

1 **Title: Tailoring and optimizing fatty acid production by oleaginous yeasts through the**
2 **systematic exploration of their physiological fitness**

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13 **Background:** The use of palm oil for our current needs is unsustainable. Replacing palm oil
14 with oils produced by microbes through the conversion of sustainable feedstocks is a promising
15 alternative. However, there are major technical challenges that must be overcome to enable this
16 transition. Foremost among these challenges is the stark increase in lipid accumulation and
17 production of higher content of specific fatty acids. Therefore, there is a need for more in-depth
18 knowledge and systematic exploration of the oil productivity of the oleaginous yeasts. In this
19 study, we cultivated *Cutaneotrichosporon oleaginosus* and *Yarrowia lipolytica* at various C/N
20 ratios and temperatures in a defined medium with glycerol as carbon source and urea as nitrogen
21 source. We ascertained the synergistic effect between various C/N ratios of a defined medium
22 at different temperatures with Response Surface Methodology (RSM) and explored the
23 variation in fatty acid composition through Principal Component Analysis.

24 **Results:** By applying RSM, we determined a temperature of 30 °C and a C/N ratio of 175 g/g
25 to enable maximal oil production by *C. oleaginosus* and a temperature of 21 °C and a C/N ratio
26 of 140 g/g for *Y. lipolytica*. We increased production by 71 % and 66 % respectively for each
27 yeast compared to the average lipid accumulation in all tested conditions. Modulating
28 temperature enabled us to steer the fatty acid compositions. Accordingly, switching from higher
29 temperature to lower cultivation temperature shifted the production of oils from more saturated
30 to unsaturated by 14 % in *C. oleaginosus* and 31 % in *Y. lipolytica*. Higher cultivation
31 temperatures resulted in production of even longer saturated fatty acids, 3 % in *C. oleaginosus*
32 and 1.5 % in *Y. lipolytica*.

33 **Conclusions:** In this study, we provided the optimum C/N ratio and temperature for *C.*
34 *oleaginosus* and *Y. lipolytica* by RSM. Additionally, we demonstrated that lipid accumulation
35 of both oleaginous yeasts was significantly affected by the C/N ratio and temperature.
36 Furthermore, we systematically analyzed the variation in fatty acids composition and proved
37 that changing the C/N ratio and temperature steer the composition. We have further established
38 these oleaginous yeasts as platforms for production of tailored fatty acids.

39 **Keywords:** Oleaginous yeasts, microbial oil, Response Surface Methodology, carbon to
40 nitrogen ratio, lipid accumulation.

41 **Introduction**

42 The use of plant-derived oils, especially palm oil, is increasing at an alarming rate. This is
43 happening in part as a replacement for fossil foils, but mostly as they are cheap sources of many
44 useful components. The oils and fatty acids derived from palm trees are used in food, feed,
45 chemical, personal care, and cosmetic products for health benefits, sensorial reasons (texture,
46 flavor), to extend shelf-life, and as surfactants or emulsifiers [1–3]. As a result, palm tree groves
47 are rapidly replacing the original tropical forests, and other original and traditional vegetation

48 in many Asian, South American, and African countries. This replacement is not only
49 threatening the local ecosystem but is also having a major effect on the local livelihoods, as it
50 causes deforestation and contributes to climate change [4,5]. Despite some responsible actions
51 that have been taken, among them fighting against deforestation driven by RSPO (Roundtable
52 on Sustainable Palm Oil), the use of palm oil remains controversial [6]. To that end, developing
53 a sustainable alternative to fatty acids and oils is urgent and of utmost interest.

54 Oil-producing yeasts, referred to as oleaginous yeasts, have strong potential as sustainable
55 alternatives for lipid production in various industrial applications [7]. *Yarrowia lipolytica* and
56 *Cutaneotrichosporon oleaginosus* also known as *Apiotrichum curvatum*, *Cryptococcus*
57 *curvatus*, *Trichosporon cutaneum*, *Trichosporon oleaginosus*, and *Cutaneotrichosporon*
58 *curvatum* are reported among the top five most well-known oil-producing yeasts. *C.*
59 *oleaginosus* and *Y. lipolytica* can accumulate oils up to 70% and 40% of their biomass
60 respectively [8–10]. Lipid accumulation in oleaginous yeasts is induced by limiting specific
61 nutrients such as nitrogen, phosphate, and sulphur. Nitrogen limitation or, in other words, a
62 high C/N ratio in the growth medium, has been observed to be the most effective lipid induction
63 strategy [9]. As reported by Ykema et al., after passing the critical C/N of 11 g/g, the oleaginous
64 yeast starts to accumulate oils by re-routing the excess carbon to be stored as lipids [11,12].
65 Under nitrogen limiting conditions, the produced fatty acid composition has been reported to
66 be 25% palmitic acid (C16:0), 10% stearic acid (C18:0), 57% oleic acid (C18:1), and 7%
67 linoleic acid (C18:2) by *C. oleaginosus* [13] and 15% C16:0, 13% C18:0, 51% C18:1, and 21%
68 C18:2 by *Y. lipolytica* [14]. This composition is comparable to that of palm oil. Furthermore,
69 these yeasts can use a broad range of carbon sources, such as glucose, xylose, glycerol, sucrose,
70 and lactose. They can also use more complex and inexpensive side streams such as crude
71 glycerol from bioethanol production or whey permeate as a feedstock, which is significant to
72 reduce raw materials cost [15–17]. Moreover, *Y. lipolytica* is non-pathogenic and regarded as

73 food-grade yeast, thus its oil can be used for food-related applications [18,19]. Due to these
74 advantages, oleaginous yeasts are flagged as attractive microbial-cell factories to sustain a bio-
75 based circular economy for industrial implementation. However, from an economic point of
76 view, the lipid production process of oleaginous yeasts still requires substantial optimization
77 for industrial purposes. Koutinas et al. [20] reported that implementation of microbial oil in
78 industrial applications is strongly dependent on the final microbial oil concentrations and lipid
79 productivity [19]. For *C. oleaginosus*, it has been calculated that the process is only
80 economically feasible if lipid accumulation reaches approximately 85 % (w/w).

81 Identifying and designing optimal production conditions is a challenging step in developing
82 bioconversion systems since these cultivation conditions play a crucial role in productivity [21].
83 For at least two decades, efforts have been made to design the optimum growth medium and
84 fermentation conditions to boost the lipid accumulation as well as to sustain the growth of
85 oleaginous yeasts [22–24]. One of the most efficient strategies to systematically identify
86 optimum production conditions is through the Response Surface Methodology (RSM). This
87 method decreases experimental time and laborious work compared to the one-factor-at-a-time
88 (OFAT). Whereas OFAT only allows changing one of the considered factors in each of the
89 experiments, RSM provides a design on which multiple parameters are changed at each
90 experimental run. Moreover, RSM aims to predict the observed response, by reliably estimating
91 the experimental variability [25]. For instance, Awad et al. assessed the effect of various carbon
92 and nitrogen sources on the physiology of *C. oleaginosus* via RSM [26]. In another example,
93 Cui et al. focused on the effect of temperature and pH on lipid content and the growth on crude
94 glycerol [27]. Additionally, Canonico et al. reported optimum C/N ratio and time to maximize
95 lipid production of *Y. lipolytica* [17]. However, no studies have focussed on the synergistic
96 effect between the C/N ratio of a defined medium and cultivation parameters.

