

Copper and cerium-regulated gene expression in *Methylophilus* *trichosporium* OB3b

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Abstract In aerobic methanotrophs, copper and cerium control the expression and activity of different forms of methane monooxygenase and methanol dehydrogenase, respectively. To exploit methanotrophy for the valorization of methane, it is crucial to determine if these metals exert more global control on gene expression in methanotrophs. Using RNA-Seq analysis we compared the transcriptome of *Methylophilus trichosporium* OB3b grown in the presence of varying amounts of copper and cerium. When copper was added in the absence of cerium, expression of genes encoding for both soluble and particulate methane monooxygenases varied as expected. Genes encoding for copper uptake, storage, and efflux also increased, indicating that methanotrophs must carefully control copper homeostasis. When cerium was added in the absence of copper, expression of genes encoding for alternative methanol dehydrogenases varied as expected, but few other genes were found to have differential expression. When cerium concentrations were varied in the presence of copper, few genes were found to be either up- or downregulated, indicating that copper over rules any regulation by cerium. When copper was increased in the presence of cerium, however, many genes were upregulated, most notably multiple steps of the central methane oxidation pathway, the serine cycle, and the ethylmalonyl-CoA pathway. Many genes were also downregulated, including those encoding for nitrogenase and hydrogenase. Collectively, these data suggest that copper

plays a larger role in regulating gene expression in methanotrophs, but that significant changes occur when both copper and cerium are present.

Keywords Methanotrophs · Copper · Cerium · RNA-Seq · RT-qPCR

Introduction

Aerobic methane-oxidizing bacteria—methanotrophs—thrive wherever methane-air interfaces develop, including in freshwater and marine sediments, bogs, forest, and agricultural soils as well as aquifers (Hanson and Hanson 1996; Op den Camp et al. 2009; Semrau et al. 2010). These microbes play a critical role in the global carbon cycle through the conversion of methane to biomass and carbon dioxide and have received a great deal of attention for their potential in producing a wide range of valuable products from the inexpensive and widely available carbon source methane (Kalyuzhnaya et al. 2015; Khmelenina et al. 2015; Semrau et al. 2010; Strong et al. 2015).

The activity of methanotrophs, however, is strongly affected by a number of environmental parameters, especially the bio-availability of copper. Some methanotrophs have a well-known “copper-switch” where the type and activity of methane monooxygenase responsible for the initial oxidation of methane to methanol responds significantly to the availability of copper (Nielsen et al. 1996, 1997; Stanley et al. 1983). That is, when grown at low copper conditions, a cytoplasmic or soluble methane monooxygenase (sMMO) is expressed. As the copper concentration in the medium increases, expression of sMMO decreases and expression and activity of a membrane-bound or particulate methane monooxygenase (pMMO) increases (Choi et al. 2003; Semrau et al. 2013). This response to copper is important for the application of methanotrophs as the sMMO

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and pMMO have very different substrate ranges and kinetics. The sMMO has a very broad substrate range and so has more potential in biocatalysis applications, but also has a poor affinity for methane, limiting its use for scavenging methane at low concentrations (Kalyuzhnaya et al. 2015; Lee et al. 2006; Semrau et al. 2010; Trotsenko and Murrell 2008). pMMO, conversely, has relatively low turnover but greater affinity for methane (Lee et al. 2006) and so is likely to be more useful for control of methane emissions (Yoon et al. 2009).

More recently, rare earth elements (REEs) such as cerium have been shown to have a major effect on methanotrophs (Keltjens et al. 2014; Pol et al. 2014). That is, REEs strongly regulate the activity and expression of alternative methanol dehydrogenases (MeDH) that oxidize methanol, signifying that a “REE-switch” also exists (Chu and Lidstrom 2016; Farhan UI Haque et al. 2015a; Gu et al. 2016; Hibi et al. 2011; Nakagawa et al. 2012). Two different forms of MeDH have been found in most but not all methanotrophs (Pol et al. 2014; Vekeman et al. 2016). One form is a heterotetrameric protein ($\alpha_2\beta_2$) with two 66-kDa (α) subunits (MxaF) and two 8.5 kDa (β) subunits (MxaI). In this canonical MeDH (Mxa-MeDH), calcium is in the active site and is coordinated with pyrroloquinoline quinone, or PQQ (Anthony and Williams 2003; Goodwin and Anthony 1998; Williams et al. 2005). A homolog to the large subunit, XoxF, is also present that encodes for another PQQ-dependent methanol dehydrogenase (Xox-MeDH) (Skovran et al. 2011; Wu et al. 2015). Xox-MeDH is a homodimer of XoxF (Schmidt et al. 2010; Pol et al. 2014) sometimes associated with MxaI (Wu et al. 2015). Xox-MeDH has a rare earth element in its active site (Pol et al. 2014), and it has been shown that expression of Mxa-MeDH vs. Xox-MeDH depends on the availability of REEs. In the absence of REEs, little expression of Xox-MeDH is observed, but such expression increases significantly when REEs are added (e.g., Chu and Lidstrom 2016; Farhan HI Haque et al. 2015a; Gu et al. 2016; Vu et al. 2016; Wehrmann, et al. 2017).

What is not clear, however, is if copper and/or cerium exert more global control over gene expression in methanotrophs. These metals clearly control expression of enzymes mediating the oxidation of methane and methanol—two key steps in the central pathway of methane oxidation—but do they regulate expression of genes in other metabolic pathways? Here, we describe the effect of different concentrations of copper and/or cerium on the transcriptome of *Methylosinus trichosporium* OB3b using RNA sequencing (RNA-Seq) and RT-qPCR.

Materials and methods

Culture conditions

M. trichosporium OB3b (NCIMB 11131; VKM B-2117; Whittenbury et al. 1970) was grown on nitrate mineral salts

(NMS) medium (Whittenbury et al. 1970) at 30 °C in 250-ml side-arm Erlenmeyer flasks sealed with rubber stoppers. The flasks were shaken at 200 rpm in dark. CH₄ was added at a methane-to-air ratio of 1:2. To investigate the effect of copper and cerium on the transcriptome of *M. trichosporium* OB3b, this strain was grown under four different conditions using side-arm flasks to noninvasively monitor growth: 0 μM copper + 0 μM cerium, 0 μM copper + 25 μM cerium, 10 μM copper + 0 μM cerium, and 10 μM copper + 25 μM cerium. These concentrations were chosen as similar values have been often used earlier to examine the effect of copper and rare earth elements on gene expression in methylotrophs (e.g., Chu and Lidstrom 2016; Farhan UI Haque et al. 2015a; Gu et al. 2016; Vu et al. 2016). All conditions had triplicate biological replicates. Copper and cerium were added as CuCl₂ and CeCl₃, respectively. Growth of these cultures was monitored via OD₆₀₀ using a Genesys 20 Visible spectrophotometer (Spectronic Unicam, Waltham, MA, USA) at 4–12 h intervals. The growth rates of *M. trichosporium* OB3b when grown under these four conditions were not significantly different, as documented earlier (Farhan UI Haque et al. 2015a) and observed again in this study (data not shown). It should be noted that a substantial fraction (70–90%) of added cerium formed insoluble precipitate(s) in standard NMS growth medium that could be removed via centrifugation at 5000×g for 10 min (data not shown). Variable amounts of copper and iron (10–15%) also co-precipitated with the insoluble cerium compound(s) (data not shown). It is unknown if any fraction of these precipitated metals is bioavailable (e.g., through the production of siderophores or chalkophores).

