fluorescent 610 dye, is commonly used to evaluate the lipid content of animal cells, microorganisms, and 611 especially microalgal strains. Required time to perform spectrophotometric measurements 612 with Nile red and Bodipy was evaluated at 10 mins per sample (measurement before and after 613 Nile red or Bodipy application) and 25 to 40 mins incubation time was necessary after application of Nile red or Bodipy before reading spectrophotometric values [68,74]. In
comparison FTIR is a fast and eco-friendly technique. Two plates of 384 well were necessary
to evaluate the lipid content for the 33 strains (each strain needed 15 wells with 5 wells per
replicate). It took 30 seconds to read each well to obtain the FTIR spectra leading to ca. and 4
hours to read an entire plate.

619	Table 5	Evaluation	of three	methods	for algal	lipid	content	determination

Evaluation index	Gravimetric	FT-IR	Nile Red / Bodipy 505/515
Cultivation scale	Large	Large-small	Large-small
Monitoring frequency	Low	Medium	High
Sample state	Dried	Liquid	Liquid
Biomass consumed	100 mg	5 $\mu L$ of 1.0 mg mL-1	3 mL of OD <sub>680</sub> 0.4
Time consumed	>50 h	8 h	25 h
Equipment	Nitrogen evaporator	FT-IR	FS & FM <sup>a</sup>
Accuracy	Total lipid	Total lipid	Neutral lipid

620 <sup>a</sup> Fluorescence spectrophotometer and Fluorescence microscopy

621 Nile red and Bodipy 505/515 staining are powerful quantification tools in terms of time and 622 cost of biomass [75, 76], high throughput quantification method of lipids with Nile red or 623 Bodipy 505/515 fluorescence can hardly been seen as a method for screening different species 624 of microalgae, as the staining protocol is species specific. The significant disadvantages of 625 Nile red were its limited photostability, interference with chlorophyll [77, 78], and difficulty 626 of permeation for some species. Bodipy 505/515 produced a better marker than Nile red for 627 visualizing neutral lipid content in fluorescence microscopy [75, 79] but some authors have 628 reported disadvantages with these techniques such as background fluorescence of the dye in 629 the medium and failure to quantify neutral lipids between rich and low oil strains. When 630 microalgae were cultured on a large scale with a low-frequency monitoring requirement, any 631 of the three methods could be adopted, although gravimetric determination might be 632 preferable as it was an absolute method for quantification of both crude and neutral lipids 633 without the need of specialized equipment. For the general laboratory culture of microalgae,

the FT-IR method for simultaneous characterization of total lipid, carbohydrate and protein
content and the Nile Red method for both neutral lipid content and location can be used, both
of which are relative quantification methods, but require special equipment.

637 Although these analyses demonstrate that FTIR and Nile Red were equally effective at 638 measuring lipid accumulation, FTIR was likely to be a more efficient tool for this purpose 639 because of its much faster analysis time and high reproducibility of results [80]. Furthermore, 640 FTIR may also be more suitable than Nile Red for efficiently detecting large increases in lipid 641 concentration. Nile Red does not appear to be efficient at accurately quantifying lipid 642 concentration above 20 mg/ml [77] while FTIR can efficiently detect linear lipid 643 concentration changes up to at least 250 mg [81]. Measurements with FTIR were more precise 644 because of the technical quintuplicate performed for the acquisition of spectra.

645

### 4.2 Screening for lipid rich benthic diatom strains

646 The aim of this study was to investigate the growth characteristics and the lipid rates of the 647 benthic marine diatom species hosted in the NCC bank in order to evaluate their potential for 648 original lipid bioproducts of potential economic interests. First, a selection based on the genera 649 identified in the literature was applied. Among the 134 strains hosted by the NCC, 650 corresponding to 40 genera and 101 species, 23 genera (corresponding to 77 species, 105 651 strains in the NCC) were largely studied [15, 16, 42, 43, 46,49, 52, 55, 58, 60, 82]. Among 652 these 23 genera, only 13 genera (42 species, 47 strains) with high productivity and/or 653 producing high lipid quantities were selected for the current study. Among these 47 strains, 654 only 18 strains, (6 genera, 17 species) grew successfully. Among the NCC's 40 genera, 17 655 genera (corresponding to 24 species, 29 strains) were not previously reported in the literature 656 in terms of productivity or ability to produce lipids or added value molecules. Thus, the 29 657 strains corresponding to these 17 genera were also selected and assayed for the current study. 658 Among these strains, 15 strains (13 species, 10 genera) did successfully grow. Finally, at the

end of this first screening step based on the growth rates, 33 strains (18 previously described and 15 that have never been described before in the literature) were selected for the second step of the screening process. As reported in the supplementary data, 43 strains failed to grow which may be associated to shear stress; some species like *Rhizosolenia setigera* cells were broken during agitation.

664 The second step consisted in the determination of the lipid rate on the selected strains. In 665 microalgae, it can typically vary from 1 to 85% of the dry weight under adverse conditions 666 [15, 83, 84]. Factors such as temperature, irradiance and most markedly nutrient availability 667 have been shown to affect both lipid composition and lipid rate [17, 57, 85]. In general, high 668 irradiance stimulates TAG accumulation [57], while under low irradiance, the polar lipids 669 (phospholipids and glycolipids), structurally and functionally associated to cell membrane, 670 are preferentially synthesized [17]. The lipid rate found in the current study for the Amphora 671 genus was similar to that estimated by Renaud et al., (1999) [46]. The authors proposed 19% 672 DW vs. 14 to 19% DW in the current study. This similarity could be explained by the similar 673 culture conditions for light and nutrient although the temperature was different (25°C vs 16°C 674 in the current study). According to Chtourou et al., 2015 [61], the temperature could be an 675 important factor for Amphora genus lipid rate which can achieve lipid rates up to 24% of DW 676 at 20°C. Media enrichment could also be an important factor: Amphora cells grown in media 677 enriched with macronutrients and trace metal can also achieve lipid rates up to 32% under low light conditions (11.4  $\mu$ mol photon m<sup>-2</sup> s<sup>-1</sup>) [62] or under nitrogen deficiency [55]. These 678 679 factors could be used as guideline to improve lipid production of the selected Amphora strains 680 hosted in the NCC. The biomass measurements for the Amphora genus in Zhao et al study [49] were in accordance with our results. The authors found 0.13 g.L<sup>-1</sup> vs. 0.16 g.L<sup>-1</sup> in the 681 682 current study. According to their measured lipid productivity, the Amphora genus appeared 683 to be a good candidate for lipid based potential applications.

684 The lipid rate found in our study for the *Nitzschia* genus was similar to the results found by 685 Renaud et al., (1999) for one species [46] but very different for Nitzschia sp 5 NCC109 in the 686 current study. They found a lipid rate of between 13 and 16% DW for the Nitzschia genus. In 687 the present study, Nitzschia alexandrina NCC33 showed a lipid rate of 13% DW but for 688 Nitzschia sp 5 NCC109 it was estimated up to 30% DW. However, this rate could only be 689 found for Nitzschia genus under nitrogen or silica deficiency increasing up to 45-47% DW 690 [44,45,47]. Since the amount of nitrogen was not monitored in the culture, it is possible that 691 nitrogen depletion occurred, explaining the high lipid rate measured for Nitzschia sp 5 692 NCC109. Further analysis for this strain is necessary to establish whether this was due to the 693 absolute lipid richness of the strain, or to a bias in culture conditions.

