# Diatom *Phaeodactylum tricornutum* for biofuel synthesis

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- Diatoms are photoautotropic unicellular brown algae
- They are major component of marine phytoplankton
- They play major role in biogeochemical cycling of silica
- Comprise approximately 40% of total marine primary production
- Responsible for 20% of global carbon fixation
- Capacity to accumulate large amount of **lipid**, which makes them potential feedstocks for sustainable biofuels and high-value commodities

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- cheap way to produce biomass because only sunlight is used as an energy source
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# Diatoms evolutionary history

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- Oxidative pentose phosphate (OPP) pathway is located in the cytosol
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### Central carbon metabolism of plants



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- **Methods:** Genome-scale metabolic model (GSM) and growth experiments
  - GSM was constructed, curated and validated
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### Genome-scale metabolic model of P. tricornutum

#### • The GSM consists of 594 reactions and 524 metabolites

- There are 4 compartments: Cytosol, Mitochondria, Chloroplast, Peroxisomes
- Model is curated and validated for mass and energy conservation
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	$\int Nv = 0$	defines steady state i biomass constraint			
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subject to	VATPase =	= ATPase cell maintenance cost			
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### Results: Glycollate recycling and lipid production



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# Results: Lipid production supplemented by HCO<sub>3</sub>



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#### • Lipid production increases with increase in light intensity and addition of HCO<sub>3</sub>

- What is the effect of **glycerol** on lipid production? You will examine it yourself during practical session
- Based on these model results, growth conditions were optimised and scaled-up to 2 L photobioreactors to improve the lipid production, growth rate and biomass capacity



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### Summary

Villanova et al. Boosting Biomass Quantity and Quality by Improved Mixotrophic Culture of the Diatom *Phaeodactylum tricornutum*. 2021. Front. Plant Sci. 12:642199

	E10	E10+GLY	EE	EE+GLY	EE+BIC	EE+BIC+GLY
Growth rate, (d <sup>-1</sup> )	0.078 ± 0.004 (n = 5)	0.098 ± 0.004 (n = 6)	0.06 ± 0.01 (n = 6)	0.19±0.02	0.16 ± 0.02 (n = 6)	0.18 ± 0.03 (n = 5)
Final biomass conc, (g/L)	1.32 ± 0.08 (n = 6)	1.46 ± 0.08 (n = 6)	1.6 ± 0.14 (n = 6)	5.03 ± 0.19 (n = 6)	2.58 ± 0.15 (n = 6)	$11.55 \pm 0.24$
max FAMEs, (mg/L/d)	$14.59 \pm 1.12$	$32.45 \pm 2.22$	$9.98 \pm 1.78$	$23.80 \pm 2.86$	$21.61 \pm 3.39$	$51.96 \pm 0.61$
max EPA, (mg/L/d)	$2.12 \pm 0.08$	$2.87 \pm 0.21$	$1.40 \pm 0.14$	$3.98 \pm 0.51$	$3.2 \pm 1.7$	$9.51 \pm 0.13$
max Fucoxanthine, (mg/L/d)	$0.36 \pm 0.05$	0.21 ± 0.11	-	-	$0.71 \pm 0.06$	$1.97 \pm 0.34$
max Carbohydrate, (mg/L/d)	$16.76 \pm 1.35$	$31.03 \pm 2.61$	$4.95\pm0.54$	$25.50\pm2.06$	16.85 ± 13.18	$54.91 \pm 2.40$

Results are expressed as mean  $\pm$  stdev with n = 4 unless otherwise stated.



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