Total RNA isolation and purification

After cultures entered the mid-exponential phase (OD₆₀₀ of ~ 0.3), total RNAs were isolated using the method described before (Gu et al. 2016; Semrau et al. 2013). Briefly, 20 ml from each flask was first mixed with 2.5 ml stop solution [5% buffer equilibrated phenol (pH 7.3) in ethanol] to stop synthesis of new mRNA and then centrifuged at 4000g for 10 min at 4 °C. The cell pellets were then resuspended in 0.75 ml of extraction buffer [100 mM Tris-HCl (pH 8.0), 1.5 M NaCl, 1% (w/v) hexadecyltrimethylammonium bromide (CTAB)] and subjected to lysis by bead beating using 0.5 g 0.1-mm zirconia-silica beads at 4800 rpm for 1 min (Biospec Products, Bartlesville, OK, USA) in the presence of 35 μl 20% SDS, 35 μl 20% laurylsarcosine, and 750 μl phenol-chloroform-isoamyl alcohol (25:24:1). The samples were then centrifuged at 18,000 g for 5 min at 4 °C and the upper aqueous phase was transferred to a new tube and mixed with an equal volume of chloroform-isoamyl alcohol (24:1). The mixture was centrifuged again and the upper aqueous phase containing RNA was precipitated in MgCl₂, sodium acetate, and isopropanol overnight at – 80 °C.

RNA was recovered the next day by centrifugation at 18,000g for 30 min at 4 °C and washed by 75% ethanol. DNA was removed by RNase-free DNase (Qiagen, Hilden, Germany) through at least two treatments, followed by purification using a Zymo RNA Clean & Concentrator kit (Zymo Research, Irvine, CA, USA) following the manufacturer's instructions. Removal of all traces of DNA was confirmed by the absence of a 16S rRNA PCR product in reactions using 2 µl of RNA template and 32 PCR cycles. RNA concentrations were estimated by using an ND-1000 spectrophotometer (NanoDrop Technologies Inc., Wilmington, DE, USA).

RNA sequencing

Following the purification of total RNA, ribosomal RNA was removed using the RiboZero kit for Gram-negative bacteria (Illumina, San Diego, CA, USA). The qualities of the samples were checked by Agilent bioanalyzer (Santa Clara, CA, USA). mRNA-Seq libraries were then prepared by University of Michigan DNA Sequencing Core (<http://seqcore.brcf.med.umich.edu>) and sequenced in one lane using Illumina (San Diego, CA, USA) HiSeq4000 SE 50.

Differential expression analysis

The raw reads obtained from the sequencing core were trimmed using Sickel 1.33 (Joshi and Fass 2011) with default parameters for single-end reads and then aligned to the *M. trichosporium* OB3b genome (WGS ADVE02) downloaded from Genoscope (<https://www.genoscope.cns.fr/agc/microscope/home/index.php>) using the Burrows-Wheeler alignment tool (BWA) backpack 0.7.12 (Li and Durbin 2009) with default parameters. The quality of sequences was checked at each step by FastQC v0.11.5 (Andrews 2010). The resulting sequence alignment/map (SAM) files were then sorted using SAMtools-1.3.1 (Li et al. 2009). Reads were assigned to features and counted using HTSeq 0.6.1p1 with “intersection-nonempty” and “-a = 0” mode (Anders et al. 2015) based on annotation downloaded from Genoscope. Differential expression was analyzed by DESeq2 v1.12.4 (Anders and Huber 2010) in R v3.3.0. Sequences were also analyzed by bowtie2 (v2.2.9) (Langmead and Salzberg 2012) for alignment and voom/limma (v3.28.21) (Law et al. 2014) with default parameters for differential expression. Results obtained from both pipelines were comparable and the results obtained by DESeq2 method presented here. Genes were considered to be differentially expressed if a Benjamini-Hochberg-adjusted *p* value < 1×10^{-3} and $|\log_2|\text{fold change}| > 1.5$.

Reverse transcription-quantitative polymerase chain reaction

Differential expression of selected genes was verified by RT-qPCR using the comparative C_T method (Schmittgen and Livak 2008). These were *pmoA* (encoding for the 27 kDa polypeptide of pMMO), *mmoX* (encoding for the α -subunit of sMMO hydroxylase), *xoxF12* (encoding for the 65-kDa polypeptides of Xox12-MeDH), *mxoF* (encoding for the 66-kDa polypeptide of Mxa-MeDH), *nifH* (encoding for the dinitrogenase reductase subunit), *pvdF* (responsible for synthesis of formyl hydroxamate groups in pyoverdine), and *mbnA* (encoding for the polypeptide precursor of methanobactin). Three genes were used as internal references—*rrs* (16S rRNA), *clpX* (a subunit of a ClpX-ClpP ATP-dependent serine protease), and *yjg* (a permease of the YjgP/YjgQ family). These were chosen as *rrs* was found to be appropriate in previous studies Farhan Ul Haque et al. 2015a, b; Gu et al. 2016; Kalidass et al. 2015), and expression of *clpX* and *yjg* were observed to be invariant under the growth conditions described examined here, i.e., \log_2 expression changes < 0.05 as determined via RNA-Seq. Primer sets used for these reactions are shown in Supplementary Table S1. Calibration curves for qPCR of these genes are shown in Supplementary Fig. S1.

Sequence accession number

The transcriptomes of *M. trichosporium* OB3b grown with varying copper and cerium concentrations are available at the NCBI Gene Expression Omnibus database under accession number GSE90817.

