ARTICLE

Molecular mechanisms of temperature acclimation and adaptation in marine diatoms

Yue Liang $^1\cdot$ Julie A. Koeste[r](http://orcid.org/0000-0003-2014-0310) $\circledcirc^2\cdot$ $\circledcirc^2\cdot$ $\circledcirc^2\cdot$ Justin D. Liefer $^3\cdot$ Andrew J. Irwin $^4\cdot$ Zoe V. Finkel 1

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Abstract

Diatoms are important contributors to marine primary production and the ocean carbon cycle, yet the molecular mechanisms that regulate their acclimation and adaptation to temperature are poorly understood. Here we use a transcriptomic approach to investigate the molecular mechanisms associated with temperature acclimation and adaptation in closely related colderand warmer-adapted diatom species. We find evidence that evolutionary changes in baseline gene expression, which we termed transcriptional investment or divestment, is a key mechanism used by diatoms to adapt to different growth temperatures. Invested and divested pathways indicate that the maintenance of protein processing machinery and membrane structure, important short-term physiological mechanisms used to respond to temperature changes, are key elements associated with adaptation to different growth temperatures. Our results also indicate that evolutionary changes in the transcriptional regulation of acetyl-CoA associated pathways, including lipid and branched chain amino acid metabolism, are used by diatoms to balance photosynthetic light capture and metabolism with changes in growth temperature. Transcriptional investment and divestment can provide a framework to identify mechanisms of acclimation and adaption to temperature.

Introduction

Ocean temperatures are projected to increase over the coming century, with dramatic consequences for the marine biosphere [\[1](#page-8-0)]. Ocean warming has profound effects on marine phytoplankton, primary and export production, and the capacity of the ocean to act as a carbon sink $[2-7]$ $[2-7]$ $[2-7]$ $[2-7]$.

These authors contributed equally: Yue Liang, Julie A. Koester

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 \boxtimes Yue Liang YueL@dal.ca yueliang1103@gmail.com

- ¹ Department of Oceanography, Dalhousie University, 1355 Oxford St, Halifax, NS B3H 4R2, Canada
- ² Department of Biology and Marine Biology, University of North Carolina Wilmington, Wilmington, NC 28403, USA
- ³ Department of Biology/Geography and Environment, Mount Allison University, Sackville, NB E4L 1E6, Canada
- ⁴ Department of Mathematics and Statistics, Dalhousie University, Halifax, NS B3H 4R2, Canada

Diatoms are responsible for about 20% of global net primary production and play important roles in carbon flow through marine food webs and in biogeochemical cycling [\[8](#page-8-0)]. Evidence from the field indicates temperature changes may lead to changes in diatom biogeography [\[9](#page-9-0)–[11](#page-9-0)] and affect plankton phenology and coupling between trophic levels [[12\]](#page-9-0). Model projections for the year 2100 suggest widespread restructuring of phytoplankton communities in the subtropics and North Atlantic [\[13](#page-9-0), [14](#page-9-0)], but considerable uncertainty remains due to the evolutionary capacity of microbes [[10,](#page-9-0) [15\]](#page-9-0). Little is known about the molecular consequences of changing temperature in diatoms and the variability of these responses across taxa adapted to different temperature regimes.

Diatoms are found throughout the ocean in habitats spanning the full range of observed temperatures. Each individual species and even strains within species have their own characteristic temperature performance curve [[16\]](#page-9-0), reflecting evolutionary constraints and past adaptations to its environmental regime [\[17](#page-9-0)]. Species with higher optimum growth temperatures generally grow faster under ideal conditions than those with lower optimum growth temperatures [[17,](#page-9-0) [18](#page-9-0)]. Increasing temperature above a species' growth optimum usually leads to a dramatic decrease in growth rate, while an increase in temperature below the

optimum has a much more gradual impact on growth rate [\[16](#page-9-0), [18](#page-9-0)]. Although the genomes of several model diatoms have been sequenced [\[19](#page-9-0)–[21](#page-9-0)], the molecular bases underlying these different thermal optima are largely unknown. Organisms employ a range of molecular and physiological responses to changes in temperature including shifts in fatty acid composition $[22, 23]$ $[22, 23]$ $[22, 23]$ $[22, 23]$, the ratio of RNA to protein [\[24](#page-9-0), [25](#page-9-0)], the use of heat-shock proteins [[26\]](#page-9-0), and changes in photosynthetic pigments and proteins like Rubisco in the case of photoautotrophs [\[27](#page-9-0), [28](#page-9-0)]. Heat tolerance in corals is associated with constitutive changes in the expression of genes that control these physiological responses to temperatures like the use of heat shock, an adaptation commonly termed frontloading [\[29](#page-9-0)]. We do not know the extent to which these mechanisms are employed by diatoms for thermal adaptation. Transcriptomics has been widely used to investigate the responses of nonmodel phytoplankton to environment changes [\[30](#page-9-0)], and with careful experimental design, comparative transcriptomics can identify molecular mechanisms of acclimation and adaptation [\[29](#page-9-0), [31](#page-9-0)].