97 In addition to the optimized lipid productivity of oleaginous yeasts, tailoring the composition
98 of produced lipids is important for increasing economic competitiveness. For instance, the
99 longer fatty acids, such as oleic acid, lauric acid, and palmitic acid are heavily used in home
100 and personal care products due to their cleaning/surfacting activities. Polyunsaturated fatty
101 acids (PUFAs) such as linolenic acid supply various health properties. Ochsenreither et al. [19]
102 reported that temperature and the composition of the medium lead to variation in fatty acid
103 composition. Therefore, analyzing the fatty acid compositions under different cultivation
104 conditions will provide us valuable information that will enable us to devise strategies to tailor
105 fatty acid compositions.

106 Thus, in this study, we aimed to further develop *C. oleaginosus* and *Y. lipolytica* as microbial
107 cell factories for the improved production of lipids and lipids with higher content of specific
108 fatty acids. The first set of experiments was designed to assess the variance between the fatty
109 acid composition produced by *C. oleaginosus* and *Y. lipolytica* at various C/N ratios and
110 temperatures. We extensively studied the variance in fatty acids composition via PCA.
111 Additionally, we performed another set of experiments to broaden the current experimental
112 region for RSM and determined the optimized C/N ratio and temperature for *C. oleaginosus*
113 and *Y. lipolytica*.

114 **Materials and Methods**

115 ***Yeast Strains and Pre-culture Preparation***

116 *Cutaneotrichosporon oleaginosus* ATCC 20509 and *Yarrowia lipolytica* DSM 1345 were
117 maintained on Yeast extract Peptone Dextrose (YPD) agar plates containing 10 g/L yeast
118 extract, 20 g/L peptone, 20 g/L glucose, 20 g/L agar. The maintained cultures were stored at 4
119 °C for up to a week. The inoculum was prepared by transferring a single colony of the

120 oleaginous yeasts into 10 mL YPD broth (10 g/L yeast extract, 20 g/L peptone, 20 g/L glucose,
121 20 g/L) in 50 mL tubes and incubated at 30 °C, 250 rpm for 18 h in a shaking incubator.

122 ***Cultivation Conditions***

123 *C. oleaginosus* and *Y. lipolytica* were grown in defined media consisting of glycerol as a carbon
124 source and urea as a nitrogen source. The medium was adapted from Meester et al. [28] with
125 modifications. In addition to the variation in carbon to nitrogen ration, the medium contained
126 2.7 g/L KH₂PO₄, 1.79 g/L NaH₂PO₄·7H₂O, 0.2 g/L MgSO₄·7H₂O, 0.2 g/L MgSO₄·7H₂O, 0.1
127 g/L EDTA with the pH 5.5 as well as the trace elements: 40 mg/L CaCl₂·2H₂O, 5.5 mg/L
128 FeSO₄·7H₂O, 5.2 mg/L citric acid·H₂O, 1 mg/L ZnSO₄·7H₂O, 0.76 mg/L MnSO₄·H₂O, 10 µL/L
129 H₂SO₄ (36N).

130 ***Experimental Design***

131 The C/N ratio varied from 30:1 (g/g) to 300:1 (g/g) by mixing 4 – 40 g carbon/L with 0.13 g
132 nitrogen/L for both oleaginous yeasts. After that, prepared cultures were incubated at different
133 temperatures (15 °C, 25 °C, 30 °C, and 35 °C), 250 rpm for 96 or 144 hours. For the
134 experimental design, the C/N ratio (X₁) and temperature (X₂) were selected as variables. Low
135 levels and high levels for C/N ratio and temperature are C/N 30, C/N 120, and 15 °C, 35 °C.
136 The coded values of independent variables were calculated by considering the high and low
137 levels together with the real values:

$$138 \quad \text{Coded value} = \frac{\text{real value} - \left(\frac{\text{high level value} + \text{low level value}}{2} \right)}{\frac{1}{2} \times (\text{high value} - \text{low value})}$$

139 and are presented in Table 1.

140 **Table 1.** Levels of two independent variables employed in RSM in terms of real and coded
141 values for *C. oleaginosus* and *Y. lipolytica*.

Levels and coded values	Real values	
	C/N ratio (g/g) X ₁	Temperature (°C) X ₂
-1.0	30	15
-0.3	60	-
0.0	75	25
0.5	-	30
1.0	120	35
3.7	240	-
5.0	300	-

142

143 ***Determination of Biomass***

144 The growth of oleaginous yeasts was monitored every 24 h by measuring the absorbance at
145 600 nm (OD₆₀₀). A calibration curve was plotted with the absorbance versus the dry cell weight
146 for *C. oleaginosus* and *Y. lipolytica* (Figure S1). The dry cell was obtained as follows: (1) 5 mL
147 of culture was centrifuged at 3200 g for 15 mins, (2) the cells were washed twice with 10 mL
148 of deionized water (3) and freeze-dried.

149 ***Identification of lipids and fatty acid composition***

150 The total fatty acids and the fatty acid composition were determined quantitatively. The samples
151 were prepared by mixing 20-25 mg freeze-dried yeast cells with 2 mL of 15% H₂SO₄ in
152 methanol and 2 mL of chloroform containing methyl pentanoate as an internal standard. The
153 samples were incubated for 4 h at 85-95 °C and cooled on ice for 5 min, 1 mL of distilled water
154 was added. Following the phase separation by centrifugation at 2200 g for 5 min, the organic
155 phase was collected from the bottom of the tube and dried with Na₂SO₄. Subsequently, The fatty
156 acid methyl esters (FAME) were analyzed with a gas chromatograph (Brand, City, Country)

157 equipped with a Zebtron ZB-FAME column (30 m x 0.25 mm x 0.20 µm; Phenomenex,
158 Torrance, CA, The US). The yeast's oil content was calculated from the internal standard.

159 ***Computational Analysis***

160 All computational analysis was performed with R version 4.0.2 [29].

161 *Principal Component Analysis (PCA)* was carried out on the fatty acid profiles by the statistics
162 function `prcomp` within R [30]. The correlation biplots of the principal component scores and
163 the loading vectors were plotted through R `ggplot2` package [31].

164 *Response Surface Methodology (RSM)* was performed by the `rsm` package, and the contour
165 plots were generated with the R `pers` or `cont` functions [32]. The relationship between the
166 responses and factors was expressed by the second-order polynomial equation:

$$167 \quad Y = \beta_o + \sum \beta_i x_i + \sum \beta_{ii} x_i^2 + \sum \beta_{ij} x_i x_j .$$

168 Y represents the predicted response, β_o is the interception coefficient, β_i is the linear coefficient,
169 β_{ii} is the quadratic coefficient and β_{ij} is the interaction coefficient, X_i is the independent
170 variable, X_i^2 is the squared effect, and $X_i X_j$ is the interaction effect. The quality of the
171 regression equations was assessed according to the coefficient of determination (R^2) and lack
172 of fit F-test. Statistical analysis of the model was performed using Analysis of Variance
173 (ANOVA) and $p < 0.05$ was considered significant. Optimal levels of the C/N ratio and
174 temperature were given as stationary points via RSM.