Results

General analyses of transcriptomic samples

The quality of the collected RNA was very good (RIN ≥ 8.7 for each sample) with $23.1\text{--}42.8 \times 10^6$ reads per sample (Supplementary Table S2). Of these, $7.3\text{--}15.2 \times 10^6$ reads per sample were assigned to regions encoding for proteins. To determine the reproducibility of biological replicates, principal component analysis of the normalized logarithmic transformed read counts of each transcriptome was performed using DESeq2 (Anders and Huber 2010). High similarity was observed between triplicate biological replicates for three of the growth conditions—0 µM copper + 0 µM cerium, 0 µM copper + 25 µM cerium, and 10 µM copper + 25 µM cerium. Transcriptomes of replicates of the fourth growth condition—10 µM copper + 0 µM cerium—showed less uniformity (Fig. 1). Despite the variability in the transcriptome of *M. trichosporium* OB3b when grown with 10 µM copper +

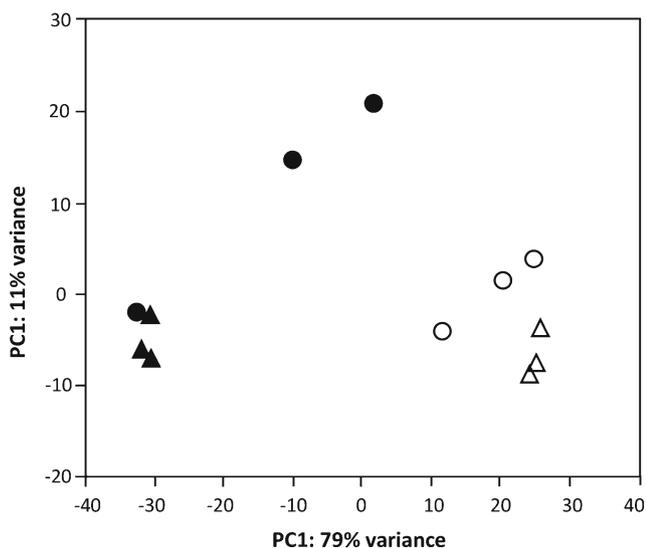


Fig. 1 Principal component analysis of collected transcriptomic sequence data. unfilled circle = 0 μM copper + 0 μM cerium, filled circle = 10 μM copper + 0 μM cerium, unfilled triangle = 0 μM copper + 25 μM cerium, filled triangle = 10 μM copper + 25 μM cerium

0 μM cerium, we could not reasonably conclude that any replicate in this condition was an outlier as (1) the coverage and sequence of these replicates were comparable and (2) the Spearman's rank correlation coefficient between these three replicates was found to be > 0.93 . As such, all replicates for all conditions were included in subsequent analyses of differential gene expression.

Differentially expressed genes in the presence or absence of copper

When comparing the transcriptome of *M. trichosporium* OB3b grown with 10 μM copper + 0 μM cerium vs. 0 μM copper + 0 μM cerium, over 100 genes were found to have significant differential expression in the presence vs. absence of copper, i.e., $|\log_2|$ change ≥ 1.5 and Benjamini-Hochberg-adjusted p value $\leq 1 \times 10^{-3}$. Those genes with annotated functions are listed in Table 1, e.g., genes involved in methane oxidation, cell synthesis, metal homeostasis, and transcriptional regulation. Other genes, mostly encoding for unknown function, were also differentially regulated with respect to copper but are not shown in Table 1. Complete differential expression analyses are available in the supplementary information as Supplementary Excel File S1.

Thirty-seven genes were found to be significantly upregulated when copper was added. As expected from previous RT-qPCR assays of *pmoA* (Farhan UI Haque et al. 2015a; Kalidass et al. 2015; Semrau et al. 2013), these included genes of the *pmo* operons. Further, a gene (locus tag ADVE02_v2_12455), encoding for a recently discovered copper storage protein, Csp1, (Vita et al. 2016) was also significantly upregulated in the presence of copper but its

homolog, Csp2 (locus tag ADVE02_v2_10455), did not vary with respect to copper. *cusAB*, encoding for a copper efflux system (Munson et al. 2000), was found to have increased expression in the presence vs. absence of copper. Very few other groups of genes were found to be upregulated, with the exception of genes encoding for 30S and 50S ribosomal proteins, one gene encoding for a porin, one gene encoding for a molybdate transporter (*modA*), and many genes of unknown function (Table 1; Supplementary Excel File S1).

Approximately twice as many genes (86 in total) were downregulated in the presence of copper (i.e., \log_2 change ≤ -1.5 and Benjamini-Hochberg-adjusted p value $\leq 1 \times 10^{-3}$). Most notably, *mmo* genes encoding for polypeptides of the sMMO as well as *mbn* genes involved in methanobactin synthesis were downregulated. Methanobactin is a copper chelating molecule produced by some methanotrophs in copper limiting conditions for copper sequestration (DiSpirito et al. 1998, 2016; Semrau et al. 2013). In addition, many genes encoding for TonB-dependent transporters had reduced expression in the presence of copper, as did numerous putative σ factors and proteins of unknown function (Table 1; Supplementary Excel File S1).

Differentially expressed genes in the presence or absence of cerium

Gene expression was also affected by the availability of cerium, but fewer genes showed differential expression in response to the addition of this rare earth element as compared to changes observed when copper was varied, i.e., 20 genes were upregulated and 15 downregulated in the presence vs. absence of cerium (Table 2). All genes with annotated functions are listed in Table 2 (complete differential expression analyses are available in Supplementary Excel File S1).

As expected from previous RT-qPCR assays (Farhan UI Haque et al. 2015a; Gu et al. 2016), when comparing the transcriptome of *M. trichosporium* OB3b grown with 0 μM copper + 0 μM cerium vs. 0 μM copper + 25 μM cerium, genes encoding for the rare earth element-containing methanol dehydrogenase (Xox1- and Xox2-MeDH) increased in the presence of cerium. Interestingly, so did genes predicted to be involved in the synthesis and uptake of pyoverdine—a siderophore initially identified in *Pseudomonas* species for iron uptake (Wandersman and Delepelaire 2004). The only other genes significantly upregulated by cerium were one gene encoding for a σ^{70} factor (located in the pyoverdine gene cluster), two genes encoding for ABC transporters (one located in the pyoverdine gene cluster and the other located near the *xox2* gene cluster), and a gene encoding for protein of unknown function immediately upstream of *xoxF1* (Table 2; Supplementary Excel File S1).