Chaetoceros is a diverse and abundant marine centric planktonic diatom genus [\[32](#page-9-0), [33](#page-9-0)]. Here we applied transcriptomics to two closely related Chaetoceros sp. with distinct biogeographies and optimal growth temperature (see "Materials and methods") to study the molecular mechanisms associated with temperature acclimation and adaptation in marine diatoms. Specifically, we tested whether these closely related diatoms exhibited similar transcriptional responses to sub- and supra-optimal growth temperatures or have divergent responses consistent with evolutionary change in gene expression associated with the evolution of different temperature optima. Furthermore, we use comparative transcriptomics to identify genes and pathways associated with temperature acclimation and adaptation in Chaetoceros.

Materials and methods

Culture conditions and sampling

Two strains of Chaetoceros sp., CCMP158, and CCMP160 were acquired from the National Center for Marine Algae and Microbiota. CCMP158 was isolated from St. Margarets Bay, Nova Scotia, Canada (44.57 °N 64 °W) and maintained under 14 °C in the culture collection since 1982, while CCMP160 was isolated from the Bay of Marseilles, France (43.3 °N 5.4 °E), and maintained under 24 °C in the culture collection also since 1982. We grew the two species in f/2 + Si medium [\[34](#page-9-0)] under continuous light of 389 ± 27 (SD) µmol photons $m^{-2} s^{-1}$. CCMP158 was maintained under 16 °C, and CCMP160 was maintained under 25 °C

for 1–2 months before the experiment. Cultures were then acclimated in mid-exponential growth phase in triplicate at six additional temperatures ranging from 6 to 30 °C (average $SD = 0.28$ and average $CV = 2\%$ for a minimum of nine generations (9–56 generations for CCMP158 and 16–42 generations for CCMP160, an average of three replicates) to determine the temperature performance curve. Growth rates were determined from chlorophyll a (chl a) fluorescence [\[35](#page-9-0)]. Subsequently, the two species were cultured for cell composition and transcriptomic analyses. These cultures were sampled after 27–49 generations (an average of three replicates) in acclimated growth at three experimental temperatures (see below). The experimental temperatures (Fig. 1) were where the maximum growth rate was achieved (T_{max}) , as well as suboptimal $(T_{\text{sub}}, 12 \text{ °C})$ for CCMP158 and 19 °C for CCMP160) and supraoptimal temperatures (T_{sun} , 22 °C for CCMP158 and 28 °C for CCMP160) where growth rate was ~50% of T_{max} (except T_{sub} of CCMP160, where growth was 86% of T_{max} because CCMP160 was not able to grow at 29 °C under our experiment conditions). The growth rate typically varied between 0.5% and 12% over the course of the experiment, with no evidence of temporal trend in growth rate. We propose that different T_{max} of the two species indicate that they are evolutionarily adapted to different temperature regimes; CCMP158 whose T_{max} is 16 °C is defined as the colder-adapted species, while the CCMP160 whose T_{max} is 25 °C is defined as the warmer-adapted species. Cell counting was performed using Sedgewick–Rafter chamber (Wildco, Buffalo, NY, USA).

Fig. 1 Steady-state growth rate (d^{-1}) of *Chaetoceros* CCMP158 (open circles) and CCMP160 (filled circles) as a function of temperature. The temperature response curve $\mu = e^{-b(t-t_0)^2}$ (line) was fit using brms [\[79\]](#page-10-0) and added to each growth curve, along with the predicted uncertainty interval of the response (shaded regions). CCMP160 did not grow at 29.6 °C and that data point was not included in the regression model

Molecular biochemistry and photophysiology

For biochemical analyses, 50 mL of culture was collected by filtration at low pressure (5 PSI) on 0.8 μm polycarbonate filters, except samples for chl a for which Whatman GF/F filters were used. Protein and RNA were extracted and quantified by colorimetry and fluorometry, respectively, as described in [\[36\]](#page-9-0). Total cellular RNA was quantified using the method Berdalet et al. [\[37\]](#page-9-0) with bead milling used during the extraction. Cellular chl a concentration was determined by methanol extraction and spectrophotometry [\[38](#page-9-0)]. Parameters of photosystem II photochemistry were measured using Fast repetition rate fluorometry (Photon Systems Instruments Fluorometer FL3500, Drasov, Czech Republic). Measurements were taken using a blue single-turnover saturating flash train after 30 s intervals of $red + blue$ actinic light increasing in intensity from 0 to 254 µmol photons $m^{-2} s^{-2}$. Nonphotochemical quenching (NPQ) is calculated as $(F_m-F_m')/F_m'$ [\[39](#page-9-0)] using F_m' value under 254 µmol photons $m^{-2} s^{-2}$. Cell volume was estimated from linear dimensions of images of cells taken at 200× magnification following Hillebrand et al. (1999) using ImageJ [\(http://imagej.nih.gov/ij/\)](http://imagej.nih.gov/ij/).