The biomass found for the *Nitzschia* genus in Zhao et al (2016) [49] was lower than the measurements in the present study. The biomass estimated in the current study ranged from 0.07 to 0.14 g.L<sup>-1</sup> vs. 0.19 to 0.23 g.L<sup>-1</sup>. This difference could be due to the light/dark cycle culture conditions, suggesting that under continuous light the biomass production would be more significant for this specific genus [86].

699 It has been demonstrated that the species with a lipid rate of 30% DW and productivity under non-optimized conditions of around 0.30 g.L<sup>-1</sup> could be potential strains for lipid production 700 701 [15, 87]. In the present study Nitzschia sp 5 NCC109 had the highest lipid rate, 30.51% DW, 702 Nitzschia *alexandrina* NCC33 with the highest productivity 0.35 g.L<sup>-1</sup>. Both strains were thus 703 selected as candidates for further analyses to assay their potential for lipid-based applications. 704 The *Navicula* genus also presented a lipid rate for the 2 tested species of between 9% and 23% 705 DW. Zhao et al, (2016) [49] found a lipid range from 5 to 30% for 3 Navicula species 706 (Navicula ramosissima, Navicula molli and Navicula halophia) and Scholz et al, (2013) [58] between 18-25% for 6 Navicula species (Navicula digito-radiata, Navicula forcipata, 707 708 Navicula gregaria, Navicula perminuta, Navicula phyllepta and Navicula salinicola). The data were estimated in spite of very different culture conditions (dark night cycle at 600  $\mu$ mol photon m<sup>-2</sup> s<sup>-1</sup>). This observation is important, since for that specific genus, the observed variability in the range of lipid rate for the different tested species is the same regardless of the culture conditions used. The biomass measurements found by Zhao et al., (2016) for the *Navicula* genus are in accordance with the present study, ranging from 0.10 to 0.17 g.L<sup>-1</sup> vs. 0.13 to 0.17 g.L<sup>-1</sup> suggesting that this genus could produce the identical biomass quantity under light/dark cycle or continuous light.

The lipid rate found for the *Extubocellulus* genus in Slocombe et al., (2015) [60] was 23% DW and the biomass equalled 0.06 g. L<sup>-1</sup>. The lipid rate for this genus, 15% DW in the actual study was lower but the biomass obtained was higher 0.16 g.L<sup>-1</sup>. The culture was grown under light/dark cycle in the Slocombe et al. study suggesting that this genus could grow better under continuous light but produce more lipids under light/dark cycle. Wahidin et al., (2013) [88] found the same trend for the microalgae genus *Nannochloropsis*.

Knuckey et al, (2002) [52] found 27% DW of lipid rate for the *Entomoneis* genera. In the present study 9 strains of *Entomoneis* presented lipid rates ranging from 3 to 13% DW. In the Knuckey et al, (2002) study the pH and the nutrients were monitored. The culture conditions were identical to the present study (continuous light, 120  $\mu$ mol photon m<sup>-2</sup> s<sup>-1</sup>). It is therefore possible, that for this genus a nutrient limitation occurred and instead of enhancing the lipid production, it has diminished it. It has been reported that this species produces EPA which is interesting for nutraceutical products [52].

In this study the species with the highest lipid rate (~20 %) and the greatest biomass productivity (up to 0.24 g.L<sup>-1</sup>.day<sup>-1</sup>) was *Staurosira* sp NCC182. This species was similar in productivity to the marine microalgae *Nannochloropsis* sp. with productivity higher than 0.21 g.L<sup>-1</sup>.day<sup>-1</sup> and reached a total lipid rate of 30% DW, when cultivated in batch mode under continuous light and reached 68% DW of lipid production under nitrogen deprivation [89]. *Nannochloropsis* sp. was investigated for algal biofuel production due to its ease of growth and high oil rate. *Staurosira* sp was grown in raceway ponds by Huntley et al., (2015) [16] and the lipid quantification demonstrated that these strains could reach a lipid rate of 45.5% DW under low N content. In the present study, *Staurosira* sp. NCC182 presented all the characteristics (good productivity and oil content) to be produced on a large scale and was considered to be one of the most promising candidates for lipid-based applications.

740 Even if the microalgae oil yield is strain-dependent it is generally superior to other vegetable 741 crops [15, 87]. Oil content in Corn, Hemp, Soybean, Sunflower or Palm oil varied from 18 742 (Soybean) to 44% DW (Corn). Christie et al., (2007) [15] demonstrated that microalgae with 743 a lipid rate up to 30% of DW could produce 58 L/Ha of oil and microalgae up to 70% of DW 744 could produce 136 L/Ha of oil. Corn can produce 172 L/Ha, soybean 446 L/Ha and oil palm 745 5950 L/Ha but require a lot of land for production: 1540 M/Ha for Corn, 594 M/Ha for 746 Soybean and 45 M/Ha for oil palm. Microalgae production only requires 2 to 5 M/Ha. In the 747 NCC collection Nitzschia sp 5 NCC109 and Staurosira sp NCC182 had all the mandatory 748 features to be grown on a large scale: good productivity and high lipid rate. In the present 749 study, Nitzschia alexandrina NCC33 had the highest productivity in the NCC collection (0.36 750 g.L<sup>-1</sup>.day<sup>-1</sup>) and presented a lipid rate superior to 10% DW. Despite its low productivity of 0.08 g.L<sup>-1</sup>.day<sup>-1</sup>, Amphora sp 2 NCC169 was chosen for its lipid rate, superior to 15% DW. 751 752 These 4 strains were selected for further analyses and to improve their productivity and lipid 753 rate with the objective of supplying new resources for lipid based applications. Entomoneis 754 paludosa was also selected despite its low lipid rate since it was already characterized for its 755 ability to produce EPA.

Among the strains not described in the literature, the measured lipid rate ranged from 3 to 20% DW and productivity from 0.05 to 0.27 g.L<sup>-1</sup>.day<sup>-1</sup>. Only one genus was selected for further study: *Opephora sp 1* NCC366. This species showed a mandatory balance between relatively high biomass productivity (0.23 g.L<sup>-1</sup>) and a high intracellular lipid rate (above 10%
DW).

## 761 5 Conclusion Step

In this work, we focused on developing an easy to use screening method to explore the 762 763 NCC bank for diatom strains with the highest relative lipid content. The experimental results 764 showed that the combined use of water-PAM to estimate strain growth kinetics and FTIR on 765 whole cells to estimate the semi-quantitative strain macromolecular content and more 766 specifically lipids, could be rapid, reliable and accessible techniques. The developed 767 methodology opens the way to a systematic, fast, and convenient screening of microorganisms 768 (microalgae in this proof of concept). Moreover, the sensitivity and specificity of the method 769 makes it suitable for a reasonable amount of biomass. This method could also be used in 770 systematic studies for the optimization of culture conditions and to measure the influence of 771 the environment on the metabolic plasticity of the assessed organism. Using this screening 772 approach, 5 strains hosted in the NCC bank were selected for their high productivity and high 773 lipid rate: Nitzschia alexandrina NCC33, Staurosira sp NCC182, Opephora sp 1 NCC366, 774 Nitzschia sp 5 NCC109 and Amphora sp 2 NCC169. The lipid rate achieved by theses strains 775 reached a maximum of 30% DW in the assayed cultivation conditions.