Genes encoding for the calcium-containing methanol dehydrogenase (Mxa-MeDH) were downregulated in the

Table 1 Selected genes with annotated function that were differentially expressed in *M. trichosporium* OB3b when grown with 10 μ M copper + 0 μ M cerium vs. 0 μ M copper + 0 μ M cerium (Benjamini-Hochberg-adjusted p value $< 1 \times 10^{-3}$, $|\log_2| > 1.5$). Note that complete differential expression analyses are available in the supplementary information as Supplementary Excel File S1

Function	Gene/locus number	p value	Log ₂ fold change	
Upregulated in 10 μ M copper + 0 μ M cerium compared with 0 μ M copper + 0 μ M cerium				
Particulate methane monooxygenase	<i>pmoA1</i> (ADVE02_v2_10400)	2.87E-08	2.27	
	<i>pmoA2</i> (ADVE02_v2_12979)	6.26E-10	2.49	
	<i>pmoB1</i> (ADVE02_v2_10399)	3.01E-10	2.52	
	<i>pmoB2</i> (ADVE02_v2_12980)	3.19E-08	2.26	
Copper storage protein	<i>csp1</i> (ADVE02_v2_12455)	9.27E-17	2.38	
Transporters	ABC-type (ADVE02_v2_12321)	1.98E-12	1.57	
	<i>modA</i> (ADVE02_v2_12892)	2.14E-05	1.79	
	<i>cusA</i> (ADVE02_v2_12040)	2.03E-36	4.46	
	<i>cusB</i> (ADVE02_v2_12041)	9.91E-112	5.95	
	Porin (ADVE02_v2_14468)	5.34E-04	2.19	
	<i>rplB</i> (ADVE02_v2_12932)	6.70E-04	2.65	
	<i>rplD</i> (ADVE02_v2_12930)	6.76E-04	2.62	
Ribosomal proteins	<i>rplE</i> (ADVE02_v2_12941)	8.76E-04	2.58	
	<i>rplP</i> (ADVE02_v2_12936)	2.94E-04	2.75	
	<i>rplV</i> (ADVE02_v2_12934)	6.98E-04	2.60	
	<i>rplW</i> (ADVE02_v2_12931)	3.72E-04	2.72	
	<i>rpmC</i> (ADVE02_v2_12937)	6.21E-04	2.63	
	<i>rpsH</i> (ADVE02_12943)	6.61E-04	2.58	
	<i>rpsN</i> (ADVE02_12942)	7.09E-04	2.64	
	<i>rpsQ</i> (ADVE02_12938)	9.69E-04	2.56	
	<i>rpsS</i> (ADVE02_12933)	5.72E-04	2.64	
	Downregulated in 10 μ M copper + 0 μ M cerium compared with 0 μ M copper + 0 μ M cerium			
	Soluble methane monooxygenase	<i>mmoB</i> (ADVE02_v2_12512)	5.62E-129	- 8.84
<i>mmoC</i> (ADVE02_v2_12515)		1.22E-291	- 7.68	
<i>mmoD</i> (ADVE02_v2_12514)		0.00E+00	- 8.76	
<i>mmoG</i> (ADVE02_v2_12509)		8.75E-72	- 5.27	
<i>mmoR</i> (ADVE02_v2_12507)		3.88E-49	- 5.20	
<i>mmoX</i> (ADVE02_v2_12510)		0.00E+00	- 9.51	
<i>mmoY</i> (ADVE02_v2_12511)		9.91E-132	- 8.96	
<i>mmoZ</i> (ADVE02_v2_12513)		4.95E-158	- 9.05	
Methanobactin synthesis and transport		<i>mbnA</i> (ADVE02_v2_13652)	3.36E-46	- 6.48
	<i>mbnB</i> (ADVE02_v2_13653)	6.74E-44	- 5.87	
	<i>mbnC</i> (ADVE02_v2_13655)	1.08E-33	- 5.29	
	<i>mbnH</i> (ADVE02_v2_13659)	4.67E-72	- 5.35	
	<i>mbnM</i> (ADVE02_v2_13656)	3.29E-32	- 4.69	
	<i>mbnN</i> (ADVE02_v2_13657)	6.56E-14	- 3.91	
	<i>mbnP</i> (ADVE02_v2_13658)	2.06E-67	- 5.73	
	<i>mbnT</i> (ADVE02_v2_13651)	1.30E-33	- 4.96	
Transporters	ABC-type (ADVE02_v2_10934)	1.33E-04	- 1.98	
	RND-type (ADVE02_v2_11413)	8.83E-08	- 1.57	
	TonB-dependent (ADVE02_v2_10030)	3.81E-09	- 2.81	
	(ADVE02_v2_10151)	5.86E-24	- 3.67	
	(ADVE02_v2_11125)	7.80E-05	- 2.64	
	(ADVE02_v2_11295)	2.97E-22	- 3.01	
(ADVE02_v2_11307)	8.90E-08	- 1.97		

Table 1 (continued)

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change
Transcription regulators	(ADVE02_v2_11588)	1.28E–21	– 5.12
	(ADVE02_v2_12266)	4.30E–10	– 2.05
	(ADVE02_v2_12284)	1.17E–08	– 1.76
	(ADVE02_v2_13641)	9.80E–12	– 2.10
	(ADVE02_v2_13988)	2.54E–22	– 2.14
	(ADVE02_v2_14392)	2.83E–15	– 3.05
	(ADVE02_v2_20043)	9.48E–07	– 1.79
	FecRI-homologs (ADVE02_v2_10211)	2.73E–05	– 1.89
	(ADVE02_v2_10212)	4.85E–06	– 2.39
	(ADVE02_v2_11296)	2.46E–35	– 3.11
	(ADVE02_v2_11297)	4.28E–10	– 2.49
	(ADVE02_v2_11828)	7.74E–08	– 1.60
	(ADVE02_v2_13990)	1.19E–08	– 2.23
	(ADVE02_v2_14098)	4.48E–10	– 2.47
	(ADVE02_v2_14393)	5.54E–12	– 2.88
	(ADVE02_v2_14,394)	1.31E–09	– 3.24
	(ADVE02_v2_20042)	1.76E–06	– 1.61
	σ ²⁴ (ADVE02_v2_10149)	7.93E–04	– 1.81
	(ADVE02_v2_11305)	1.96E–04	– 1.66
	(ADVE02_v2_11827)	8.71E–05	– 1.75
(ADVE02_v2_12264)	3.86E–11	– 2.41	
σ ⁷⁰ (ADVE02_v2_13661)	2.01E–88	– 5.11	

presence of cerium (Table 2). Three genes encoding for either a TonB-dependent receptor, a pentapeptide repeat protein, and a protein of unknown function immediately upstream of *mxoF* were the only other genes to exhibit decreased expression when cerium was added in the absence of copper (Table 2; Supplementary Excel File S1).