Transcriptomics

Total RNA was extracted using the RNeasy Plant Mini Kit (Qiagen, Venlo, The Netherlands) following the manufacturer instructions. mRNA was sequenced using Illumina HiSeq 2000 by the Genome Quebec Innovation Centre using the TruSeq mRNA stranded library preparation protocols for 100 bp paired-end reads. The quality of the raw reads was checked using FASTQC version 3. PhiX contamination [\[40](#page-9-0)] was removed before assembly. Raw reads were then mapped to the PhiX genome using Bowtie2 version 2.2.9 (–local –very-sensitive) [[41](#page-9-0)] and the unmapped reads were outputted using samtools version 1.3.1 [\[42](#page-9-0)]. The first 12 nt from the 5' end of the reads [[43\]](#page-9-0) and the 3' adapter fragments were removed using cutadapt version 1.10 [\[44](#page-9-0)]. Sequences between 25 nt and 80 nt were reserved and paired using Trimmomatic version 0.36 [[45\]](#page-9-0). Unpaired reads were included with the left reads of the paired fragments for assembly. Assemblies were conducted for each species. Left reads and right reads from all samples were merged and normalized using Trinity's version 2.2.0 [[46\]](#page-9-0) in silico normalization. Normalized left and right reads were then assembled into contigs using Trinity's paired-end mode using default parameters according to [\[47](#page-9-0)]. Sequences reported by the contamination screen during National Center for Biotechnology Information (NCBI) TSA (transcriptome shotgun assembly) sequence database submission were removed from the transcriptome. Cleaned and trimmed reads of each sample were mapped to the corresponding assembled transcriptomes of each species using Bowtie2 version 2.2.9 (-a –rdg 6,5 –rfg 6,5 –score-min L,−0.6,−0.4 –no-mixed). Transcript abundance estimates were obtained with eXpress version 1.5.1 [\[48](#page-9-0)]. Genes with counts > 0 in at least two of three replicates at any temperature condition were used in differentially expressed gene analysis with DESeq2 [\[49](#page-9-0)] using the script from Trinity. Genes at T_{sub} or T_{sun} for each species were identified as differentially expressed if they had a log-fold change different from zero as compared to their expression level at T_{max} with a false discovery rate adjusted p -value < 0.01.

All genes were grouped into nine possible patterns of differential expression at T_{sub} and T_{sup} relative to T_{max} (Table [1](#page-3-0)). Genes that are downregulated only at T_{sup} in the colder-adapted species and only at T_{sub} in the warmeradapted species were described as potentially invested. Similarly, genes that are upregulated only at T_{sun} in the colder-adapted species and only at T_{sub} in the warmeradapted species were described as potentially divested. The assembled transcriptomes and predicted coding regions from TransDecoder version 3.0.0 ([http://transdecoder.](http://transdecoder.github.io) [github.io](http://transdecoder.github.io)) were annotated with blastx and blastp against the Swiss-prot database release 2016.08 [[50,](#page-9-0) [51\]](#page-9-0) using BLAST+ [\[52](#page-9-0)]. KEGG [[53](#page-9-0)] identification of each annotated gene was obtained from both the UniProt database and the GhostKOALA service [\[54](#page-10-0)]. KEGG pathways and Brite categories were selected for KEGG enrichment analyses from the following categories: metabolism, genetic information processing, environmental information processing, and cellular processes. Pathways with less than ten annotated KEGG orthology identifiers (KO IDs) in either species were removed from calculation. A pathway or Brite category was considered significantly enriched in differentially regulated and invested/divested KO IDs using a hypergeometric distribution test if the probability of obtaining the observed number, m , or more, of differentially regulated KO IDs in that pathway or Brite was low. We used a test of $p < 0.05$ with a false discovery rate correction [\[55](#page-10-0)], where

$$
p = \sum_{k=m}^{n} \frac{\binom{M}{k} \binom{N-M}{n-k}}{\binom{N}{n}},\tag{1}
$$

and N is the total number of KO IDs, n is the number of KO IDs in the selected pathway, and M is the total number of differentially regulated KO IDs.

All the raw read files (see Supplementary dataset 1 for SRA accessions), assembled transcriptomes [TSA accession: GHAM00000000 (CCMP158) and GHAN00000000 (CCMP160)], and gene expression data (GEO accession: GSE125205) are available through NCBI (BioProject: PRJNA495610).

General description	Differential expression pattern		Expression level	Differentially expressed genes		
	T_{sub}	$T_{\rm sup}$		CCMP ₁₅₈	CCMP160	
Temperature			Increases with temperature	0.1% (39)	0.1% (40)	
			Decreases with temperature [*]	0.3% (113)	0.2% (46)	
Growth rate	↓	↓	Positively linked to growth rate	0.6% (247)	0.2% (46)	
		ᠰ	Negatively linked to growth rate [®]	0.1% (35)	0.1% (33)	
Differential expression in only one treatment			Divested in colder-adapted species [®]	2.8% (1190)	1.2% (340)	
		↓	Invested in colder-adapted species [®]	2.8% (1193)	1.1% (297)	
			Invested in warmer-adapted species [®]	0.8% (317)	3.3% (919)	
			Divested in warmer-adapted species [*]	0.9% (397)	2.8% (773)	
No differential expression			No effect of temperature	91.6% (38517)	91.0% (25086)	

Table 1 Description and interpretation of the nine possible patterns of differential expression at sub- and supra-optimal temperatures relative to the optimal temperature for growth

The last two columns list the percentage (and number) of genes for each pattern and each species (colder-adapted CCMP158 and warmer-adapted CCMP160). A star in the Expression level column indicates the fraction of differentially expressed genes differs between species $(\chi^2, p < 0.05,$ Supplementary Table 2)