175 **Results**

176 In total, 10 experiments were conducted for *C. oleaginosus* and 9 experiments for *Y. lipolytica*.
177 The biomass concentration of *C. oleaginosus* and *Y. lipolytica* varied from 1.24 g/L to 5.54 g/L
178 and 2.34 to 4.52 g/L, lipid content ranged from 3.62 % to 47.41 % and 3.35 % and 18.51 % for
179 all tested conditions (Tables 2 and 3). While the highest lipid content was obtained at C/N 120
180 at 30 °C for *C. oleaginosus*, it reached the maximum point at C/N 140 at 25 °C in *Y. lipolytica*.

181 Incubating *C. oleaginosus* at 15 °C slightly decreased the biomass and lipid content compared
182 to the other tested temperatures. On the other hand, decreasing the C/N ratio reduced the
183 biomass concentration of *Y. lipolytica*.

184 **Table 2.** Biomass density and lipid content of *C. oleaginosus* at different C/N ratios and
185 temperatures.

C (g/L)	C/N (g/g)	Temperature (°C)	Biomass (g/L)	Lipid content (% g/g)
4	30	15	1.24 ± 0.07	10.71 ± 0.93
16	120	15	2.61 ± 0.24	18.09 ± 1.38
32	240	15	2.36 ± 0.21	3.62 ± 0.32
4	30	30	5.43 ± 0.08	31.16 ± 2.54
8	60	30	5.18 ± 0.08	38.48 ± 1.61
16	120	30	5.54 ± 0.16	47.41 ± 0.70
32	240	30	4.43 ± 0.16	44.12 ± 1.06
40	300	30	5.33 ± 0.21	37.83 ± 1.99
4	30	35	2.56 ± 0.03	28.95 ± 1.08
16	120	35	2.54 ± 0.16	38.92 ± 0.73

186

187 **Table 3.** Biomass density and lipid content of *Y. lipolytica* at different C/N ratios and
188 temperatures.

C (g/L)	C/N (g/g)	Temperature (°C)	Biomass (g/L)	Lipid content (% g/g)
4	30	15	2.62 ± 0.08	7.91 ± 0.49
16	120	15	4.40 ± 0.08	15.91 ± 0.07
4	30	30	2.45 ± 0.16	4.00 ± 0.24
16	120	30	4.52 ± 0.14	14.26 ± 1.09
4	30	35	2.34 ± 0.11	3.35 ± 0.33
16	120	35	3.12 ± 0.13	9.25 ± 0.06
9.75	75	25	3.01 ± 0.13	15.29 ± 0.41
9.75	75	25	3.06 ± 0.09	15.01 ± 0.17
18.2	140	25	4.18 ± 0.14	18.51 ± 0.96

189 ***Development of Regression Models and ANOVA***

190 C/N ratio and temperature as coded variables, and lipid content and biomass as responses were
191 analyzed with RSM. The relation was fitted by second-order polynomial equations to obtain
192 the regression equation models (Table 4). These models represent the empirical relationships
193 between the biomass density, lipid content of cells, and the variables (C/N ratio (X_1) and
194 temperature (X_2)) in coded units. These regression models suggest that both linear and quadratic
195 effects of C/N ratio and temperature significantly affected the lipid content of *C. oleaginosus*
196 and *Y. lipolytica* (Table 4). However, interaction of C/N ratio and temperature has no significant
197 effect on any considered responses of *Y. lipolytica*. When the growth of *C. oleaginosus* is not
198 significantly affected by the C/N ratio, the combined effect of the C/N ratio and temperature
199 has a significant effect. On the other hand, only the linear effect of investigated factors
200 significantly affected the growth of *Y. lipolytica*.

201 **Table 4.** Regression equations, statistics of regression equations for lipid content and biomass
 202 of *C. oleaginosus* and *Y. lipolytica*.

<i>C. oleaginosus</i>				<i>Y. lipolytica</i>			
Dependent variable: Lipid content % (w/w)							
$Y(\text{Lipid content})$ $= 39.26 + 4.85 X_1$ $+ 10.08 X_2 + 2.59 X_1 X_2$ $- 1.38 X_1^2 - 14.01 X_2^2$				$Y(\text{Lipid content})$ $= 14.47 + 4.30 X_1 - 3.12 X_2$ $- 0.28 X_1 X_2 - 1.50 X_1^2 - 4.03 X_2^2$			
Source	Estimate	p-values		Source	Estimate	p-values	
Model	39.26	< e-15	***	Model	14.47	< e-15	***
X₁	4.85	< e-08	***	X₁	4.30	< e-10	***
X₂	10.08	< e-12	***	X₂	-3.12	< e-07	***
X₁:X₂	2.59	< e-07	***	X₁:X₂	-0.28	0.480	
X₁²	-1.38	< e-09	***	X₁²	-1.50	0.011	*
X₂²	-14.01	< e-08	***	X₂²	-4.03	< e-05	***
Dependent variable: Biomass (g/L)							
$Y(\text{Biomass}) = 6.12 + 0.11 X_1 + 0.36 X_2$ $- 0.17 X_1 X_2 - 0.02 X_1^2$ $- 3.91 X_2^2$				$Y(\text{Biomass}) = 3.17 + 0.71 X_1 - 0.33 X_2$ $- 0.13 X_1 X_2 - 0.14 X_1^2 - 0.12 X_2^2$			
Source	Estimate	p-values		Source	Estimate	p-values	
Model	6.12	< e-15	***	Model	3.17	< e-15	***
X₁	0.11	0.210		X₁	0.71	< e-09	***
X₂	0.36	0.005	**	X₂	-0.33	0.005	**
X₁:X₂	-0.17	0.005	**	X₁:X₂	-0.13	0.238	
X₁²	-0.02	0.323		X₁²	-0.14	0.344	
X₂²	-3.91	< e-13	***	X₂²	-0.12	0.500	

203

204

205 **Table 5.** Evaluating the significance of regression models by ANOVA.

<i>C. oleaginosus</i>						<i>Y. lipolytica</i>				
Source	Lipid content % (w/w)									
	Degrees of Freedom	Sum Square	Mean Square	F-Value	p-Value	Degrees of Freedom	Sum Square	Mean Square	F-Value	p-Value
FO(X1, X2)	2	4181.0	2090.50	356.93	< 2.2e-16	2	562.80	281.40	141.65	6.459e-13
TWI (X1, X2)	1	497.2	497.20	84.89	2.374e-09	1	1.15	1.15	0.58	0.4561
PQ (X1, X2)	2	1022.5	511.27	87.29	9.709e-12	2	128.23	64.11	32.27	3.936e-07
Residual	24	140.6	5.86			21	41.72	1.99		
Lack of fit	4	82.5	20.63	7.11	0.000992	2	29.90	14.95	24.04	6.237e-06
Pure error	20	58.1	2.90			19	11.81	0.62		
Dependent variable= Lipid content % (w/w); R ² = 0.9759; Adj R ² = 0.9709, p-value= < e-15						Dependent variable= Lipid content % (w/w); R ² = 0.9432; Adj R ² = 0.9296, p-value= <e-11				
Source	Biomass (g/L)									
	Degrees of Freedom	Sum Square	Mean Square	F-Value	p-Value	Degrees of Freedom	Sum Square	Mean Square	F-Value	p-Value
FO(X1, X2)	2	23.91	11.97	69.94	1.128e-10		14.03	7.01	49.52	1.122e-08
TWI (X1, X2)	1	0.31	0.31	1.80	0.1919	1	0.24	0.24	1.70	0.2063
PQ (X1, X2)	2	42.61	21.30	122.84	2.467e-13	2	0.16	0.08	0.55	0.5834
Residual	24	4.16	0.17			21	2.97	0.14		
Lack of fit	4	3.43	0.86	23.58	2.483e-07	2	2.37	0.19	37.48	2.539e-07
Pure error	20	0.73	0.04			19	0.60	0.03		
Dependent variable= Biomass (g dcw/L); R ² = 0.9414; Adj R ² = 0.9292, p-value= <e-13						Dependent variable= Biomass (g dcw/L); R ² = 0.8291; Adj R ² = 0.7884, p-value= <e-06				
FO, TWI, and PQ refer to the linear function, two-way interactions, and quadratic terms in the model formula of RSM respectively.										