776

In order to improve the lipid quantity, the selected strains could be grown under different culture conditions. The impact of light, temperature and nutrients, especially nitrogen, could be assayed both in terms of lipid productivity and ecophysiology to ensure the highest growth rate possible. Once optimal conditions are found for those strains, the production in photobioreactors could be tested and productivity and lipid rates evaluated, in order to

782	estimate quantitatively if the selected strains can compete with the best ones found in the
783	literature [90-92]. Finally, depending on their oil quality and original lipid activities, those
784	strains may constitute new and original genetic resources that could have potential interesting
785	applications (biodiesel, pharmaceutical, etc.).
786	
787	
788	
789	
790	
791	
792	
793	
794	
795	
796	
797	
798	
799	
800	
801	

## 802 6 References

- T.M. Mata, A.A. Martins, N.S. Caetano, Microalgae for biodiesel production and other
  applications: A review, Renew. Sustain. Energy Rev. 14 (2010) 217–232.
  doi:10.1016/j.rser.2009.07.020.
- P. Spolaore, C. Joannis-Cassan, E. Duran, A. Isambert, Commercial applications of microalgae, J. Biosci. Bioeng. 101 (2006) 87–96. doi:10.1263/jbb.101.87.

- 808 [3] M.A. Borowitzka, High-value products from microalgae—their development and
  809 commercialisation, J. Appl. Phycol. 25 (2013) 743–756. doi:10.1007/s10811-013-9983810 9.
- [4] M.I. Khan, J.H. Shin, J.D. Kim, The promising future of microalgae: current status,
  challenges, and optimization of a sustainable and renewable industry for biofuels, feed,
  and other products, Microb. Cell Factories. 17 (2018). doi:10.1186/s12934-018-0879-x.
- 814 Y.-F. Niu, M.-H. Zhang, D.-W. Li, W.-D. Yang, J.-S. Liu, W.-B. Bai, H.-Y. Li, [5] Improvement of Neutral Lipid and Polyunsaturated Fatty Acid Biosynthesis by 815 816 Overexpressing a Type 2 Diacylglycerol Acyltransferase in Marine Diatom 817 Phaeodactylum tricornutum, Mar. Drugs. 11 (2013)4558-4569. 818 doi:10.3390/md11114558.
- [6] Z. Yi, M. Xu, X. Di, S. Brynjolfsson, W. Fu, Exploring Valuable Lipids in Diatoms,
  Front. Mar. Sci. 4 (2017). doi:10.3389/fmars.2017.00017.
- [7] E. Artamonova, J. Svenning, T. Vasskog, E. Hansen, H. Eilertsen, Analysis of phospholipids and neutral lipids in three common northern cold water diatoms:
  Coscinodiscus concinnus, Porosira glacialis, and Chaetoceros socialis, by ultra-high performance liquid chromatography-mass spectrometry, J. Appl. Phycol. 29 (2017) 1241–1249.
- [8] K.W. Chew, J.Y. Yap, P.L. Show, N.H. Suan, J.C. Juan, T.C. Ling, D.-J. Lee, J.-S.
  Chang, Microalgae biorefinery: High value products perspectives, Bioresour. Technol.
  229 (2017) 53–62. doi:10.1016/j.biortech.2017.01.006.
- [9] G.A. Dunstan, J.K. Volkman, S.M. Barrett, J.-M. Leroi, S.W. Jeffrey, Essential polyunsaturated fatty acids from 14 species of diatom (Bacillariophyceae),
  Phytochemistry. 35 (1993) 155–161. doi:10.1016/S0031-9422(00)90525-9.
- [10] Y.-C. Chen, The biomass and total lipid content and composition of twelve species of
  marine diatoms cultured under various environments, Food Chem. 131 (2012) 211–219.
  doi:10.1016/j.foodchem.2011.08.062.
- [11] L. Chuecas, J.P. Riley, Component Fatty Acids of the Total Lipids of Some Marine
  Phytoplankton, J. Mar. Biol. Assoc. U. K. 49 (1969) 97.
  doi:10.1017/S0025315400046439.
- [12] K. Nagao, T. Yanagita, Conjugated fatty acids in food and their health benefits, J. Biosci.
  Bioeng. 100 (2005) 152–157. doi:10.1263/jbb.100.152.
- [13] M. Gross, The mysteries of the diatoms, Curr. Biol. 22 (2012) R581–R585.
  http://www.sciencedirect.com/science/article/pii/S0960982212008664 (accessed
  September 12, 2016).
- [14] T. Lebeau, J.-M. Robert, Diatom cultivation and biotechnologically relevant products.
  Part II: Current and putative products, Appl. Microbiol. Biotechnol. 60 (2003) 624–632.
  doi:10.1007/s00253-002-1177-3.
- 846 [15] Y. Chisti, Biodiesel from microalgae, Biotechnol. Adv. 25 (2007) 294–306.
   847 doi:10.1016/j.biotechadv.2007.02.001.
- [16] M.E. Huntley, Z.I. Johnson, S.L. Brown, D.L. Sills, L. Gerber, I. Archibald, S.C.
  Machesky, J. Granados, C. Beal, C.H. Greene, Demonstrated large-scale production of marine microalgae for fuels and feed, Algal Res. 10 (2015) 249–265.
  doi:10.1016/j.algal.2015.04.016.
- [17] Q. Hu, M. Sommerfeld, E. Jarvis, M. Ghirardi, M. Posewitz, M. Seibert, A. Darzins,
  Microalgal triacylglycerols as feedstocks for biofuel production: perspectives and
  advances, Plant J. 54 (2008) 621–639. doi:10.1111/j.1365-313X.2008.03492.x.
- [18] T.A. Dempster, M.R. Sommerfeld, Effects of environmental conditions on growth and
   lipid accumulation in Nitzschia communis (Bacillariophyceae), J. Phycol. 34 (1998)
   712–721.