Results

Influence of growth temperature on physiology, biochemical composition, and cell size

The colder-adapted species CCMP158 ($T_{\text{max}} = 16 \degree C$) had a lower growth rate and lower temperature of maximum growth rate (T_{max}) than the warmer-adapted species CCMP[1](#page-1-0)60 ($T_{\text{max}} = 25 \text{ °C}$ $T_{\text{max}} = 25 \text{ °C}$ $T_{\text{max}} = 25 \text{ °C}$) (Fig. 1 and Table 2). The growth rates under T_{sub} of each species (12 °C for CCMP158 and 19 °C for CCMP160) and T_{sup} of CCMP158 (22 °C) were ~50% of their maximum growth rates, while under T_{sun} for CCMP160 (28 °C), the growth rate was 86% of its maximum (Fig. [1](#page-1-0) and Table [2\)](#page-4-0). The two species differ in their photosynthetic physiology and biochemical composition at their optimal growth temperatures as well as in their acclimated response to sub- and supra-optimal growth temperatures. NPQ was significantly higher in the colderadapted species (0.22–0.3) than the warmer-adapted species (0.1–0.16), but there were no obvious trends with growth temperature within either species (Table [2\)](#page-4-0). The chl a content per cell volume (fg μ m⁻³) increased in CCMP158 with temperature but varied very little with the temperature in CCMP160 (Table [2](#page-4-0)). The chl a content per cell volume was higher in the warmer-adapted species than the colderadapted species under T_{sub} and T_{max} but there was no difference at T_{sup} (Table [2\)](#page-4-0). The changes in RNA and protein content per volume were not statistically significant with temperature in either species except for the significant increase of RNA content per cell volume in CCMP160 from T_{sub} to T_{max} (Table [2](#page-4-0)). The RNA and protein content per volume was higher in CCMP160 than in CCMP158 at corresponding T_{max} and T_{sub} but not T_{sup} (Table [2\)](#page-4-0). RNA:

Protein was significantly lower at T_{max} in CCMP158 than at T_{max} for CCMP160 and decreased in CCMP158 but increased in CCMP160 with growth temperature, but this trend was not statistically significant $(p < 0.05)$. The cell volume of the colder-adapted species was nearly 2.5 times larger than the warmer-adapted species at their respective T_{max} . The cell volume of CCMP158 increased with decreasing temperature, while the cell volume of CCMP160 increased with increasing temperature, but these trends were not statistically significant $(p < 0.05)$.

Gene identification and annotation

The de novo assembly yielded 42,048 and 27,580 genes in CCMP158 and CCMP160, respectively (bioinformatics summary, see Supplementary Table 1 and Supplementary dataset 1). A total of 24.1% of the genes in CCMP158 and 25.8% of the genes in CCMP160 were assigned KEGG annotations. A total of 3569 KO IDs and 4913 OrthoMCL groups are common to both species (Supplementary Fig. 1a, b), and 2032 KO IDs and 3583 OrthoMCL groups are shared with the model diatoms Thalassiosira pseudonana and Phaeodactylum tricornutum (Supplementary Fig. 1a, b). The taxonomy results from GhostKOALA show no significant addition of bacterial, archaeal, and fungal sequences to the two *de novo* assembled transcriptomes (Supplementary Fig 1c).

Differential gene expression in response to temperature

Overall, 7% of assembled genes were differentially expressed under T_{sup} and 3% were differentially expressed under T_{sub}

	CCMP ₁₅₈			CCMP ₁₆₀			
	$T_{\rm sub}$	$T_{\rm max}$	$T_{\rm sup}$	$T_{\rm sub}$	$T_{\rm max}$	$T_{\rm sup}$	
Growth rate (d^{-1}) (± 1 s.d.)	$0.78^{a, b}$ (0.04)	1.17^{a} (0.02)	$0.56^{a, b}$ (0.01)	$1.06^{a, b}$ (0.03)	$1.63^{\rm a}$ (0.05)	$1.41^{a, b}$ (0.09)	
NPQ $(\pm 1 \text{ s.d.})$	0.30^{a} (0.05)	0.30^{a} (0.03)	0.22^{a} (0.06)	0.10^a (0.02)	0.16^a (0.01)	0.11^{a} (0.04)	
Chlorophyll-a (fg μ m ⁻³) (\pm 1 s.d.)	1.4^b (0.1)	1.8^a (0.2)	2.6(0.9)	2.3(0.6)	2.8^a (0.5)	2.9(1.2)	
RNA (fg μ m ⁻³) (±1 s.d.)	$2.7^{\rm a}$ (0.1)	2.8^a (1.0)	3.7(2.2)	$5.8^{a, b}$ (2.0)	9.5^{a} (1.4)	8.2(4.9)	
Protein (fg μ m ⁻³) (\pm 1 s.d.)	49.6° (12.2)	$70.7a$ (23.5)	102.6(38.4)	$112.7a$ (32.7)	$117.9a$ (19.7)	113.1(47.8)	
$RNA:Protein (\pm 1 s.d.)$	0.06(0.01)	$0.04^{\text{a}} (0.01)$	0.04(0.01)	0.05(0.02)	0.08^a (0.02)	0.08(0.06)	
Cell volume (μm^3) (± 1 s.e.)	$1696^{\text{a, b}}$ (44)	$1360^{\rm a}$ (100)	969^b (53)	$452^{\rm a}$ (85)	556° (38)	937 (222)	