206

207 ANOVA was performed to assess the significance and adequacy of response surface quadratic
 208 models. The quality of the model fit can be evaluated by the coefficient of determination (R²),
 209 which provides a measure of how much variability in the observed response values can be
 210 explained by the experimental factors and their interactions. The R² value is always between 0
 211 and 1 and the closer the R² value is to 1, the stronger the model is and the better it predicts the
 212 response. For the developed models of *C. oleaginosus* and *Y. lipolytica*, the determination

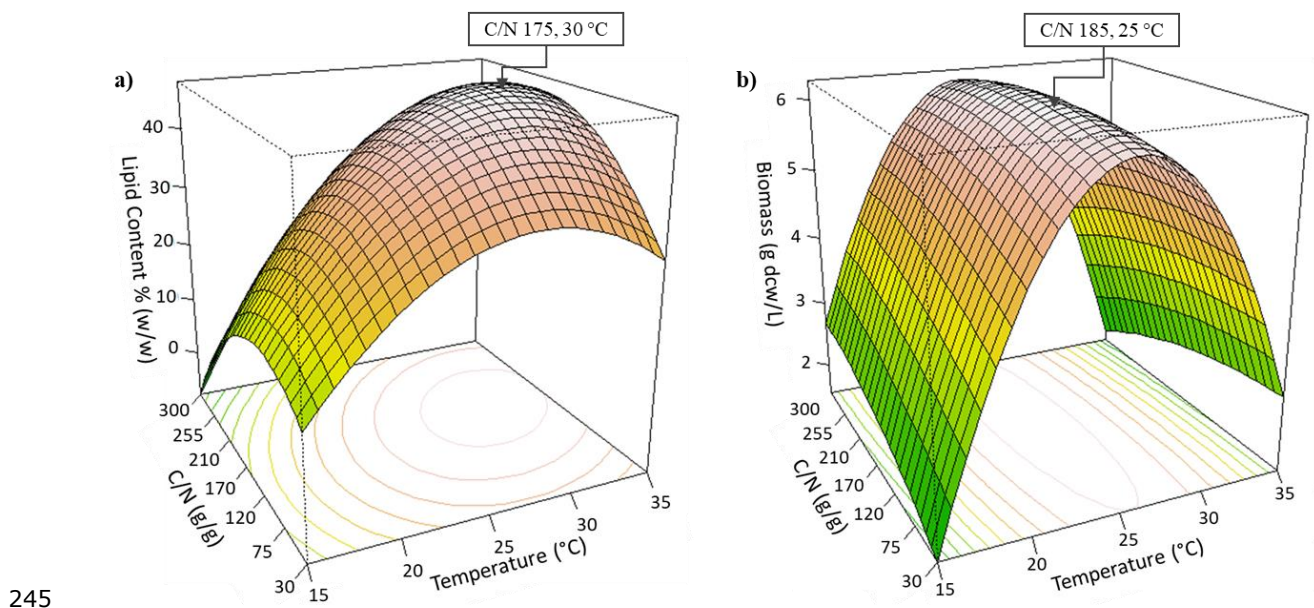
213 confidence coefficients (R^2) are 97.58 % and 94.32 % for lipid content, 94.14 % and 82.91 %
214 for biomass. These R^2 values represented that sample variation of the regression models
215 described the experimental data accurately. The model is regarded as significant if the p-value
216 is lower than 0.05. In other words, 'Model F-value' could occur because of noise with only a
217 5% chance [33]. Therefore p-value of the models, for *C. oleaginosus* $P_{\text{lipid accumulation}} = < e^{-15}$,
218 $P_{\text{biomass}} = < e^{-13}$, and for *Y. lipolytica* $P_{\text{lipid accumulation}} = < e^{-11}$, and $P_{\text{biomass}} = < e^{-6}$ suggested the
219 coefficients are significant. The Lack of Fit P-values showed that the Lack of Fit F-value could
220 occur due to noise with the possibility of almost 0 % for the second model for *C. oleaginosus*
221 and 0 % for all models for *Y. lipolytica*, and 0.0992 % for the first model of *C. oleaginosus*.

222 ***Response Surface Analysis***

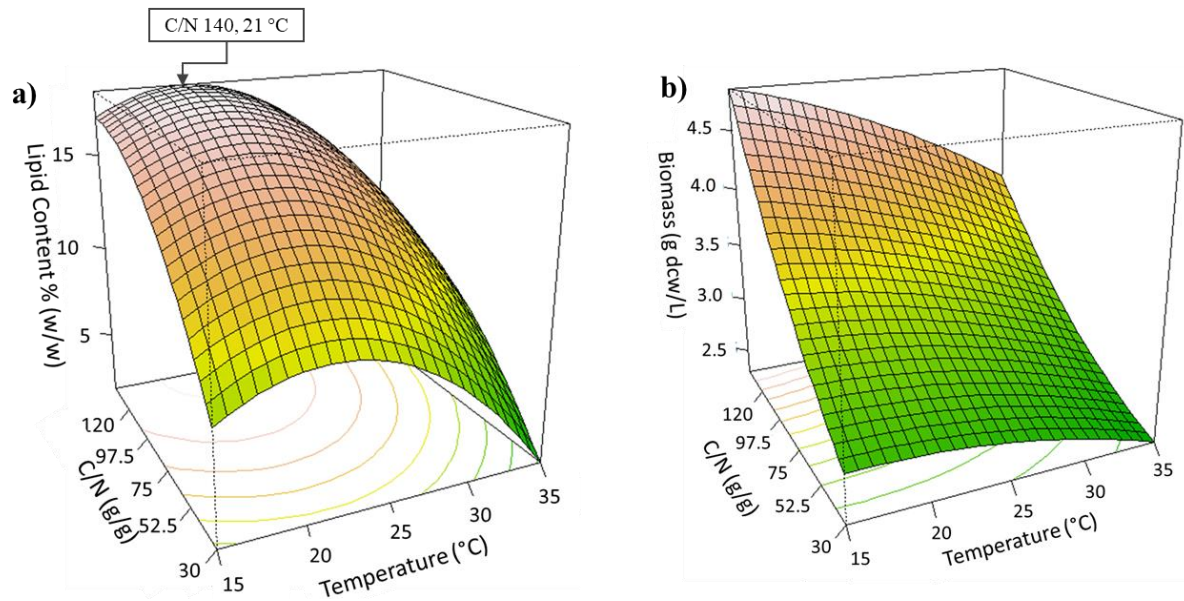
223 The factors, C/N ratio of the growth medium, and temperature were selected to be optimized
224 for *C. oleaginosus* and *Y. lipolytica*. Three-dimensional surface responses were plotted to
225 illustrate the relationships between the responses and variables for *C. oleaginosus* (Figure 1)
226 and *Y. lipolytica* (Figure 2). When the temperature was around 30 °C and the C/N ratio was
227 between C/N 75 to C/N 220, the lipid accumulation of *C. oleaginosus* was improved (Figure 1-
228 a). On the other hand, the biomass density increased within the range of C/N 60 to C/N 240 and
229 from 25 °C to 30 °C (Figure 1-b). Additionally, lipid accumulation of *Y. lipolytica* was enhanced
230 starting from C/N 100 and between 18 °C to 25 °C (Figure 2-a).