- [19] V. Vyhnalek, Z. Fišar, A. Fišarová, J. Komarkova, In vivo fluorescence of chlorophyll
  a: Estimation of phytoplankton biomass and activity in Římov Reservoir (Czech
  Republic), Water Sci. Technol. 28 (1993) 29–33.
  http://wst.iwaponline.com/content/28/6/29.abstract (accessed October 10, 2017).
- [20] A.D. Steinman, G.A. Lamberti, P.R. Leavitt, D.G. Uzarski, Biomass and Pigments of
  Benthic Algae, in: Methods Stream Ecol. Vol. 1, Elsevier, 2017: pp. 223–241.
  doi:10.1016/B978-0-12-416558-8.00012-3.
- [21] V. Méléder, L. Barillé, P. Launeau, V. Carrère, Y. Rincé, Spectrometric constraint in analysis of benthic diatom biomass using monospecific cultures, Remote Sens. Environ.
  867 88 (2003) 386–400. doi:10.1016/j.rse.2003.08.009.
- [22] L. Akoto, R. Pel, H. Irth, A.T. Udo, R.J. Vreuls, Automated GC–MS analysis of raw
  biological samples: Application to fatty acid profiling of aquatic micro-organisms, J.
  Anal. Appl. Pyrolysis. 73 (2005) 69–75.
- [23] K.E. Cooksey, J.B. Guckert, S.A. Williams, P.R. Callis, Fluorometric determination of
   the neutral lipid content of microalgal cells using Nile Red, J. Microbiol. Methods. 6
   (1987) 333–345.
- [24] J. Koreivienė, Microalgae Lipid Staining with Fluorescent BODIPY Dye, (2017).
- [25] D. Jaeger, C. Pilger, H. Hachmeister, E. Oberländer, R. Wördenweber, J. Wichmann,
  J.H. Mussgnug, T. Huser, O. Kruse, Label-free in vivo analysis of intracellular lipid
  droplets in the oleaginous microalga Monoraphidium neglectum by coherent Raman
  scattering microscopy, Sci. Rep. 6 (2016) 35340.
- [26] R. Coat, V. Montalescot, E.S. León, D. Kucma, C. Perrier, S. Jubeau, G. Thouand, J.
  Legrand, J. Pruvost, O. Gonçalves, Unravelling the matrix effect of fresh sampled cells
  for in vivo unbiased FTIR determination of the absolute concentration of total lipid
  content of microalgae, Bioprocess Biosyst. Eng. 37 (2014) 2175–2187.
- [27] J. Fan, Y. Cui, M. Wan, W. Wang, Y. Li, Lipid accumulation and biosynthesis genes
  response of the oleaginous Chlorella pyrenoidosa under three nutrition stressors,
  Biotechnol. Biofuels. 7 (2014) 17. doi:10.1186/1754-6834-7-17.
- [28] P. Metzger, C. Largeau, Botryococcus braunii: a rich source for hydrocarbons and related
  ether lipids, Appl. Microbiol. Biotechnol. 66 (2005) 486–496. doi:10.1007/s00253-0041779-z.
- [29] R.R. Guillard, Culture of phytoplankton for feeding marine invertebrates, in: Cult. Mar.
   Invertebr. Anim., Springer, 1975: pp. 29–60.
- [30] R.R. Guillard, J.H. Ryther, Studies of marine planktonic diatoms: I. Cyclotella Nana
  Hustedt, and Detonula Confervacea (CLEVE) Gran., Can. J. Microbiol. 8 (1962) 229–
  239.
- [31] Z.-K. Yang, Y.-F. Niu, Y.-H. Ma, J. Xue, M.-H. Zhang, W.-D. Yang, J.-S. Liu, S.-H.
  Lu, Y. Guan, H.-Y. Li, Molecular and cellular mechanisms of neutral lipid accumulation
  in diatom following nitrogen deprivation, Biotechnol. Biofuels. 6 (2013) 67.
  https://biotechnologyforbiofuels.biomedcentral.com/articles/10.1186/1754-6834-6-67
  (accessed October 6, 2017).
- [32] C. Honeywill, D. Paterson, S. Hagerthey, Determination of microphytobenthic biomass
  using pulse-amplitude modulated minimum fluorescence, Eur. J. Phycol. 37 (2002) 485–
  492. doi:10.1017/S0967026202003888.
- [33] B. Gompertz, XXIV. On the nature of the function expressive of the law of human mortality, and on a new mode of determining the value of life contingencies. In a letter to Francis Baily, Esq. FRS &c, Philos. Trans. R. Soc. Lond. 115 (1825) 513–583.
- [34] E.G. Bligh, W.J. Dyer, A RAPID METHOD OF TOTAL LIPID EXTRACTION AND
   PURIFICATION, Can. J. Biochem. Physiol. 37 (1959) 911–917. doi:10.1139/y59-099.

- 907 [35] G. Breuer, W.A. Evers, J.H. de Vree, D.M. Kleinegris, D.E. Martens, R.H. Wijffels, P.P.
   908 Lamers, Analysis of fatty acid content and composition in microalgae, J. Vis. Exp. JoVE.
   909 (2013).
- [36] E.S. León, R. Coat, B. Moutel, J. Pruvost, J. Legrand, O. Gonçalves, Influence of
  physical and chemical properties of HTSXT-FTIR samples on the quality of prediction
  models developed to determine absolute concentrations of total proteins, carbohydrates
  and triglycerides: a preliminary study on the determination of their absolute
  concentrations in fresh microalgal biomass, Bioprocess Biosyst. Eng. 37 (2014) 2371–
  2380.
- [37] W. Zeroual, C. Choisy, S.M. Doglia, H. Bobichon, J.-F. Angiboust, M. Manfait,
  Monitoring of bacterial growth and structural analysis as probed by FT-IR spectroscopy,
  Biochim. Biophys. Acta BBA Mol. Cell Res. 1222 (1994) 171–178. doi:10.1016/01674889(94)90166-X.
- 920 [38] D.H. Williams, I. Fleming, Spectroscopic methods in organic chemistry, McGraw-Hill,
  921 1980.
- [39] I. Schaub, H. Wagner, M. Graeve, U. Karsten, Effects of prolonged darkness and temperature on the lipid metabolism in the benthic diatom Navicula perminuta from the Arctic Adventfjorden, Svalbard, Polar Biol. (2017) 1–15. doi:10.1007/s00300-016-2067-y.
- [40] N. Sourial, C. Wolfson, B. Zhu, J. Quail, J. Fletcher, S. Karunananthan, K. BandeenRoche, F. Béland, H. Bergman, Correspondence analysis is a useful tool to uncover the
  relationships among categorical variables, J. Clin. Epidemiol. 63 (2010) 638–646.
  doi:10.1016/j.jclinepi.2009.08.008.
- [41] C.J. Lorenzen, A method for the continuous measurement of in vivo chlorophyll
  concentration, in: Deep Sea Res. Oceanogr. Abstr., Elsevier, 1966: pp. 223–227.
  http://www.sciencedirect.com/science/article/pii/0011747166911028 (accessed October
  10, 2017).
- [42] G. Chen, Y. Jiang, F. Chen, Fatty acid and lipid class composition of the
  eicosapentaenoic acid-producing microalga, Nitzschia laevis, Food Chem. 104 (2007)
  1580–1585. doi:10.1016/j.foodchem.2007.03.008.
- 937 [43] M.C. Dalay, S.S. Gunes, others, Biodiesel from Microalgae: A Renewable Energy
  938 Source, Middle East J. Sci. Res. 22 (2014) 350–355.
  939 http://idosi.org/mejsr/mejsr21(12)14/15.pdf (accessed February 19, 2016).
- [44] M.J. Griffiths, S.T.L. Harrison, Lipid productivity as a key characteristic for choosing
  algal species for biodiesel production, J. Appl. Phycol. 21 (2009) 493–507.
  doi:10.1007/s10811-008-9392-7.
- 943 [45] J. Johansen, P. Lemke, N. Nagle, P. Chelf, P. Roessler, R. Galloway, S. Toon, Addendum
  944 to Microalgae Culture Collection 1986-1987, National Renewable Energy Lab.(NREL),
  945 Golden, CO (United States), 1987.
- [46] S.M. Renaud, L.-V. Thinh, D.L. Parry, The gross chemical composition and fatty acid
  composition of 18 species of tropical Australian microalgae for possible use in
  mariculture, Aquaculture. 170 (1999) 147–159.
- [47] J. Sheehan, T. Dunahay, J. Benemann, P. Roessler, Look Back at the U.S. Department
  of Energy's Aquatic Species Program: Biodiesel from Algae; Close-Out Report,
  National Renewable Energy Lab., Golden, CO. (US), 1998. doi:10.2172/15003040.
- [48] Z.-Y. Wen, F. Chen, Production potential of eicosapentaenoic acid by the diatom
  Nitzschia laevis, Biotechnol. Lett. 22 (2000) 727–733.
  http://link.springer.com/article/10.1023/A:1005666219163 (accessed February 18, 2016).