Table 2 Mean physiological, biochemical, and morphological response to growth temperature in a colder- (CCMP158) and warmer-adapted (CCMP160) Chaetoceros species

NPQ (non-photochemical quenching) at 254 µmol photons $m^{-2} s^{-2}$

^aSignificantly different across species (*t*-test, $p \le 0.05$)

^bSignificantly different from T_{max} within species (*t*-test, $p \le 0.05$)

(Supplementary Table 1) in CCMP158. In contract, in CCMP160, 3% of assembled genes were differentially expressed under T_{sup} and 7% were differentially expressed under T_{sub} (Supplementary Table 1). The expression of all the assembled genes are grouped into nine different patterns across T_{sub} and T_{sup} in each species (Table [1](#page-3-0)). In the colderadapted CCMP158, the majority (67.4%) of differentially expressed genes were differentially expressed only at the higher temperature (T_{sup}) , while a similar majority (67.8%) of differentially expressed genes were differentially expressed exclusively at the lower temperature (T_{sub}) in the warmeradapted CCMP160 (Table [1](#page-3-0)). We define these differentially expressed genes as potentially invested or divested.

Identification of metabolic pathways associated with acclimation and adaptation to different temperatures

In the colder-adapted species, glycolysis/gluconeogenesis and the citrate cycle were upregulated, while chaperones and folding catalysts, as well as protein processing in the endoplasmic reticulum (ER) were downregulated under T_{sub} relative to T_{max} (Table [3](#page-5-0), KO counts and p-values, see Supplementary dataset 2). Cell cycle, DNA repair, and recombination proteins were upregulated, while amino acid related enzymes, photosynthesis, photosynthesis proteins, porphyrin and chlorophyll metabolism, fatty acid biosynthesis, lipid biosynthesis protein, chaperones and folding catalysts, proteasome, ribosome, RNA transporter, and translation factors were downregulated at T_{sub} relative to T_{max} . By contrast, in the warmer-adapted species, the spliceosome and ribosome biogenesis were upregulated and fatty acid degradation, valine, leucine and isoleucine degradation, chaperones and folding catalysts, proteasome, and peptidases were downregulated under T_{sub} relative to

 T_{max} (Table [3](#page-5-0)). The ubiquitin system and protein processing in the ER were upregulated, while lysine biosynthesis was downregulated under T_{sup} relative to T_{max} . Several of these pathways exhibited patterns of expression that are consistent with temperature-induced evolutionary investment or divestment (Table [3](#page-5-0)). All the pathways that were downregulated under T_{sup} except chaperones and folding catalysts in the colder-adapted species were identified as potentially invested. Biosynthesis of unsaturated fatty acids and proteasome [PATH:ko03050] were also potentially invested in the colder-adapted species. The cell-cycle pathway [PATH: ko04111] was divested in the colder-adapted species (Table [3\)](#page-5-0). Divested genes were mainly regulatory proteins/ protein complexes of the S and mitotic phases of the cell cycle (Supplementary Table 3 and Supplementary Fig 2). All the pathways that were downregulated under T_{sub} in the warmer-adapted species were invested. The spliceosome and ribosome biogenesis were divested in the warmeradapted species.

Discussion

Life has adapted to thrive under much of the range of ambient temperatures found on the Earth, but most species have specialized to live at a narrow subset of Earth's broader temperature range [[6\]](#page-8-0). Species with higher optimal growth temperatures generally have higher intrinsic growth rates under optimal conditions. Exposure to colder suboptimal or warmer supraoptimal growth temperatures induces energetic, metabolic, and redox imbalances that trigger a series of intracellular stresses and compensatory responses. We used a comparative transcriptomic analysis of two closely related Chaetoceros sp. with different optimal growth temperatures (T_{max}) to identify molecular