231 The optimal values for the investigated dependence factors were predicted from these 3D
232 response surface plots (Figure 1 and Figure 2). Accordingly, the maximum predicted responses
233 for *C. oleaginosus* were 47.67 % lipid accumulation and 6.26 g yeast dry cell weight/L. While
234 the optimum C/N ratio and temperature were approximately C/N 175 and 30 °C for predicted
235 lipid accumulation, C/N 185 and 25 °C were suggested to achieve the predicted maximum
236 biomass density. The suggested optimum values for lipid accumulation resulted in $51.50 \% \pm$
237 2.84 lipid accumulation, and 5.29 ± 0.08 g dry yeast cells/L which confirmed the predictions of

238 developed regression models (Table 6). Moreover, suggestions of RSM improved lipid
239 accumulation by 9 % in *C. oleagnosus*. Regression models of *Y. lipolytica* predicted the
240 optimum conditions as C/N 140 and 21 °C for maximum lipid production, which predicted
241 18.33 % lipid accumulation, and 4.72 g yeast dry cell weight/L (Table 6). These predicted
242 optimum conditions provided 19.03 ± 0.37 lipid accumulation, and 5.07 ± 0.16 g dry yeast
243 cells/L for *Y. lipolytica*. Additionally, model predictions were validated via experiments at C/N
244 45 and 30 °C for *C. oleagnosus* and C/N 180 at 21 °C for *Y. lipolytica* (Table 6).



246 **Figure 1.** 3D Response surface plot of the combined effects of C/N ratio and temperature levels
247 on a) lipid content (g lipid weight/g yeast dry cell weight), and b) growth (g yeast dry cell
248 weight /L) of *C. oleagnosus*. Determined optima are highlighted in the respective plots.



249

250 **Figure 2.** 3D Response surface plot of the combined effects of C/N ratio and temperature levels
 251 on a) lipid content (g lipid weight/g yeast dry cell weight), and b) growth (g yeast dry cell
 252 weight /L) of *Y. lipolytica*. Determined optima are highlighted in the respective plots.

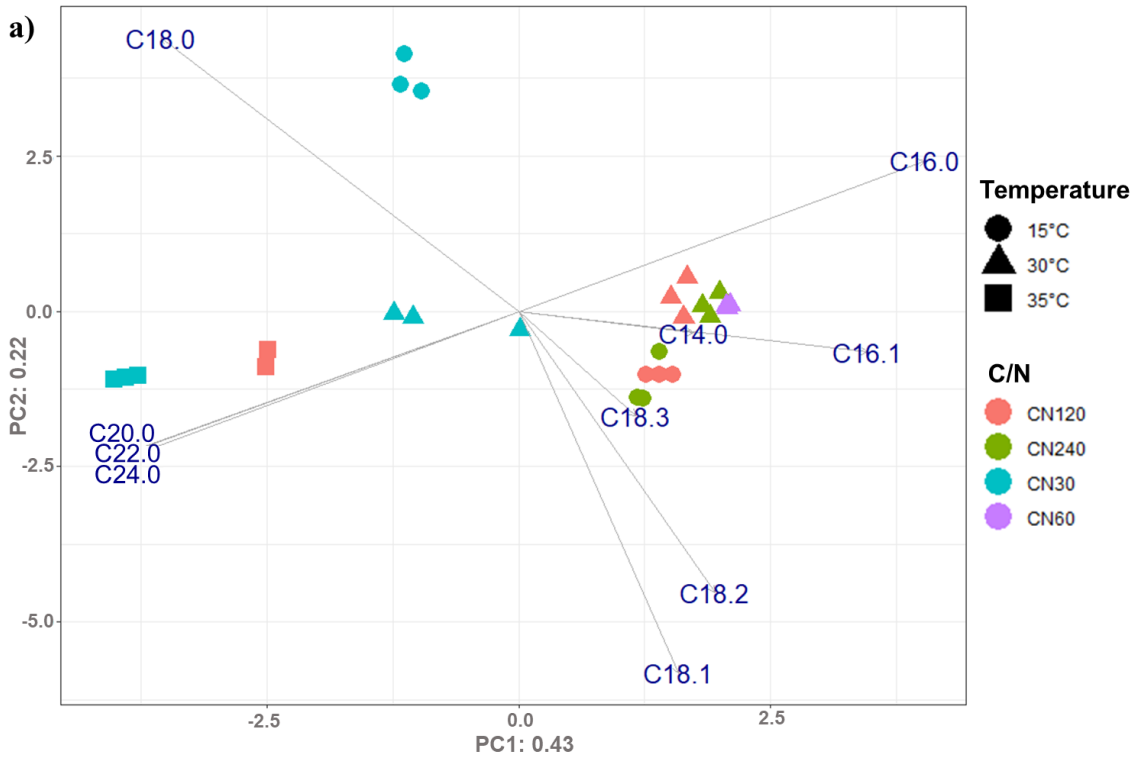
253 **Table 6.** Validation of RSM models by suggested optimum conditions and additional
 254 experiments.

		<i>C. oleagnosus</i>			
		Predicted Values		Measured/Calculated Values	
C/N (g/g)	Temperature (°C)	Lipid Accumulation (% g/g)	Biomass (g/L)	Lipid Accumulation (% g/g)	Biomass (g/L)
45	30	36.08	5.30	38.48 ± 1.61	5.28 ± 0.08
175	30	47.67	4.97	51.17 ± 0.66	5.35 ± 0.28
		<i>Y. lipolytica</i>			
		Predicted Values		Measured/Calculated Values	
C/N (g/g)	Temperature (°C)	Lipid Accumulation (% g/g)	Biomass (g/L)	Lipid Accumulation (% g/g)	Biomass (g/L)
140	21	18.33	4.72	19.03 ± 0.37	5.07 ± 0.16
180	21	17.20	5.81	17.72 ± 0.16	4.96 ± 0.16