- 956 [49] F.-Y. Zhao, J.-R. Liang, Y.-H. Gao, Q.-Q. Luo, Y. Yu, C.-P. Chen, L. Sun, Variations 957 in the Total Lipid Content and Biological Characteristics of Diatom Species for Potential 958 Biodiesel Production. J. Fundam. Renew. Energy Appl. 2016 (2016).959 http://www.omicsonline.com/open-access/variations-in-the-total-lipid-content-and-960 biological-characteristics-of-diatom-species-for-potential-biodiesel-production-2090-961 4541-1000201.php?aid=66659 (accessed February 9, 2016).
- [50] T. Jauffrais, S. Drouet, V. Turpin, V. Méléder, B. Jesus, B. Cognie, P. Raimbault, R.P.
  Cosson, P. Decottignies, V. Martin-Jézéquel, Growth and biochemical composition of a
  microphytobenthic diatom (Entomoneis paludosa) exposed to shorebird (Calidris alpina)
  droppings, J. Exp. Mar. Biol. Ecol. 469 (2015) 83–92.
- [51] T. Jauffrais, B. Jesus, V. Méléder, V. Turpin, A.D.P.G. Russo, P. Raimbault, V.M.
  Jézéquel, Physiological and photophysiological responses of the benthic diatom
  Entomoneis paludosa (Bacillariophyceae) to dissolved inorganic and organic nitrogen in
  culture, Mar. Biol. 163 (2016). doi:10.1007/s00227-016-2888-9.
- [52] R.M. Knuckey, M.R. Brown, S.M. Barrett, G.M. Hallegraeff, Isolation of new nanoplanktonic diatom strains and their evaluation as diets for juvenile Pacific oysters (Crassostrea gigas), Aquaculture. 211 (2002) 253–274. doi:http://dx.doi.org/10.1016/S0044-8486(02)00010-8.
- [53] A.T. Soares, B.F. Silva, L.L. Fialho, M.A.G. Pequeno, A.A.H. Vieira, A.G. Souza, N.R.
  Antoniosi Filho, Chromatographic characterization of triacylglycerides and fatty acid
  methyl esters in microalgae oils for biodiesel production, J. Renew. Sustain. Energy. 5
  (2013) 053111. doi:10.1063/1.4821289.
- 978 [54] T. Viriyayingsiri, P. Sittplangkoon, S. Powtongsook, K. Nootong, Continuous
  979 production of diatom Entomoneis sp. in mechanically stirred tank and flat-panel airlift
  980 photobioreactors, Prep. Biochem. Biotechnol. 46 (2016) 740–746.
  981 doi:10.1080/10826068.2015.1135460.
- [55] F.J. Fields, J.P. Kociolek, An evolutionary perspective on selecting high-lipid-content diatoms (Bacillariophyta), J. Appl. Phycol. 27 (2015) 2209–2220. doi:10.1007/s10811-014-0505-1.
- 985 [56] G.E. Fogg, D.M. Collyer, The accumulation of fats as a characteristic of certain classes
   986 of algae, Proc 8 Int Bot Congr. 17 (1954) 28.
- 987 [57] P.G. Roessler, ENVIRONMENTAL CONTROL OF **GLYCEROLIPID** 988 METABOLISM IN MICROALGAE: COMMERCIAL IMPLICATIONS AND 989 FUTURE RESEARCH DIRECTIONS. J. Phycol. 26 (1990)393-399. 990 doi:10.1111/j.0022-3646.1990.00393.x.
- [58] B. Scholz, G. Liebezeit, Biochemical characterisation and fatty acid profiles of 25
  benthic marine diatoms isolated from the Solthörn tidal flat (southern North Sea), J.
  Appl. Phycol. 25 (2013) 453–465. doi:10.1007/s10811-012-9879-0.
- M. Islam, M. Magnusson, R. Brown, G. Ayoko, M. Nabi, K. Heimann, Microalgal
   Species Selection for Biodiesel Production Based on Fuel Properties Derived from Fatty
   Acid Profiles, Energies. 6 (2013) 5676–5702. doi:10.3390/en6115676.
- [60] S.P. Slocombe, Q. Zhang, M. Ross, A. Anderson, N.J. Thomas, Á. Lapresa, C. RadMenéndez, C.N. Campbell, K.D. Black, M.S. Stanley, Unlocking nature's treasurechest: screening for oleaginous algae, Sci. Rep. 5 (2015) 9844.
- 1000 [61] H. Chtourou, I. Dahmen, A. Jebali, F. Karray, I. Hassairi, S. Abdelkafi, H. Ayadi, S.
  1001 Sayadi, A. Dhouib, Characterization of Amphora sp., a newly isolated diatom wild
  1002 strain, potentially usable for biodiesel production, Bioprocess Biosyst. Eng. 38 (2015)
  1003 1381–1392. doi:10.1007/s00449-015-1379-6.

- 1004 [62] M. De la Pena, Cell growth and nutritive value of the tropical benthic diatom, Amphora
  1005 sp., at varying levels of nutrients and light intensity, and different culture locations, J.
  1006 Appl. Phycol. 19 (2007) 647–655.
- 1007 [63] M. Giordano, M. Kansiz, P. Heraud, J. Beardall, B. Wood, D. McNaughton, Fourier
  1008 transform infrared spectroscopy as a novel tool to investigate changes in intracellular
  1009 macromolecular pools in the marine microalga Chaetoceros muellerii
  1010 (Bacillariophyceae), J. Phycol. 37 (2001) 271–279.
- 1011 [64] H. Wagner, S. Dunker, Z. Liu, C. Wilhelm, Subcommunity FTIR-spectroscopy to
  1012 determine physiological cell states, Curr. Opin. Biotechnol. 24 (2013) 88–94.
  1013 doi:https://doi.org/10.1016/j.copbio.2012.09.008.
- 1014 [65] L.E. Brand, R.R. Guillard, L.S. Murphy, A method for the rapid and precise
  1015 determination of acclimated phytoplankton reproduction rates, J. Plankton Res. 3 (1981)
  1016 193–201. http://plankt.oxfordjournals.org/content/3/2/193.short (accessed April 5,
  1017 2016).
- 1018 [66] M. Gilstad, E. Sakshaug, Growth rates of ten diatom species from the Barents Sea at
  1019 different irradiances and day lengths., Mar. Ecol. Prog. Ser. Oldendorf. 64 (1990) 169–
  1020 173.
- [67] C. Breil, M. Abert Vian, T. Zemb, W. Kunz, F. Chemat, "Bligh and Dyer" and Folch
  Methods for Solid–Liquid–Liquid Extraction of Lipids from Microorganisms.
  Comprehension of Solvatation Mechanisms and towards Substitution with Alternative
  Solvents, Int. J. Mol. Sci. 18 (2017). doi:10.3390/ijms18040708.
- [68] G.-D. Feng, F. Zhang, L.-H. Cheng, X.-H. Xu, L. Zhang, H.-L. Chen, Evaluation of FT IR and Nile Red methods for microalgal lipid characterization and biomass composition
   determination, Bioresour. Technol. 128 (2013) 107–112.
- 1028 [69] K. Stehfest, J. Toepel, C. Wilhelm, The application of micro-FTIR spectroscopy to
  1029 analyze nutrient stress-related changes in biomass composition of phytoplankton algae,
  1030 Plant Physiol. Biochem. 43 (2005) 717–726. doi:10.1016/j.plaphy.2005.07.001.
- [70] A.P. Dean, D.C. Sigee, B. Estrada, J.K. Pittman, Using FTIR spectroscopy for rapid determination of lipid accumulation in response to nitrogen limitation in freshwater microalgae, Bioresour. Technol. 101 (2010) 4499–4507.
  1034 doi:10.1016/j.biortech.2010.01.065.
- 1035 [71] M. Mubarak, A. Shaija, T.V. Suchithra, A review on the extraction of lipid from
  1036 microalgae for biodiesel production, Algal Res. 7 (2015) 117–123.
  1037 doi:10.1016/j.algal.2014.10.008.
- 1038 [72] Y. Li, F.G. Naghdi, S. Garg, T.C. Adarme-Vega, K.J. Thurecht, W.A. Ghafor, S.
  1039 Tannock, P.M. Schenk, A comparative study: the impact of different lipid extraction
  1040 methods on current microalgal lipid research, Microb. Cell Factories. 13 (2014) 14.
- [73] S.J. Lee, B.-D. Yoon, H.-M. Oh, Rapid method for the determination of lipid from the green alga Botryococcus braunii, Biotechnol. Tech. 12 (1998) 553–556.
- 1043 [74] D. Xu, Z. Gao, F. Li, X. Fan, X. Zhang, N. Ye, S. Mou, C. Liang, D. Li, Detection and
  1044 quantitation of lipid in the microalga Tetraselmis subcordiformis (Wille) Butcher with
  1045 BODIPY 505/515 staining, Bioresour. Technol. 127 (2013) 386–390.
  1046 doi:10.1016/j.biortech.2012.09.068.
- 1047 [75] H. De la Hoz Siegler, W. Ayidzoe, A. Ben-Zvi, R. Burrell, W. McCaffrey, Improving
  1048 the reliability of fluorescence-based neutral lipid content measurements in microalgal
  1049 cultures, Algal Res. 1 (2012) 176–184.
- [76] T. Mutanda, D. Ramesh, S. Karthikeyan, S. Kumari, A. Anandraj, F. Bux,
   Bioprospecting for hyper-lipid producing microalgal strains for sustainable biofuel
   production, Bioresour. Technol. 102 (2011) 57–70. doi:10.1016/j.biortech.2010.06.077.