Differentially expressed genes in the presence or absence of cerium and in the presence of copper

When comparing the transcriptome of *M. trichosporium* OB3b grown with 10 μM copper + 0 μM cerium vs. 10 μM copper + 25 μM cerium, only seven genes were upregulated when cerium was added in the presence of copper. Those with annotated function are listed in Table 3; complete differential analyses are shown in Supplementary Excel File S1. These included genes encoding for Xox1-MeDH, an ABC-type transporter, a TonB-dependent transporter, and an MxaD homolog that is believed to be involved in electron transfer between the methanol dehydrogenase and cytochrome c (Toyama et al. 2003). Thirty-six genes were found to be downregulated, most notably genes encoding for nitrogenase and hydrogenase as summarized in Table 3, as well as many genes encoding for proteins of unknown function (Supplementary Excel File S1).

Differentially expressed genes in the presence or absence of copper and in the presence of cerium

When comparing the transcriptome of *M. trichosporium* OB3b grown with 0 μM copper + 25 μM cerium or 10 μM copper + 25 μM cerium, over 780 genes, approximately 15% of the entire genome, were found to be either up- or downregulated. Figure 2 maps major shifts in gene expression for various metabolic pathways and uptake systems while Table 4 summarizes major changes in gene expression, i.e., genes involved in metal homeostasis, methane oxidation, transcriptional regulation, and cell synthesis are listed. Again, complete differential analyses are shown in Supplementary Excel File S1.

As found when copper was added in the absence of cerium (Table 1), if copper was added in the presence of cerium, genes involved in copper uptake decreased (*mbnA*) while those involved in copper efflux and storage increased (*cusAB* and *cspI*, respectively). Similarly, genes involved in pyoverdine synthesis decreased when copper was added in the presence of cerium.

Further, as found when comparing the transcriptomes of cultures grown with 0 μM copper + 0 μM cerium vs. 10 μM copper + 0 μM cerium, expression of genes encoding for 30S and 50S ribosomal proteins increased for cultures grown in the

Table 2 Genes with annotated function that were differentially expressed in *M. trichosporium* OB3b when grown with 0 μ M copper + 25 μ M cerium vs. 0 μ M copper + 0 μ M cerium (Benjamini-Hochberg-adjusted p value $< 1 \times 10^{-3}$, $|\log_2| > 1.5$). Note that complete differential expression analyses are available in the supplementary information as Supplementary Excel File S1

Function	Gene/locus number	p value	\log_2 fold change
Upregulated in 0 μ M copper + 25 μ M cerium compared with 0 μ M copper + 0 μ M cerium			
Xox-type methanol dehydrogenase	<i>xoxF1</i> (ADVE02_v2_12117)	4.46E-30	3.89
	<i>xoxF2</i> (ADVE02_v2_11799)	1.02E-05	2.50
	<i>xoxG1</i> (ADVE02_v2_12118)	1.68E-18	2.48
	<i>xoxG2</i> (ADVE02_v2_11797)	5.24E-11	2.93
	<i>xoxJ2</i> (ADVE02_v2_11798)	2.00E-05	2.28
Pyoverdine synthesis and transport	<i>aphA</i> (ADVE02_v2_30012)	3.09E-08	2.06
	<i>fpvA</i> (ADVE02_v2_30019)	8.18E-09	2.37
	<i>mbtH</i> (ADVE02_v2_30032)	1.71E-27	5.11
	<i>pvdA</i> (ADVE02_v2_30015)	7.53E-18	3.03
	<i>pvdF</i> (ADVE02_v2_30013)	4.97E-25	3.54
	<i>pvdH</i> (ADVE02_v2_30016)	3.61E-15	2.81
	<i>pvdL</i> (ADVE02_v2_30029)	2.56E-07	1.74
ABC-type transporters	(ADVE02_v2_11792)	2.09E-05	2.42
	(ADVE02_v2_30018)	1.18E-06	1.78
σ^{70} transcription regulator	(ADVE02_v2_30017)	8.41E-07	1.85
Downregulated in 0 μ M copper + 25 μ M cerium compared with 0 μ M copper + 0 μ M cerium			
Mxa-type methanol dehydrogenase	<i>mxmA</i> (ADVE02_v2_12103)	4.93E-11	-3.21
	<i>mxmC</i> (ADVE02_v2_12102)	6.91E-16	-4.14
	<i>mxmD</i> (ADVE02_v2_12099)	2.31E-15	-4.24
	<i>mxmF</i> (ADVE02_v2_12109)	1.34E-41	-6.19
	<i>mxmG</i> (ADVE02_v2_12107)	7.95E-52	-5.72
	<i>mxmH</i> (ADVE02_v2_12098)	6.50E-12	-3.41
	<i>mxmI</i> (ADVE02_v2_12106)	4.71E-52	-6.24
	<i>mxmJ</i> (ADVE02_v2_12108)	5.20E-74	-6.04
	<i>mxmK</i> (ADVE02_v2_12101)	4.67E-12	-3.36
	<i>mxmL</i> (ADVE02_v2_12100)	8.43E-15	-4.10
	<i>mxmR</i> (ADVE02_v2_12105)	1.23E-64	-6.12
	<i>mxmS</i> (ADVE02_v2_12104)	3.25E-32	-5.29
	TonB-dependent transporter	(ADVE02_v2_10208)	3.59E-33
Pentapeptide repeat protein	(ADVE02_v2_11208)	3.91E-15	-3.25

presence of 10 μ M copper + 25 μ M cerium vs. 0 μ M copper + 25 μ M cerium. In addition, expression of genes involved in the conversion of formaldehyde to biomass via the serine cycle and ethylmalonyl-CoA pathway were upregulated as were genes for amino acid, tRNA, fatty acid and cobalamin synthesis, amongst many others (Fig. 2, Table 4). In the presence of copper and cerium, Mxa- and Xox1-MeDH were both expressed, while expression of a gene encoding for a subunit of the NAD-linked formate dehydrogenase decreased. Expression of nitrogenase and hydrogenase genes also decreased when copper was added in the presence of cerium.