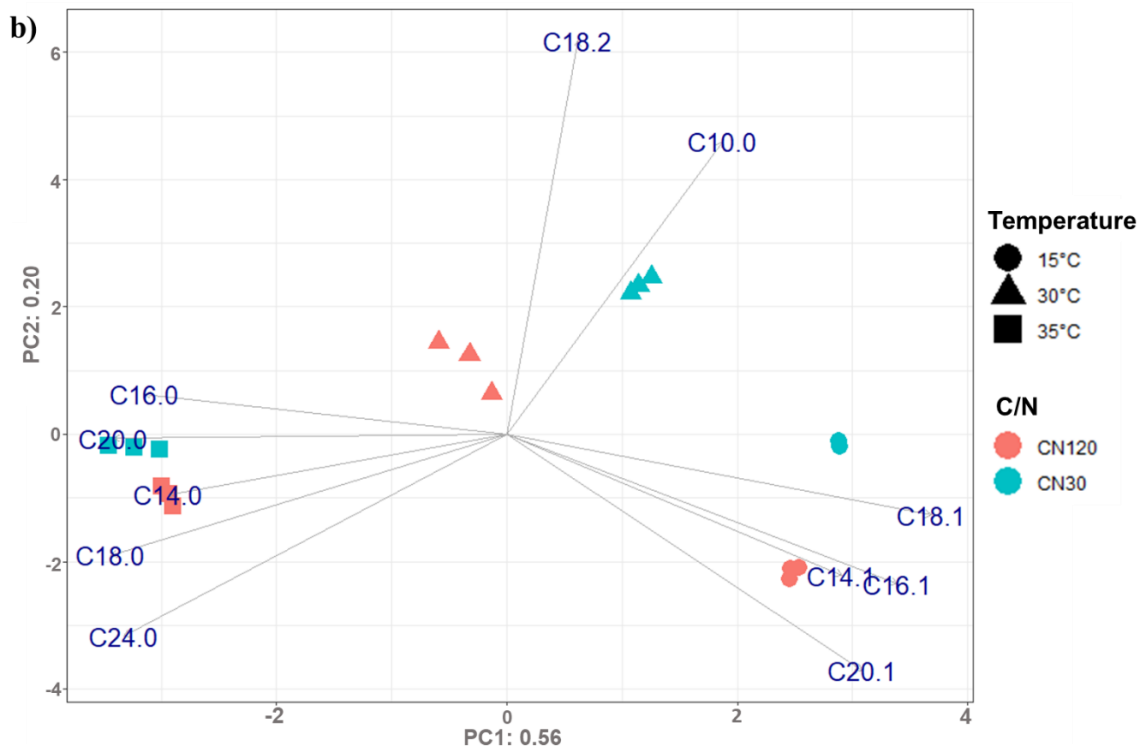
255

256 ***Analysis of the fatty acid profile***

257 Principal Component Analysis (PCA) was conducted to clarify the variation in the fatty acid
258 profile at different C/N ratios and temperatures. Produced the fatty acid compositions of *C.*
259 *oleaginosus* and *Y. lipolytica* are represented in Table 7 and Table 8. The PCA showing the
260 variation in the fatty acid profile is shown in Figure 3. As seen in Figure 3-a for *C. oleaginosus*
261 the variance explained in PC1 and PC2 were 43 % and 22 % respectively and for *Y. lipolytica*
262 (Figure 3-b) was 56 % and 20 %. As observed from Figure 3-a, the highest temperature (35 °C)
263 and the combination of C/N 30 with the other tested temperatures (15 °C, 30 °C) caused a higher
264 content of saturated and longer chain fatty acids (C20:0, C22:0, C24:0). *C. oleaginosus*
265 produced higher content of unsaturated fatty acids (C18:1, C18:2, C18:3) at the lowest
266 temperature, 15 °C. On the other hand, we observed the same effect on the fatty acid profile of
267 *Y. lipolytica* in terms of saturation level and chain length by changing the temperature. *Y.*
268 *lipolytica* produced higher content of C14:0, C16:0, C18:0, C20:0, and C24:0 when it was
269 incubated at 35 °C, and C14:1, C16:1, C18:1, and C20:1 at 15 °C.



270



271

272 **Figure 3.** PCA on the fatty acid profile at different C/N ratios in the growth medium and
273 temperatures for a) *C. oleaginosa* and b) *Y. lipolytica*. Variance explained by each component
274 is given in the labels.

275 **Table 7.** Fatty acid profile of *C. oleagnosus* at various C/N ratios and temperatures.

C/N (g/g)	Temperature (°C)	Fatty Acid Profile (%)														
		C14:0	C16:0	C16:1	C18:0	C18:1	C18:2	C18:3	C20:0	C22:0	C24:0	Saturated FAs	MUFAs	PUFAs	Long chain FAs	Very long chain FAs
30	15	-	24.62 ± 1.47	-	43.92 ± 0.53	26.58 ± 1.09	4.88 ± 1.96	-	-	-	-	68.54 ± 1.47	26.58 ± 1.09	4.88 ± 1.96	100 ± 0.0	-
	30	-	15.44 ± 3.06	-	21.09 ± 4.22	46.70 ± 1.41	14.27 ± 1.93	-	-	-	2.50 ± 0.54	39.03 ± 1.05	46.7 ± 1.41	14.27 ± 1.93	97.5 ± 0.54	2.5 ± 0.54
	35	-	9.33 ± 0.58	-	28.14 ± 0.80	42.52 ± 0.86	12.50 ± 0.81	-	1.90 ± 0.17	1.27 ± 0.06	4.34 ± 0.06	44.98 ± 0.05	42.52 ± 0.86	12.50 ± 0.81	94.39 ± 0.0	5.61 ± 0.0
60	30	-	21.00 ± 1.67	1.09 ± 0.07	18.96 ± 2.74	51.06 ± 0.87	8.25 ± 0.91	-	-	-	-	39.96 ± 2.26	52.15 ± 1.36	8.25 ± 0.91	100 ± 0.0	-
120	15	-	18.32 ± 0.54	1.79 ± 0.43	10.74 ± 0.63	56.16 ± 1.64	10.74 ± 0.62	2.26 ± 0.24	-	-	-	29.05 ± 0.24	57.95 ± 1.21	13.00 ± 0.97	100 ± 0.0	-
	30	0.39 ± 0.03	30.33 ± 2.14	2.71 ± 0.23	7.39 ± 0.49	46.50 ± 1.98	11.93 ± 0.50	-	0.44 ± 0.01	-	0.30 ± 0.02	38.85 ± 2.57	49.22 ± 2.14	11.93 ± 0.50	99.7 ± 0.02	0.30 ± 0.02
	35	0.40 ± 0.01	14.61 ± 0.11	0.71 ± 0.01	22.09 ± 0.22	47.85 ± 0.04	8.54 ± 0.18	-	1.75 ± 0.06	1.13 ± 0.03	3.09 ± 0.00	43.34 ± 0.43	48.55 ± 0.03	8.54 ± 0.18	95.95 ± 0.08	4.22 ± 0.04
240	15	-	24.89 ± 2.20	-	-	59.08 ± 2.55	16.01 ± 0.82	-	-	-	-	24.89 ± 2.20	59.08 ± 2.55	16.01 ± 0.82	100 ± 0.0	-
	30	0.38 ± 0.03	29.30 ± 1.46	2.88 ± 0.10	6.82 ± 0.19	47.23 ± 1.49	13.10 ± 0.33	-	-	-	0.29 ± 0.03	36.79 ± 1.62	50.11 ± 1.51	13.10 ± 0.33	100 ± 0.0	0.29 ± 0.03

MUFAs: Monounsaturated fatty acids, PUFAs: Polyunsaturated fatty acids

277 **Table 8.** Fatty acid profile of *Y. lipolytica* at various C/N ratios and temperatures.