- [77] W. Chen, C. Zhang, L. Song, M. Sommerfeld, Q. Hu, A high throughput Nile red method for quantitative measurement of neutral lipids in microalgae, J. Microbiol. Methods. 77 (2009) 41–47. doi:10.1016/j.mimet.2009.01.001.
- [78] L.M. Laurens, E.J. Wolfrum, Rapid compositional analysis of microalgae by NIR
   spectroscopy, NIR News. 23 (2012) 9–11.
- 1058 [79] M.S. Cooper, W.R. Hardin, T.W. Petersen, R.A. Cattolico, Visualizing "green oil" in
  1059 live algal cells, J. Biosci. Bioeng. 109 (2010) 198–201.
  1060 doi:10.1016/j.jbiosc.2009.08.004.
- 1061 [80] J.N. Murdock, D.L. Wetzel, FT-IR Microspectroscopy Enhances Biological and
  1062 Ecological Analysis of Algae, Appl. Spectrosc. Rev. 44 (2009) 335–361.
  1063 doi:10.1080/05704920902907440.
- 1064 [81] I. Dreissig, S. Machill, R. Salzer, C. Krafft, Quantification of brain lipids by FTIR
  1065 spectroscopy and partial least squares regression, Spectrochim. Acta. A. Mol. Biomol.
  1066 Spectrosc. 71 (2009) 2069–2075. doi:10.1016/j.saa.2008.08.008.
- 1067 [82] S.M. Renaud, H.C. Zhou, D.L. Parry, L.-V. Thinh, K.C. Woo, Effect of temperature on the growth, total lipid content and fatty acid composition of recently isolated tropical microalgae Isochrysis sp., Nitzschia closterium, Nitzschia paleacea, and commercial species Isochrysis sp.(clone T. ISO), J. Appl. Phycol. 7 (1995) 595–602.
  1071 http://link.springer.com/article/10.1007/BF00003948 (accessed August 25, 2016).
- 1072 [83] M.A. Borowitzka, L.J. Borowitzka, Micro-algal biotechnology, Cambridge University
   1073 Press, 1988.
- 1074 [84] H.A. Spoehr, H.W. Milner, THE CHEMICAL COMPOSITION OF CHLORELLA;
   1075 EFFECT OF ENVIRONMENTAL CONDITIONS, Plant Physiol. 24 (1949) 120–149.
   1076 https://www.ncbi.nlm.nih.gov/pmc/articles/PMC437916/.
- 1077 [85] I.A. Guschina, J.L. Harwood, Lipids and lipid metabolism in eukaryotic algae, Prog.
  1078 Lipid Res. 45 (2006) 160–186. doi:10.1016/j.plipres.2006.01.001.
- 1079 [86] L. Brand, R. Guillard, The effects of continuous light and light intensity on the
  1080 reproduction rates of twenty-two species of marine phytoplankton, J. Exp. Mar. Biol.
  1081 Ecol. 50 (1981) 119–132.
- 1082 [87] P.J. le B. Williams, L.M. Laurens, Microalgae as biodiesel & biomass feedstocks: review
  1083 & analysis of the biochemistry, energetics & economics, Energy Environ. Sci. 3 (2010)
  1084 554–590.
- 1085 [88] S. Wahidin, A. Idris, S.R.M. Shaleh, The influence of light intensity and photoperiod on
   1086 the growth and lipid content of microalgae Nannochloropsis sp., Bioresour. Technol. 129
   1087 (2013) 7–11. doi:10/f4mb36.
- [89] L. Rodolfi, G. Chini Zittelli, N. Bassi, G. Padovani, N. Biondi, G. Bonini, M.R. Tredici,
  Microalgae for oil: Strain selection, induction of lipid synthesis and outdoor mass
  cultivation in a low-cost photobioreactor, Biotechnol. Bioeng. 102 (2009) 100–112.
  doi:10.1002/bit.22033.
- 1092 [90] E.S. Shuba, D. Kifle, Microalgae to biofuels: 'Promising' alternative and renewable
  1093 energy, review, Renew. Sustain. Energy Rev. 81 (2018) 743–755.
  1094 doi:10.1016/j.rser.2017.08.042.
- 1095 [91] M.P. de Souza, M. Hoeltz, P.D. Gressler, L.B. Benitez, R.C.S. Schneider, Potential of
   1096 Microalgal Bioproducts: General Perspectives and Main Challenges, Waste Biomass
   1097 Valorization. (2018). doi:10.1007/s12649-018-0253-6.
- 1098 [92] M.-H. Liang, J. Zhu, J.-G. Jiang, High-value bioproducts from microalgae: strategies
  1099 and progress, Crit. Rev. Food Sci. Nutr. 0 (2018) 01–53.
  1100 doi:10.1080/10408398.2018.1455030.

## 1105 7 Figure legends

**Figure. 1** Example of growth curves measured for *Amphora* sp 1 NCC260 by (A) cell count, (B) fluorometry PAM (F0) and (C) radiometry (NDVI). Points corresponding to cell concentration according to time. Line curves corresponding to the Gompertz model fitted to cell concentration as a function of time. n=3, vertical bar = SD. The arrows indicate the late exponential day estimated by the Gompertz model.

1111 Figure. 2 Values of the parameters measured for the screened strains. This includes strain

productivity (A), lipid content as measured from the gravimetric method (B), the lipid ratio as
measured semi-quantitatively by the FTIR approaches, [(eb+CH3+CH3)/si] (C) or [area

1114 eb+CH2+CH3)/Total area] multiplied by 100 for scaling purposes (D). The a, b, c notation

1115 corresponded to the maximum and minimum values for groups 1, 2 and 3. N=3, independent 1116 measurements,  $\pm$  SD.