Biological processes	KEGG pathway and BRITE categories	CCMP158			CCMP160		
		$T_{\rm sub}$	$T_{\rm max}$	$T_{\rm sup}$	$T_{\rm sub}$	$T_{\rm max}$	$T_{\rm sup}$
Amino acid metabolism	Amino acid related enzymes [BR:ko01007] ^a		I	\downarrow			
	Lysine biosynthesis [PATH:ko00300] ^b						↓
	Valine, leucine, and isoleucine degradation $[PATH:k000280]$ ^c				\downarrow	I	
Carbohydrate metabolism	Citrate cycle (TCA cycle) [PATH:ko00020]	↑					
	Glycolysis/Gluconeogenesis [PATH: ko00010]	\uparrow					
Energy metabolism	Photosynthesis [PATH:ko00195]		Ι	\downarrow			
	Photosynthesis proteins [BR:ko00194]		I	T			
	Porphyrin and chlorophyll metabolism [PATH:ko00860]		I	J.			
Lipid metabolism	Biosynthesis of unsaturated fatty acids [PATH:ko01040]		I				
	Fatty acid biosynthesis [PATH:ko00061]		Ι	\downarrow			
	Fatty acid degradation [PATH:ko00071]				\downarrow	I	
	Lipid biosynthesis protein [BR:ko01004] ^d		I	↓			
Folding, sorting, and degradation	Chaperones and folding catalysts [BR: ko03110]	\downarrow		T	\downarrow	I	
	Proteasome [BR:ko03051]		I	\downarrow	↓	I	
	Proteasome [PATH:ko03050]		I		\downarrow	I	
	Protein processing in endoplasmic reticulum [PATH:ko04141]	T					↑
	Ubiquitin system [BR:ko04121]						↑
	Peptidases [BR:ko01002]				\downarrow	I	
Cell growth and death	Cell cycle—yeast [PATH:ko04111]		D	\uparrow			
	DNA repair and recombination proteins [BR:ko03400]			\uparrow			
Transcription and translation	Spliceosome [BR:ko03041]				↑	D	
	Spliceosome [PATH:ko03040]				↑	D	
	Aminoacyl-tRNA biosynthesis [PATH: ko00970]		I	\downarrow			
	Ribosome [BR:ko03011]		I	↓			
	Ribosome [PATH:ko03010]		I	\downarrow			
	Ribosome biogenesis [BR:ko03009]				↑	D	
	Ribosome biogenesis in eukaryotes [PATH: ko03008]				\uparrow	D	
	RNA transport [PATH:ko03013]		I	↓			
	Translation factors [BR:ko03012]		I	J.			

Table 3 Significantly enriched upregulated (upward arrows) and downregulated (downward arrows) pathways relative to the optimal growth temperature in the colder- (CCMP158) and warmer-adapted (CCMP160) Chaetoceros species

Invested (I) and divested (D) pathways are identified as described in the "Materials and methods". The counts of KO IDs in each pathway and the p-value for each pathway are in Supplementary dataset 2

a Includes aminoacyl-tRNA synthetases and aminotransferases (transaminases)

^bLysine biosynthesis from L-aspartate is downregulated

^cThe pathway for the generation of acetyl-CoA is invested

^dIncludes fatty acid synthases, fatty acid elongases, fatty acid desaturases, Acyl-CoA synthetase, and phospholipid acyltransferase

mechanisms associated with both temperature acclimation and adaptation, as well as the molecular basis for the general decreasing maximum growth rates with decreasing temperatures in diatoms.

Transcriptional profiles after acclimation to T_{sub} and T_{sup} are affected by investment and divestment in each species

We verified the quality of our de novo assembly by showing that a majority of the predicted proteins from the two Chaetoceros species were homologous at the protein level and were shared with the model diatoms Thalassiosira pseudonana and Phaeodactylum tricornutum (Supplementary Fig. 1). Most of the genes differentially expressed in the colder-adapted CCMP158 arise at T_{sup} relative to T_{max} , while most of the genes differentially expressed in the warmer-adapted CCMP160 arise at T_{sub} relative to T_{max} (Table [1](#page-3-0) and Supplementary Table 1). We hypothesize that these differences in transcriptional responses across species reflect evolutionary changes in gene expression after longterm exposure to different temperature regimes. There are nine possible patterns that can describe the differential expression of a gene across T_{sub} and T_{sup} within each species (including no differential expression), each with a different biological interpretation (Table [1](#page-3-0)). Two of these patterns are increases or decreases in gene expression levels as a function of temperature regardless of the overall metabolic rates of the whole organism, indicating that temperature is the dominant factor altering expression. Differential expression to compensate for changes in enzyme activity is a potential cause of this pattern. Two more patterns of differential expression can be recognized as being positively or negatively related to decreasing growth rates at T_{sub} and T_{sup} . These growth rate driven patterns could reflect downregulation of cell-cycle related genes or an upregulation of general stress response genes at T_{sub} and T_{sup} . The four remaining patterns are differential expressions at only one temperature relative to the optimum. These patterns could arise from an elevated or depressed expression of genes at the optimum temperature that is beneficial at a colder or warmer temperature. These four expression patterns in which a species seems constitutively poised for one direction of temperature change may reflect an adaptive response in overall gene expression we refer to here as investment or divestment, similar to the concept of frontloading [[29,](#page-9-0) [56](#page-10-0)]. For example, a species adapted to colder temperatures may have elevated expression of genes related to protein synthesis (a potentially beneficial response to lower biosynthesis rates at colder temperatures) at its optimum temperature relative to its ancestor. This elevated expression may result in no further increase in expression at even colder temperatures and a decrease in expression at relatively warmer temperatures. A chi-squared test suggests that the patterns of differential expression are independent between the T_{sub} and T_{sub} treatments within each species. If temperature adaptation changes gene expression, the patterns of differential expression would be different across the two species that are adapted to different temperatures. A proportionality test suggests that six out of eight differential expression patterns are significantly different across the two species (Supplementary Table 2), but the strongest differences by a large margin are in the investment and divestment categories (Table [1\)](#page-3-0). These counts differ between species indicating these patterns are strongly related to temperature adaptation. Therefore, we propose that diatoms may adapt to different temperature regimes partially through constitutive changes in the gene expression under their T_{max} , reducing the need for additional transcriptomic responses to further increases or decreases in temperature. This hypothesis is consistent with the observed high levels of differential expression under supraoptimal but not under suboptimal temperatures in the colder-adapted species and in contrast the high levels of differential expression under sub-optimal but not supra-optimal growth temperature in the warm-adapted species.