		Fatty Acid Profile (%)															
C/N (g/g)	Temperature (°C)	C10:0	C14:0	C14:1	C16:0	C16:1	C18:0	C18:1	C18:2	C20:0	C20:1	C24:0	Saturated FAs	MUFAs	PUFAs	Long chain FAs	Very long chain FAs
30	15	1.27 ± 0.15	-	0.68 ± 0.01	8.56 ± 0.34	13.41 ± 0.37	6.27 ± 0.70	46.54 ± 1.17	21.41 ± 0.01	-	1.84 ± 0.32	-	16.11 ± 1.20	62.48 ± 1.22	21.41 ± 0.01	98.72 ± 0.16	-
	30	2.53 ± 0.31	-	-	10.59 ± 0.35	11.47 ± 0.68	5.57 ± 0.38	43.97 ± 0.88	24.67 ± 0.44	1.18 ± 0.10	-	-	19.88 ± 0.27	55.44 ± 0.21	24.67 ± 0.44	97.47 ± 0.31	-
	35	-	1.02 ± 0.31	-	18.77 ± 0.27	6.47 ± 0.18	14.94 ± 1.37	33.83 ± 0.13	19.14 ± 0.71	3.60 ± 0.27	-	2.22 ± 0.04	40.56 ± 1.02	40.30 ± 0.31	19.14 ± 0.71	97.77 ± 0.04	2.22 ± 0.04
120	15	-	-	0.30 ± 0.00	10.26 ± 0.10	19.98 ± 0.66	5.38 ± 0.25	50.21 ± 0.43	11.38 ± 0.20	-	1.81 ± 0.03	0.68 ± 0.01	16.32 ± 0.40	72.29 ± 0.52	11.38 ± 0.20	99.32 ± 0.10	0.68 ± 0.01
	30	-	-	-	23.31 ± 0.58	11.40 ± 1.37	7.81 ± 0.66	35.73 ± 1.06	21.74 ± 1.39	-	-	-	31.12 ± 0.08	47.14 ± 1.30	21.75 ± 1.38	100 ± 0.00	-
	35	-	0.29 ± 0.01	-	20.97 ± 0.05	6.79 ± 0.24	22.14 ± 1.06	32.75 ± 1.23	12.72 ± 0.58	2.23 ± 0.14	-	2.11 ± 0.13	47.73 ± 0.87	39.54 ± 1.42	12.72 ± 0.58	97.88 ± 0.13	2.11 ± 0.13
MUFAs: Monounsaturated fatty acids, PUFAs: Polyunsaturated fatty acids																	

278 **Discussion**

279 The lipid accumulation and lipid productivity in oleaginous yeasts are strongly dependent on
280 the composition of the cultivation medium and the operational conditions. Therefore, this study
281 sought to assess the importance of such factors in lipid production. To this end, we performed
282 an RSM analysis and represented the optimum C/N ratio and temperature for the maximization
283 of lipid content, and biomass density. The optimum C/N ratio and temperature are C/N 175 at
284 30°C for *C. oleaginosus* and C/N 140 at 21°C for *Y. lipolytica*. Moreover, we demonstrated that
285 a C/N ratio and temperature cause variations in the fatty acid composition of oleaginous yeasts.

286 In the experiments performed for RSM, we used glycerol as a carbon source as this is efficiently
287 utilized by *C. oleaginosus* and *Y. lipolytica* [34,35] and urea as a nitrogen source as it provides
288 higher biomass yields compared to the ammonium salts [26]. RSM is one of the most preferred
289 methods to optimize operational conditions and medium composition in biotechnology [36,37].

290 This method facilitates obtaining more information with a fewer number of experiments by
291 changing multiple factors at a time because RSM reflects on the complex nonlinear
292 relationships between independent variables and measured responses of the system. In contrast,
293 the OFAT approach allows changing only one of the factors for each of the experiments.

294 Whereas around 15 experiments are required to follow the OFAT approach with the same
295 factors and same levels, the number of experiments decreased by approximately 40 % via the
296 DoE approach. The statistics tables of developed regression models in this study represented

297 that both the C/N ratio and the temperature have a significant effect on the lipid content of cells,
298 and biomass density of *Y. lipolytica*. These results are similar to those reported by Canonico et
299 al [17]. Although they utilized crude glycerol as a cultivation medium, the behavior of biomass
300 and lipid content against changing temperature and C/N ratio is comparable with the results in
301 this study. On the contrary, in this study, the growth of *C. oleaginosus* was significantly affected
302 by only temperature and the combined effect of temperature and C/N ratio. These findings are

303 consistent with the report of Cui et al. even though they tested a narrower temperature range
304 between 27 °C to 33 °C, whereas in our design, it was extended from 15 °C to 35 °C [27].
305 Although the maximum lipid accumulation of *Y. lipolytica* is much less than *C. oleaginosus*, it
306 is corresponding to the amounts reported for the wild-type strain [38,39]. Gao et al. reported
307 lipid accumulation of *Y. lipolytica* CICC 31596 up to 30 % (g/g) when it grew on volatile fatty
308 acids [40]. On the other hand, *Y. lipolytica* ACA-DC 50109 produced 20 % (g/g) lipids on a
309 glycerol-based cultivation medium [34]. These findings show lipid accumulation of *Y.*
310 *lipolytica* is strain-dependent. On the other hand, optimum temperature, 21 °C, for lipid
311 accumulation and growth for *Y. lipolytica* identified in this study was surprisingly lower than
312 previous reports. Our findings provided an optimum C/N ratio and temperature as these
313 predicted values provided higher lipid contents, and biomass for both oleaginous yeasts. These
314 optimum values identified via RSM in this study will potentially contribute to solving other
315 optimization problems such as revealing the effect of other factors, and finding optimum
316 conditions for other strains and engineered strains. In addition to optimization of cultivation
317 conditions, lipid accumulation ability of *Y. lipolytica* and *C. oleaginosus* can be further
318 improved by strain engineering as suggested in other reports [41].