Figure. 3 Example of averaged FTIR spectra recorded on entire cells or on the corresponding lipid extract. (A) *Staurosira* sp NCC182 FTIR signature recorded on the entire cells and (B) *Staurosira* sp NCC182 FTIR signature recorded on a crude lipid extract. The grey area corresponds to the variation of the FTIR signal associated to the standard deviation for n=3 lindependent measurements.

1122 Figure. 4 Correspondence analysis map calculated on the basis of the macromolecular content 1123 as evaluated by FTIR on all the assayed strains of the NCC. N=3 independent measurements. 1124 Figure 5 Venn diagram showing the degree of overlap among the different approaches used 1125 to identify the lipid rich diatoms. In the gravimetric method circle, 14 strains were identified as rich in lipids: 4 only with this method (NCC260, NCC208, NCC253, NCC351), one strains 1126 1127 were also identified as rich and lipid by the FTIR on lipid extract (NCC229), and two strains were also identified as rich in lipids by the FTIR on entire cells (NCC33, NCC199). One strain 1128 1129 was identified by FTIR on lipid extract and FTIR on whole cells (NCC366) and seven strains 1130 were identified as rich in lipids by all three methods (NCC109, NCC182, NCC113, NCC270, 1131 NCC169, NCC303, NCC216).

**Figure 6.** Boxplots summarizing the sample distribution criteria as measured with FTIR methods, gravimetry for the lipid rate and with flurorimetry for productivity. FTIR data was expressed in arbitrary units. Lipid rates in %DW and Px in g.L<sup>-1</sup>.day<sup>-.1</sup> FTIR results wasmultiplied by 20 for scaling purposes. The Px was multiplied by 100 for scaling purposes. 33 strains were assayed in independent biological triplicates.

- 1140 Figures
- 1142 Figure 1.







- 1179 Fig. 4



## 1195 Fig. 5



FTIR on entire cells





## 1235 Table S1. Supplementary data. Strains who did not grown.

	Species	NCC strain	Sampling location
1237	-	identification	
	Amphora sp. B2	NCC261	France,NW Atlantic coast
	Amphora sp. AC16	NCC410	France,NW Atlantic coast
1238	Amphora sp. AE8	NCC413	France,NW Atlantic coast
	Berkeleya rutilans	NCC210.2	France,NW Atlantic coast
	Berkeleya rutilans	NCC309	France, Mediterranean sea
1239	Brockmaniella brockmanii 2	NCC403	France,NW Atlantic coast
	Caloneis sp. 1	NCC180	France,NW Atlantic coast
	Catacombas sp. 1	NCC337	France, Mediterranean sea
1240	Cocconeis scutellum 1	NCC209.1	France, NW Atlantic coast
	Cocconeis scutellum 2	NCC209.2	France, NW Atlantic coast
	Cocconeis scutellum 2	NCC209.3	France, NW Atlantic coast
1241	Craspedostauros sp. 3	NCC57	France, NW Atlantic coast
	Craspedostauros sp. 4	NCC58	France, NW Atlantic coast
	Craspedostauros sp. 5	NCC204	France, NW Atlantic coast
1242	Entomoneis alata 1	NCC16	France, NW Atlantic coast
	Entomoneis alata 2	NCC448	Portugal, NW Atlantic coast
	Entomoneis sp. BAB2	NCC415	France, NW Atlantic coast
1243	Gyrosigma sp. 1	NCC411	France, NW Atlantic coast
	Gyrosigma sp. 2	NCC412	France, NW Atlantic coast
	Gyrosigma tenuissimum	NCC258	France, NW Atlantic coast
	Halamphora coffeaformis	UTCC58	Canada, NW Atlantic coast
	Helicotheca tamesis 1	NCC59	, France, Mediterranean sea
	Helicotheca tamesis 2	NCC60	France,NW Atlantic coast
	Lampriscus sp.	NCC347	France, Mediterranean sea
	Leptocylindrus danicus 1	NCC205	France,NW Atlantic coast
	Leptocylindrus danicus 2	NCC206	France,NW Atlantic coast
	Melosira nummuloîdes 1	NCC25	France,NW Atlantic coast
	Melosira nummuloîdes 2	NCC25.1	France,NW Atlantic coast
	Navicula sp. Z4	NCC224	France,NW Atlantic coast
	Navicula sp. e1	NCC269	France, NW Atlantic coast
	Navicula cf ramosissima	NCC449	France, NW Atlantic coast
	Nitzschia laevis	NCC39	France, NW Atlantic coast
	Nitzschia salinicola	NCC41	France, NW Atlantic coast
	Nitzschia sp. B4	NCC114	France, NW Atlantic coast
	Opehora sp. 2	NCC365	France, NW Atlantic coast
	Paralia sulcata	NCC177	France, NW Atlantic coast
	Pleurosigma sp. K	NCC339	Ukraine, Black sea
	Pleurosigma sp. LM	NCC404	France, NW Atlantic coast
	Pleurosigma sp. BC1	NCC423	France, NW Atlantic coast
	Pleurosigma sp. BC7	NCC425	France, NW Atlantic coast
	Pleurosigma sp. BC15	NCC428	France, NW Atlantic coast
	Rhizosolenia setigera	NCC127	France, NW Atlantic coast
	Tabularia tabulata	NCC338	France, NW Atlantic coast