Invested and divested pathways include known physiological mechanisms associated with temperature adaptation

Protein translation, especially the initiation of translation by ribosomes, is slowed down by cooler temperatures [\[57](#page-10-0), [58\]](#page-10-0). The diatoms Fragilariopsis cylindrus and Thalassiosira pseudonana have both shown short-term compensatory increases in ribosomal density and genes involved in ribosome production under low temperature [\[25](#page-9-0)]. Here we find that growth temperature influences the expression of genes associated with translation and protein synthesis very differently across the two species. The investment of aminoacyl-tRNA biosynthesis, ribosome proteins, RNA transporters, and translation factors (Table [3](#page-5-0)) in the colderadapted species possibly reflects a high baseline expression of these pathways to better compensate for lower translation efficiency at cooler T_{max} . Amino acid related enzymes (enzymes for tRNA synthesis) were also invested (Table [3\)](#page-5-0), consistent with the investment of aminoacyl-tRNA biosynthesis. In contrast, there is an apparent divestment of ribosome biogenesis and the spliceosome in the warmeradapted species (Table [3](#page-5-0)). Divestment of ribosome biogenesis in the warmer-adapted species not only reduces material and energy expenditure, but may also moderate polypeptide processing demand and thereby reduce proapoptotic ER stress, which is defined as the disruption of ER

function and increased load of unfolded proteins in the ER lumen [[59\]](#page-10-0). Investment of chaperones and folding catalysts also helps to reduce ER stress (Table [3\)](#page-5-0). The investment of peptidases and proteasomes can facilitate the removal of misfolded proteins in the ER and support overall faster protein turnover under warmer temperatures [[60\]](#page-10-0) (Table [3](#page-5-0)). These changes in baseline expression related to protein metabolism indicate that future proteomics studies would greatly complement our transcriptomic findings and help reveal their ultimate physiological function.

Cooler temperatures have been hypothesized to increase the ratio of P-rich rRNA relative to nitrogen-rich proteins in phytoplankton, leading to large-scale biogeographic patterns in particulate N:P in the sea surface [[25\]](#page-9-0). However, the colder-adapted species in our study has a lower RNA to protein ratio than the warmer-adapted species (Table [2](#page-4-0)). This is due to the higher RNA content per unit volume in the warmer-adapted species that is consistent with its faster growth rate [\[61](#page-10-0)]. Our results indicate that RNA:Protein in phytoplankton may not be a simple function of sea-surface temperature, in part due to the resource allocation strategies associated with adaptation to cold temperatures.

Colder temperatures slow down protein turnover rates and reduce membrane fluidity, which is reflected by the compensatory investment in photosynthesis proteins and biosynthesis of unsaturated fatty acids in the cold adapted species (Table [3](#page-5-0)). The diatom T. *pseudonana* appears to compensate for the high protein turnover requirements associated with the photosynthetic protein complex PSII by maintaining a large pool of inactive PSII repair cycle intermediates except PsbA, the core protein of this complex [\[62](#page-10-0)]. Cold-adapted phytoplankton appear to use a comparable strategy to cope with slower protein turnover by maintaining higher photosynthetic protein quotas and more stable photosynthetic pigment content compared to closely related, warm-adapted species [\[63](#page-10-0)–[65](#page-10-0)]. Similarly, we find the investment of the PSII proteins PsbD, PsbC, and PsbB but not PsbA (Supplementary Table 4 and Supplementary Fig. 3), investment of proteosomal and chl a biosynthesis pathways (Table 3), and a more stable cellular chl a quota (Table [2](#page-4-0)) in the colder-adapted CCMP158. These features suggest a compensatory enhanced pool of PSII repair cycle intermediates in CCMP158 when PSII turnover is slowed at its lower T_{max} [[66\]](#page-10-0). Such cold adaptations are also accompanied by constitutively higher NPQ [[63,](#page-10-0) [64\]](#page-10-0) that may be needed to dissipate the greater excess light energy associated with photosynthesis at colder temperatures [\[67](#page-10-0)], which may explain the constitutively higher NPQ we observed in CCMP 158.

An investment of biosynthesis of unsaturated fatty acids in the colder-adapted species may facilitate the maintenance of membrane fluidity under cooler temperatures by modifying the saturation state of the fatty acids in the lipid bilayers [\[23,](#page-9-0) [68\]](#page-10-0).