319 In addition to the lipid content and biomass, the C/N ratio and temperature also affected the
320 fatty acids composition of *C. oleaginosus* and *Y. lipolytica*. In previous studies, Moon et al.
321 reported that 15 °C as a growth temperature shifted the fatty acid profile of *C. oleaginosus* to
322 more unsaturated fatty acids [42]. Moreover, Hackenschmidt et al. claimed that there was only
323 a slight variation in the fatty acid profile of *Y. lipolytica* from 25 °C to 35 °C [43]. However,
324 systematic evaluation of the low and high levels of temperature and C/N ratio have not been
325 performed to our knowledge. In this study, PCA allowed us to evaluate the variation in
326 produced fatty acids composition by reducing the noise and creating uncorrelated components
327 from the analyzed data. When the growth temperature of oleaginous yeasts was increased from

328 optimum to 35 °C and the C/N ratio decreased to C/N 30, the saturation level and the chain
329 length of fatty acids were increased. On the other hand, fatty acids produced at 15 °C were
330 slightly more unsaturated (C14:1, C16:1, C18:1, and C20:1 for *Y. lipolytica*, C18:1, C18:2, and
331 C18:3 for *C. oleaginosus*) than they were at the optimum temperature. This variety can be
332 explained by the adaptation of an organism to maintain lipid fluidity at different temperatures
333 [42]. Because the saturation level and the chain length directly influence the melting point of
334 fatty acids. The melting points are much lower for an unsaturated and shorter chain length of
335 fatty acids whereas it is higher for saturated and longer chain fatty acids [44]. While low
336 incubation temperatures increased unsaturation levels on both oleaginous yeasts, it decreased
337 the growth and lipid productivity of *C. oleaginosus*. Unexpectedly, low incubation temperatures
338 positively affected lipid accumulation and biomass production in *Y. lipolytica*. This situation
339 demonstrated that *Y. lipolytica* is promising to produce fatty acids, especially with higher
340 content of unsaturated fatty acids as growth and lipid accumulation were enhanced by lower
341 temperature. Tezaki et al. related functions of some genes in *Y. lipolytica* with the adaptation
342 ability of this organism at low temperatures [45]. Therefore, elucidation of the adaptation
343 mechanism of oleaginous yeasts to low temperatures or too high temperatures could contribute
344 to achieving higher productivity and expanding the application potential of microbial oils.

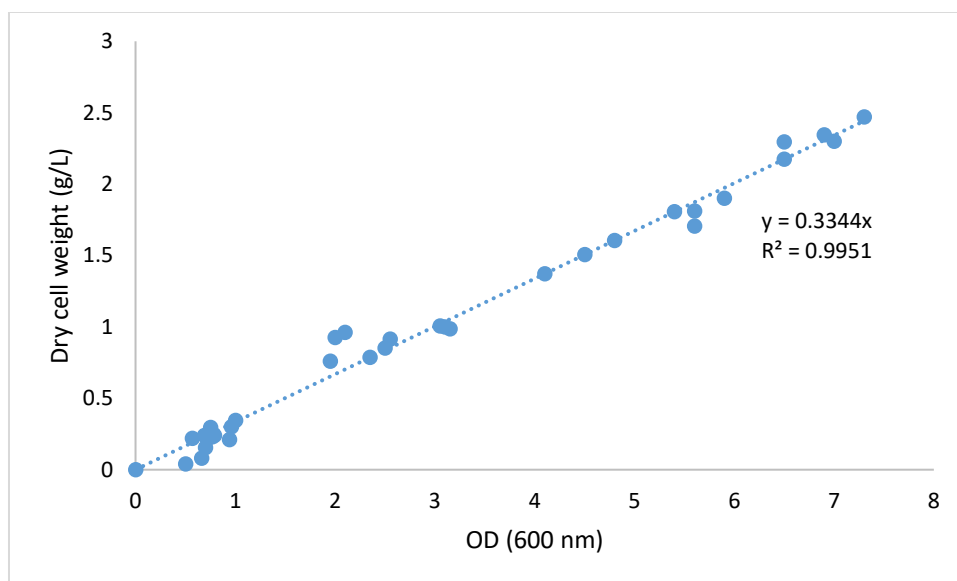
345 **Conclusion**

346 In this study, we sought to determine the major operational factors affecting physiological
347 fitness toward fatty acid production by oleaginous yeasts. We aimed to enhance lipid
348 accumulation as well as to enable *C. oleaginosus* and *Y. lipolytica* to attain higher content of
349 particular fatty acids by changing operating conditions such as the available C/N ratio and
350 temperature. We applied a thorough DoE method (RSM) and developed second-order
351 polynomial equations to identify the optimum C/N ratios and temperatures for both oleaginous
352 yeasts. The predictions of RSM improved the lipid accumulation by approximately 71 % for *C.*

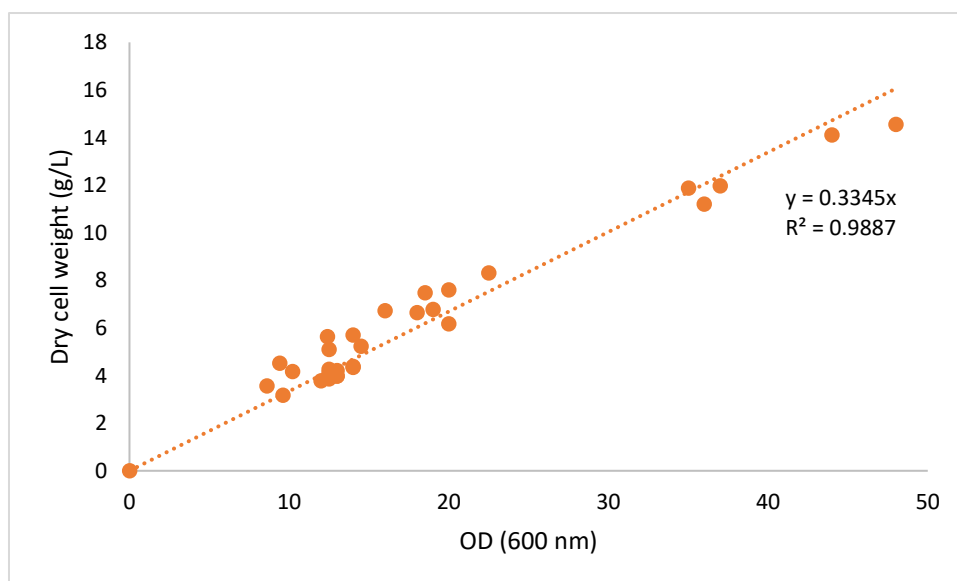
353 *oleaginosus* and about 66 % for *Y. lipolytica* compared to the average lipid accumulation in the
354 tested conditions. While the lipid accumulation was significantly affected by the C/N ratio and
355 temperature, the growth of *C. oleaginosus* was mainly affected by temperature. Additionally,
356 changing the C/N ratio in the cultivation medium and temperature resulted in variations in fatty
357 acid profile, which we observed switches from saturated to unsaturated fatty acids, unsaturated
358 to saturated fatty acids, and shorter chain to longer chain fatty acids. Altogether, these findings
359 helped strengthen the basis to deploy these oleaginous yeasts as platforms for tailored fatty acid
360 production and thereby contribute to the development of processes substituting palm oil that
361 are more sustainable.

362 **Supplementary Material**

363 **a)**



365 **b)**



367 **Figure S1.** OD versus dry cell weight curve for a) *C. oleaginosus* and b) *Y. lipolytica*.

368 ***Author's contributions***

369 All authors conceived and designed the study. ZEDÖ and MSD performed the data analysis.
370 ZEDÖ drafted the manuscript and performed the experiments. VAPMdS, JH, and MSD
371 acquired project funding, conceived and supervised the research. All authors reviewed and
372 edited the study. All authors read and approved the final manuscript.

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375 providing the initial code for RSM. We thank Janine Verbokkem for her valuable contribution
376 to the analysis of fatty acid composition.

377 ***Competing interests***

378 JH has interests in NoPalm Ingredients BV and VAPMdS has interests in LifeGlimmer GmbH.

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