RT-qPCR confirmation of differential gene expression

To confirm RNA-Seq findings that genes encoding for alternative MMOs (sMMO vs. pMMO), MeDHs (Mxa-MeDH vs

Xox-MeDH), metal uptake systems (methanobactin and pyoverdine) and nitrogenase varied in response to varied concentrations of copper or cerium, more focused and accurate RT-qPCR assays of the following genes were performed: *mmoX* and *pmoA* (sMMO and pMMO, respectively), *mxmF*, *xoxF1* and *xoxF2* (Mxa-MeDH and Xox-MeDH, respectively), *mbnA* (methanobactin), *pvdF* (pyoverdine), and *nifH* (nitrogenase). Three genes—*rrs* (16 s rRNA), *clpX*, (a subunit of a ClpX-ClpP ATP-dependent serine protease), and *yjg* (a permease of the YjgP/YjgQ family)—were used as internal references. These were chosen as *rrs* was found earlier to be appropriate (Farhan UI Haque et al. 2015a, b; Gu et al. 2016; Kalidass et al. 2015), and expression of *clpX* and *yjg* were observed to be invariant under the growth conditions described examined here, i.e., \log_2 expression changes < 0.05 as determined via RNA-Seq. Figure 3 shows changes in gene

Table 3 Selected genes with annotated function that were differentially expressed in *M. trichosporium* OB3b when grown with 10 μM copper + 25 μM cerium vs. 10 μM copper + 0 μM cerium (Benjamini-Hochberg-adjusted *p* value < 1 × 10⁻³, |log₂| > 1.5). Note that complete differential expression analyses are available in the supplementary information as Supplementary Excel File S1

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change
Upregulated genes in 10 μM copper + 25 μM cerium compared with 10 μM copper + 0 μM cerium			
Xox-type methanol dehydrogenase	<i>xoxF1</i> (ADVE02_v2_12117)	1.56E-24	3.55
	<i>xoxG1</i> (ADVE02_v2_12118)	1.68E-27	3.02
Transporters	ABC-type (ADVE02_v2_11791)	9.87E-04	2.01
	TonB-dependent (ADVE02_v2_10208)	2.90E-15	1.91
MxaD homolog	(ADVE02_v2_13992)	1.68E-27	1.72
Downregulated genes in 10 μM copper + 25 μM cerium compared with 10 μM copper + 0 μM cerium			
Hydrogenase	<i>hupH</i> (ADVE02_v2_14422)	7.48E-04	-2.57
	<i>hyaB</i> (ADVE02_v2_14428)	5.81E-05	-3.15
	<i>hyaC</i> (ADVE02_v2_14427)	1.50E-04	-3.05
Nitrogenase	<i>frxA</i> (ADVE02_v2_13288)	3.47E-04	-1.55
	<i>nifB</i> (ADVE02_v2_13287)	7.48E-04	-1.68
	<i>nifE</i> (ADVE02_v2_13306)	3.10E-04	-2.63
	<i>nifN</i> (ADVE02_v2_13307)	6.30E-04	-2.42
	<i>nifU</i> (ADVE02_v2_13315)	9.87E-04	-2.45
	<i>nifX</i> (ADVE02_v2_13308)	6.19E-04	-2.32

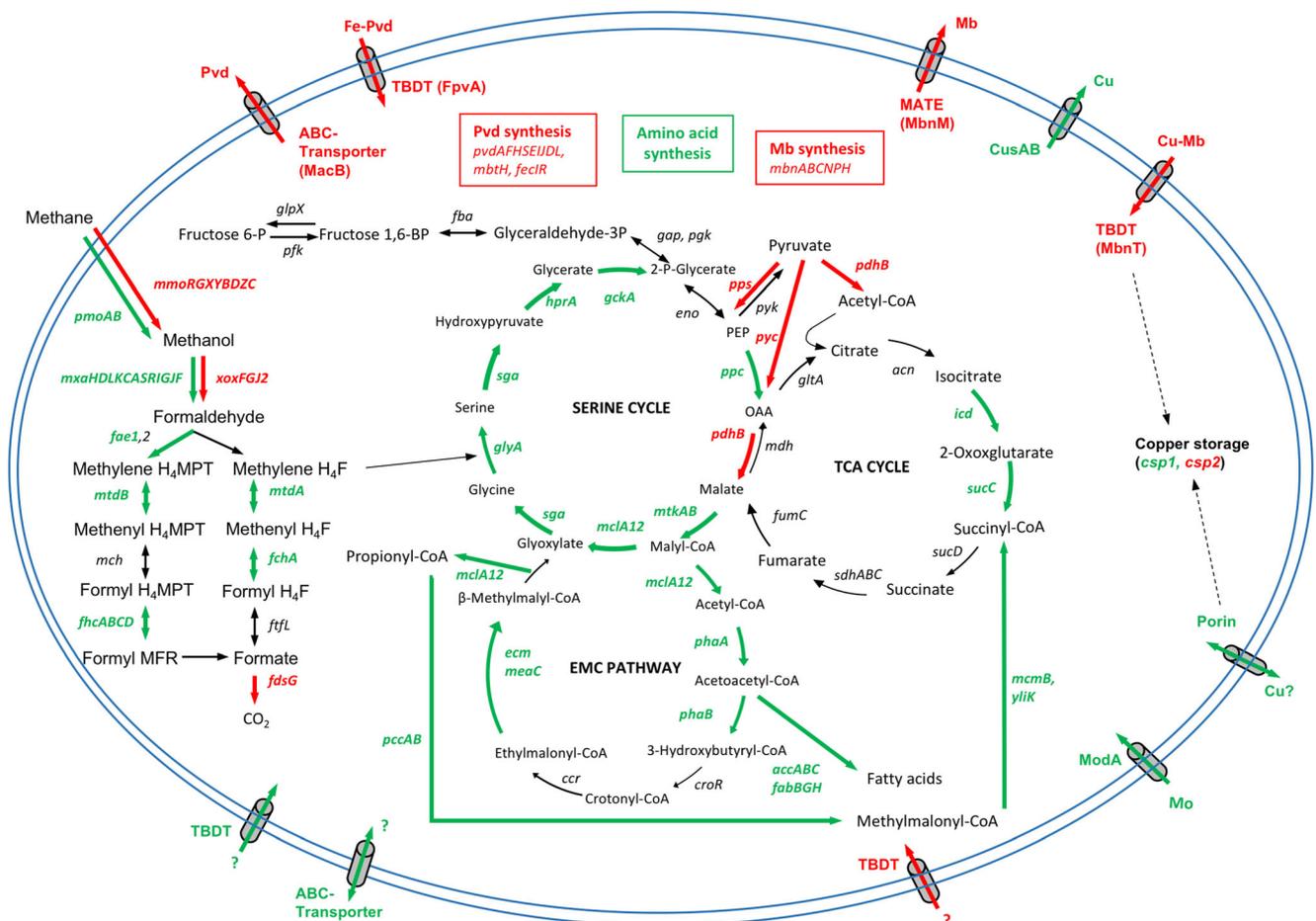


Fig. 2 Central metabolism of *M. trichosporium* OB3b. Genes highlighted in green or red were significantly upregulated or downregulated, respectively, when *M. trichosporium* OB3b was grown in the presence of 10 μM copper + 25 μM cerium vs. in the presence of