				FTIR				ATR
Species	code	<u> </u>	D	E1 / :	CHA/ ·	GUA / ·		<u> </u>
		Carb/si	Prot/s1	Eb/si	CH2/si	CH3/si	eb	CH2 + CH3
Amphora acutiuscula	NCC216	53.6 ± 8.2	$45.8 \pm 5.7$	$22.1 \pm 4.9$	$65.7 \pm 8.0$	$53.5 \pm 7.8$	$6.2 \pm 0.9$	$24.3 \pm 2.4$
Amphora sp. 1	NCC260	$63.6 \pm 2.9$	$40.0 \pm 2.0$	$12.2 \pm 2.3$	$57.3 \pm 3.3$	$39.2 \pm 0.6$	$4.5\pm0.7$	$18.1 \pm 3.1$
Amphora sp. 2	NCC169	$58.1 \pm 4.3$	$42.4 \pm 1.1$	$17.2 \pm 3.4$	$59.7 \pm 3.4$	$49.7 \pm 3.0$	$7.1 \pm 0.7$	$42.1 \pm 11.0$
Brockmaniella brockmanii	NCC161	$51.2 \pm 5.5$	$25.2 \pm 6.4$	$12.8 \pm 4.0$	$57.7 \pm 5.5$	$41.8 \pm 5.5$	$4.1 \pm 1.6$	$21.1 \pm 5.6$
Conticriba weissflogii	NCC133	$47.4\pm0.5$	$40.2 \pm 0.8$	$5.03 \pm 1.5$	$48.4\pm2.6$	$41.7 \pm 1.9$	$4.7 \pm 0.3$	$20.0\pm0.7$
Conticriba weissflogii	CCMP1336	$48.3 \pm 2.8$	$43.5 \pm 3.3$	$9.8 \pm 1.8$	$48.7 \pm 3.0$	$40.9 \pm 2.7$	$5.0 \pm 0.7$	$16.9 \pm 2.2$
Craspedostauros britannicus	NCC195	$60.7 \pm 2.4$	$69.8 \pm 11$	$23.2 \pm 3.3$	$80.7 \pm 8.0$	$66.0 \pm 6.9$	$4.8 \pm 0.4$	$19.2 \pm 1.8$
Craspedostauros britannicus	NCC199	$55.1 \pm 3.4$	$47.5 \pm 5.7$	$26.9 \pm 3.4$	$62.2 \pm 2.7$	$44.2 \pm 3.3$	$5.4 \pm 0.6$	$20.5 \pm 1.9$
Craspedostauros sp. 1	NCC228	$44.3\pm0.1$	$37.8 \pm 4.3$	$6.2 \pm 0.4$	$46.3 \pm 6.4$	$37.8 \pm 6.0$	$3.9 \pm 0.8$	$15.2 \pm 3.4$
Craspedostauros sp. 2	NCC218	$54.6 \pm 2.6$	$49.4 \pm 3.5$	$7.5 \pm 0.3$	$46.0 \pm 3.8$	$39.0 \pm 4.0$	$4.7 \pm 0.3$	$17.9 \pm 2.5$
Cymatosira belgica	NCC208	$41.6 \pm 4.8$	$25.4 \pm 3.3$	$6.7 \pm 1.1$	$55.4 \pm 5.1$	$41.5 \pm 3.7$	$5.9 \pm 0.7$	$22.7 \pm 3.2$
Entomoneis paludosa	NCC18.1.1	$39.6 \pm 0.3$	$26.0 \pm 2.7$	$2.9 \pm 0.1$	$27.3 \pm 2.4$	$19.4 \pm 1.8$	$3.9 \pm 0.7$	$23.1 \pm 1.8$
Entomoneis paludosa	NCC18.2.1	$45.7\pm0.6$	$40.9 \pm 1.4$	$6.1 \pm 0.1$	$34.5 \pm 0.9$	$22.5\pm0.6$	$3.1 \pm 0.4$	$21.6 \pm 1.1$
Entomoneis sp. 1	NCC350	$39.9 \pm 0.1$	$30.4 \pm 0.8$	$5.5 \pm 1.5$	$28.6\pm0.9$	$21.2 \pm 1.7$	$2.7 \pm 0.1$	$30.6 \pm 4.3$
Entomoneis sp. 2	NCC20	$42.5\pm0.5$	$32.5 \pm 0.3$	9.5 ±0.3	$40.0\pm0.4$	$26.0\pm0.6$	$4.7 \pm 0.3$	$186 \pm 0.4$
Entomoneis sp. 3	NCC351	$45.5 \pm 2.9$	$41.4 \pm 4.2$	$14.4 \pm 3.4$	$37.2 \pm 0.8$	$28.3\pm0.6$	$3.9 \pm 1.7$	$15.8 \pm 5.6$
Entomoneis sp. 4	NCC301	$62.5 \pm 4.8$	$56.7 \pm 6.4$	$12.5 \pm 2.5$	$64.0 \pm 7.9$	$46.7 \pm 5.6$	$2.9 \pm 0.1$	$17.0 \pm 0.8$
Entomoneis sp. 5	NCC302	$37.6 \pm 0.7$	$36.8 \pm 0.8$	$3.43 \pm 0.1$	$33.9\pm0.7$	$23.9\pm0.5$	$3.3 \pm 0.3$	$19.6 \pm 1.5$
Entomoneis sp. 6	NCC335	$50.5 \pm 0.6$	$35.3 \pm 2.7$	$6.6 \pm 0.7$	$29.9 \pm 1.9$	$19.0 \pm 1.1$	$3.1 \pm 0.2$	$13.4 \pm 3.0$
Entomoneis sp. 7	NCC445	$40.6\pm0.9$	$27.0\pm2.7$	$8.5 \pm 0.2$	$37.7 \pm 0.4$	$29.2 \pm 0.3$	$4.1 \pm 0.9$	$17.5 \pm 4.3$
Extubocellulus cf cribriger	NCC229	$49.8 \pm 3.7$	$38.1 \pm 2.6$	$10.1 \pm 1.2$	$48.0 \pm 1.9$	$38.0 \pm 1.1$	$4.9 \pm 0.3$	$34.2 \pm 1.7$
Fallacia sp. 1	NCC303	$64.7 \pm 1.8$	$74.4 \pm 7.0$	$14.2 \pm 2.5$	$64.5 \pm 4.1$	$55.5 \pm 5.4$	$6.9 \pm 0.3$	$26.4 \pm 2.9$
Fallacia sp. 2	NCC304	$46.0\pm6.2$	$45.7 \pm 3.2$	$31.3 \pm 4.0$	$72.8 \pm 2.7$	$53.3 \pm 2.1$	$5.1 \pm 1.0$	$18.9 \pm 3.4$
Licmophora sp. 1	NCC253	$53.1 \pm 2.7$	$65 \pm 10$	$4.4 \pm 1.1$	$57.9 \pm 5.4$	$50.3 \pm 5.2$	$3.6 \pm 0.3$	$22.6\pm0.6$
Lithodesmium sp	NCC353	$34.2 \pm 2.0$	$25.8\pm0.8$	$2.4 \pm 0.3$	$31.1 \pm 1.1$	$23.1 \pm 0.4$	$2.1 \pm 0.3$	$28.0 \pm 3.2$
Navicula sp. 1	NCC113	$63.3 \pm 4.7$	$43.8 \pm 8.9$	$33.4 \pm 4.7$	$68.2 \pm 9.6$	$52.4 \pm 5.6$	$3.4 \pm 0.4$	$28.8 \pm 1.2$
Navicula sp. 2	NCC226	$54.2 \pm 4.3$	$27.0 \pm 3.0$	$5.2 \pm 0.9$	$53.1 \pm 3.8$	$39.5 \pm 2.8$	$4.2 \pm 0.7$	$22.4 \pm 0.7$
Nitzschia sp. 5	NCC109	$62.0 \pm 2.8$	$42.4 \pm 6.7$	$22.0\pm2.3$	$72.7 \pm 4.6$	$61.3 \pm 4.8$	$6.9 \pm 0.4$	$45.1 \pm 28.9$
Nitzschia alexandrina	NCC33	$58.2 \pm 7.2$	$44.0\pm4.6$	$20.7 \pm 3.3$	$56.1 \pm 4.0$	$45.8\pm0.7$	$5.7 \pm 0.3$	$21.3 \pm 2.3$
<i>Opephora</i> sp. 1	NCC366	$58 \pm 12$	$40.1 \pm 8.8$	$31.6 \pm 6.1$	$50.6 \pm 4.5$	$42.0\pm2.5$	$6.9 \pm 1.1$	$26.3 \pm 4.4$
Pseudonitzschia americana	PNA06 KER	$56.6 \pm 1.4$	$60.6 \pm 3.9$	$3.9 \pm 1.0$	$44.0\pm2.8$	$39.1 \pm 3.2$	$4.0 \pm 0.3$	$38 \pm 28$
Staurosira sp.	NCC182	$47.7\pm6.6$	$30.7 \pm 4.1$	$30.9 \pm 5.4$	$61.6 \pm 4.0$	$49.0\pm2.3$	$7.3 \pm 0.1$	$31.6 \pm 0.6$
Surirella sp. 1	NCC270	$58.5 \pm 2.4$	$54.4 \pm 8.4$	$22.0\pm4.6$	$56.1 \pm 5.3$	$51.3 \pm 5.4$	$7.1 \pm 0.4$	$27.1\pm0.6$

**Table S2**: Lipid quantification evaluated by FTIR and ATR method for all the species.