Regulation of acetyl-CoA metabolism is essential for diatom temperature adaptation

Light absorption, excitation energy transfer, and primary photochemistry are essentially independent of temperature [\[69](#page-10-0)], therefore in photosynthetic organisms, a change in temperature alters metabolic balance [[3,](#page-8-0) [7\]](#page-8-0) and will vary the ratio of central metabolites such as $NADPH: NADP⁺$ and actyl-CoA:CoA (CoA: coenzyme A). We find evidence of investment in fatty acid metabolism in both species and branched chain amino acid (BCAA, valine, leucine, and isoleucine) metabolism in CCMP160 (Table [3\)](#page-5-0) that indicates that actyl-CoA metabolism plays a key role in temperature adaptation in diatoms. Lipids are an electron sink and can reduce the redox stress caused by imbalanced $NADPH: NADP⁺$ [\[70](#page-10-0)]. An undersupply of acetyl-CoA, which is the central metabolite for fatty acids and BCAA metabolism, will reduce rates of cell division [\[71](#page-10-0)–[73](#page-10-0)], while excessively high level of cytosolic acetyl-CoA can result in the overacetylation of cytosolic proteins and consequent inhibition of enzyme activity [\[74](#page-10-0)]. We hypothesize that invested pathways associated with fatty acid and BCAA metabolism play a key role in temperature adaptation in diatoms. Under cooler conditions, higher rates of fatty acid biosynthesis help consume excess cytosolic acetyl-CoA resulting from the decreased nuclear acetyl-CoA requirements when growth rates are slow [\[74](#page-10-0)] and excess NADPH when temperature-independent, light-limited photosynthetic rate exceeds the rate of NADPH consumption by the temperature-dependent dark reactions. In contrast, under warmer conditions, photosynthetic carbon fixation may not meet cellular biosynthetic demands of acetyl-CoA because metabolic rate can exceed the temperature-independent photosynthetic rate. On the other hand, intensive histone acetylation resulting in excessive nuclear CoA may result in programmed cell death at high concentration [[72\]](#page-10-0). The degradation of fatty acids and BCAA can supplement acetyl-CoA production and may support higher growth rates in the warmer-adapted species.

Molecular basis for lower maximum growth rates under lower temperature

Generally, species adapted to higher temperatures have higher growth rates. The molecular mechanism(s) that links growth rate and temperature optima are largely unknown. In the colder-adapted species we find a divestment of genes associated with the cell-cycle pathway [PATH:ko04141] (Supplementary Table 3 and Supplementary Fig. 2). Most of the divested genes are associated with S and mitotic phases of the cell cycle (Supplementary Table 3 and Supplementary Fig. 2). DNA replication licensing factor MCM3 (K02541) (MCM) is part of the minichromosome

maintenance complex (MCM complex) that is required for the initiation and regulation DNA replication during the S phase [\[75](#page-10-0)]. The cohesion complex, condesin complex, anaphase-promoting complex subunit 8 (APC8), which is part of the anaphase promoting complex/cyclosome (APC/ C complex), and S-phase kinase-associated protein 1, which is the essential component of the SCF (SKP1-CUL1-F-box protein) ubiquitin ligase complex, are associated with the separation of sister chromatids [[76\]](#page-10-0). The relatively low baseline expression of these cell-cycle genes and encoded proteins may lengthen the G2 phase before mitosis and contribute to larger cell volumes in CCMP158 (Table [2](#page-4-0)), as previously reported in yeast [[77\]](#page-10-0). The divested genes associated with DNA synthesis and mitosis indicates a molecular basis of the lower maximum growth rate of the colder-adapted species under its optimal growth temperature (Fig. [1](#page-1-0) and Table [2](#page-4-0)). However, more work is required to determine if this is a general mechanism.

We verified our results for differential expression between the two species under their respective T_{max} using a pseudotranscriptome generated from all the diatom transcriptomes deposited in the Marine Microbial Eukaryote Transcriptome Sequencing Project (MMETSP) [[78](#page-10-0)] (Supplementary Methods). The pathway analysis reveals that the expression level of protein biosynthesis and photosynthesis related genes are higher in CCMP158 than CCMP160 (Supplementary Table 5), which is consistent with an investment in protein biosynthesis and photosynthesis in CCMP158 and a divestment in ribosome and ribosome biogenesis in CCMP160. Meanwhile, the higher expression level of cell-cycle related pathways in CCMP160 is consistent with the divestment of cell-cycle related pathway in CCMP158 (Supplementary Table 5). Although investment in the proteasome was seen in both species, the expression levels of proteasome related genes are higher in CCMP158 than CCMP160. The enrichment of fatty acid biosynthesis in the genes with higher expression in CCMP158, and the enrichment of fatty acid and BCAA degradation in the genes with higher expression in CCMP160 are not significant, however, the distribution of observed counts of KO IDs in these pathways are consistent with the investment of fatty acid biosynthesis in CCMP158 and investment of fatty acid and BCAA degradation in CCMP160 (Supplementary Table 5). These results further support our hypothesis that temperature adaptation changes the baseline expression level of key genes and pathways to maintain metabolic homeostasis.

In conclusion, our results indicate that diatoms have evolved different optimal growth temperatures via changes in baseline expression (investment and divestment) of several key pathways including amino acid, carbohydrate, energy, and lipid metabolism, protein folding sorting and degradation, cell growth and death, and transcription and translation (Table [3\)](#page-5-0). As a result of evolutionary change in gene expression, the colder- and warmer-adapted species have largely different transcriptional responses to growth under sub- and supra-optimal temperatures relative to their individual optimal temperatures for growth. In aggregate, these results indicate that short-term acclimation to temperature will be species specific and shaped by evolutionary history. Future studies with lab-evolved strains could be used to improve our understanding of the evolution and fitness costs associated with transcriptional investment/ divestment.

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Compliance with ethical standards

Conflict of interest The authors declare that they have no conflict of interest.

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