0 μM copper + 25 μM cerium. ABC-Transporter = ATP-binding cassette transporter, TBDT = TonB-dependent transporter, MATE = multi-antimicrobial extrusion protein, Mb = methanobactin, Pvd = pyoverdine

Table 4 Selected genes with annotated function that were differentially expressed in *M. trichosporium* OB3b when grown with 10 μ M copper + 25 μ M cerium vs. 0 μ M copper + 25 μ M cerium (Benjamini-Hochberg-adjusted p value $< 1 \times 10^{-3}$, $|\log_2| > 1.5$). Note that complete differential expression analyses are available in the supplementary information as Supplementary Excel File S1

Function	Gene/locus number	p value	Log ₂ fold change	
Upregulated in 10 μ M copper + 25 μ M cerium vs. 0 μ M copper + 25 μ M cerium				
Particulate methane monooxygenase	<i>pmoA1</i> (ADVE02_v2_10400)	1.29E-07	2.11	
	<i>pmoA2</i> (ADVE02_v2_12979)	1.59E-07	2.10	
	<i>pmoB1</i> (ADVE02_v2_10399)	4.29E-05	1.64	
Mxa-type methanol dehydrogenase	<i>pmoB2</i> (ADVE02_v2_12980)	4.10E-05	1.64	
	<i>mxmA</i> (ADVE02_v2_12103)	2.56E-19	4.12	
	<i>mxmC</i> (ADVE02_v2_12102)	6.29E-28	5.37	
	<i>mxmD</i> (ADVE02_v2_12099)	2.46E-27	5.53	
	<i>mxmF</i> (ADVE02_v2_12109)	1.96E-42	6.19	
	<i>mxmG</i> (ADVE02_v2_12107)	6.39E-64	6.30	
	<i>mxmH</i> (ADVE02_v2_12098)	7.38E-22	4.50	
	<i>mxmI</i> (ADVE02_v2_12106)	2.47E-54	6.33	
	<i>mxmJ</i> (ADVE02_v2_12108)	1.43E-84	6.41	
	<i>mxmK</i> (ADVE02_v2_12101)	4.34E-23	4.50	
	<i>mxmL</i> (ADVE02_v2_12100)	1.90E-25	5.26	
	<i>mxmR</i> (ADVE02_v2_12105)	6.47E-76	6.58	
	<i>mxmS</i> (ADVE02_v2_12104)	4.95E-43	6.04	
Formaldehyde oxidation	<i>fae1</i> (ADVE02_v2_12301)	3.14E-05	1.77	
	<i>fchA</i> (ADVE02_v2_12564)	5.74E-06	2.19	
	<i>fhcA</i> (ADVE02_v2_14361)	4.58E-06	2.19	
	<i>fhcB</i> (ADVE02_v2_14362)	1.67E-05	1.73	
	<i>fhcC</i> (ADVE02_v2_14359)	1.82E-06	2.43	
	<i>fhcD</i> (ADVE02_v2_14360)	2.03E-06	2.36	
	<i>mtdA</i> (ADVE02_v2_12565)	4.47E-06	2.42	
	<i>mtdB</i> (ADVE02_v2_12229)	1.35E-04	1.94	
	Carbon assimilation	<i>ecm</i> (ADVE02_v2_10884)	8.61E-05	1.57
		<i>gckA</i> (ADVE02_v2_12558)	6.35E-05	1.91
<i>glyA</i> (ADVE02_v2_13825)		1.38E-04	1.67	
<i>hprA</i> (ADVE02_v2_12566)		7.47E-05	2.10	
<i>icd</i> (ADVE02_v2_10351)		2.86E-04	1.55	
<i>mclA1</i> (ADVE02_v2_12560)		2.61E-05	2.14	
<i>mclA2</i> (ADVE02_v2_11719)		6.14E-05	1.77	
<i>mcmB</i> (ADVE02_v2_11451)		1.60E-05	2.05	
<i>meaC</i> (ADVE02_v2_14344)		4.38E-06	2.36	
<i>mtkA</i> (ADVE02_v2_12563)		1.57E-04	1.79	
<i>mtkB</i> (ADVE02_v2_12562)		7.82E-05	1.89	
<i>pccA</i> (ADVE02_v2_10751)		2.94E-06	2.11	
<i>pccB</i> (ADVE02_v2_11744)		2.06E-06	1.92	
<i>phaA</i> (ADVE02_v2_11388)		5.93E-06	1.71	
<i>phaB</i> (ADVE02_v2_11389)		5.57E-08	3.07	
<i>ppc</i> (ADVE02_v2_12561)		8.82E-06	2.35	
<i>sga</i> (ADVE02_v2_12567)		2.97E-06	2.74	
<i>sucC</i> (ADVE02_v2_11139)		3.32E-05	1.65	
<i>yliK</i> (ADVE02_v2_12495)		2.51E-06	1.65	
Fatty acid synthesis	<i>accA</i> (ADVE02_v2_14271)	8.34E-04	1.52	
	<i>accB</i> (ADVE02_v2_14116)	5.35E-07	1.96	
	<i>accC</i> (ADVE02_v2_14117)	1.35E-09	2.84	
	<i>fabB</i> (ADVE02_v2_13178)	7.20E-07	1.69	
	<i>fabG</i> (ADVE02_v2_11402)	2.54E-05	1.89	
	<i>fabH1</i> (ADVE02_v2_11830)	2.34E-04	1.73	
	<i>fabH2</i> (ADVE02_v2_14383)	2.84E-05	1.87	
Ribosomal proteins and rRNA maturation	<i>rimM</i> (ADVE02_v2_10846)	2.69E-05	2.32	
	<i>rlmJ</i> (ADVE02_v2_10085)	3.11E-05	1.63	

Table 4 (continued)

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change
	<i>rplA</i> (ADVE02_v2_12752)	5.87E-06	2.44
	<i>rplB</i> (ADVE02_v2_12932)	7.37E-08	3.73
	<i>rplD</i> (ADVE02_v2_12930)	1.15E-07	3.64
	<i>rplE</i> (ADVE02_v2_12941)	3.20E-08	3.80
	<i>rplF</i> (ADVE02_v2_12944)	4.96E-08	3.66
	<i>rplI</i> (ADVE02_v2_10233)	1.17E-06	2.21
	<i>rplK</i> (ADVE02_v2_12753)	1.63E-05	2.39
	<i>rplL</i> (ADVE02_v2_11490)	2.09E-04	1.97
	<i>rplM</i> (ADVE02_v2_10910)	8.65E-07	3.14
	<i>rplN</i> (ADVE02_v2_12939)	4.84E-08	3.71
	<i>rplO</i> (ADVE02_v2_12948)	3.34E-07	3.24
	<i>rplP</i> (ADVE02_v2_12936)	1.09E-08	3.91
	<i>rplQ</i> (ADVE02_v2_12500)	4.99E-06	2.28
	<i>rplR</i> (ADVE02_v2_12945)	1.26E-07	3.43
	<i>rplT</i> (ADVE02_v2_13716)	6.93E-06	2.27
	<i>rplV</i> (ADVE02_v2_12934)	2.37E-08	3.81
	<i>rplW</i> (ADVE02_v2_12931)	5.28E-08	3.74
	<i>rplX</i> (ADVE02_v2_12940)	4.72E-08	3.70
	<i>rplY</i> (ADVE02_v2_12131)	1.75E-04	2.02
	<i>rpmC</i> (ADVE02_v2_12937)	4.90E-08	3.74
	<i>rpmD</i> (ADVE02_v2_12947)	3.85E-07	3.32
	<i>rpmH</i> (ADVE02_v2_13333)	3.96E-06	1.52
	<i>rpmI</i> (ADVE02_v2_13717)	1.37E-05	2.14
	<i>rpsB</i> (ADVE02_2_11840)	6.71E-04	1.65
	<i>rpsC</i> (ADVE02_2_12935)	2.62E-06	3.42
	<i>rpsD</i> (ADVE02_2_11529)	4.12E-06	2.78
	<i>rpsF</i> (ADVE02_2_11513)	6.49E-04	1.96
	<i>rpsH</i> (ADVE02_2_12943)	3.57E-08	3.72
	<i>rpsI</i> (ADVE02_2_10909)	5.66E-08	3.61
	<i>rpsK</i> (ADVE02_2_12498)	2.70E-04	1.74
	<i>rpsN</i> (ADVE02_2_12942)	1.10E-07	3.68
	<i>rpsO</i> (ADVE02_2_10701)	2.69E-05	1.87
	<i>rpsP</i> (ADVE02_2_10845)	3.77E-06	2.63
	<i>rpsQ</i> (ADVE02_2_12938)	5.66E-08	3.73
	<i>rpsS</i> (ADVE02_2_12933)	4.68E-08	3.75
	<i>rsmD</i> (ADVE02_v2_13165)	1.17E-09	2.15
tRNA synthetase	<i>alaS</i> (ADVE02_v2_12800)	1.38E-04	1.50
	<i>gatA</i> (ADVE02_v2_10426)	5.06E-05	1.64
	<i>hisS</i> (ADVE02_v2_12393)	1.20E-04	1.61
	<i>mtaB</i> (ADVE02_v2_10603)	5.87E-06	1.53
	<i>pheT</i> (ADVE02_v2_11823)	1.82E-06	1.90
	<i>queA</i> (ADVE02_v2_10342)	1.64E-07	1.74
	<i>thrS</i> (ADVE02_v2_11769)	1.32E-05	1.90
	<i>truB</i> (ADVE02_v2_12786)	1.36E-06	2.09
	<i>tsaD</i> (ADVE02_v2_12701)	2.10E-05	1.57
	<i>tyrS</i> (ADVE02_v2_10186)	1.04E-04	1.51
	<i>valS</i> (ADVE02_v2_13325)	1.40E-05	1.91
Cellular division	<i>ftsE</i> (ADVE02_v2_10243)	5.58E-07	1.67
	<i>ftsX</i> (ADVE02_v2_10242)	1.27E-06	1.80
	<i>parA</i> (ADVE02_v2_12452)	1.90E-06	1.51
	<i>parB</i> (ADVE02_v2_12453)	9.97E-06	2.03
Amino acid synthetases	<i>argB</i> (ADVE02_v2_13329)	7.49E-05	1.79
	<i>argF</i> (ADVE02_v2_12391)	1.38E-06	2.23
	<i>argH</i> (ADVE02_v2_12625)	1.67E-04	1.86
	<i>argJ</i> (ADVE02_v2_12460)	6.15E-06	2.27

Table 4 (continued)

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change
	<i>glnA</i> (ADVE02_v2_10779)	1.19E-05	2.00
	<i>hisA</i> (ADVE02_v2_13556)	7.13E-06	1.77
	<i>hisC</i> (ADVE02_v2_13277)	2.84E-05	1.70
	<i>hisG</i> (ADVE02_v2_10098)	1.32E-04	1.72
	<i>hisH</i> (ADVE02_v2_13557)	7.59E-06	1.67
	<i>ilvC</i> (ADVE02_v2_13727)	5.19E-05	1.87
	<i>leuB</i> (ADVE02_v2_11144)	5.87E-06	2.28
	<i>leuD</i> (ADVE02_v2_12339)	2.05E-04	1.70
	<i>proB</i> (ADVE02_v2_10193)	5.27E-04	1.66
	<i>serC</i> (ADVE02_v2_12859)	2.87E-05	1.89
	<i>thrB</i> (ADVE02_v2_11436)	5.55E-08	1.96
	<i>trpE</i> (ADVE02_v2_10860)	5.19E-05	1.74
NADH-quinone oxidoreductase	<i>nuoB</i> (ADVE02_v2_14048)	4.25E-04	1.65
	<i>nuoC</i> (ADVE02_v2_14050)	5.90E-05	2.01
	<i>nuoD</i> (ADVE02_v2_14051)	4.48E-06	2.47
	<i>nuoE</i> (ADVE02_v2_14052)	7.33E-07	2.58
	<i>nuoF</i> (ADVE02_v2_14053)	1.81E-06	2.61
	<i>nuoG</i> (ADVE02_v2_14054)	3.97E-07	2.81
	<i>nuoH</i> (ADVE02_v2_14055)	1.04E-06	2.73
	<i>nuoI</i> (ADVE02_v2_14056)	1.97E-06	2.57
	<i>nuoJ</i> (ADVE02_v2_14057)	1.02E-07	2.84
	<i>nuoK</i> (ADVE02_v2_14058)	7.32E-08	2.98
	<i>nuoL</i> (ADVE02_v2_14059)	1.06E-07	2.93
	<i>nuoM</i> (ADVE02_v2_14060)	1.15E-07	2.92
	<i>nuoN</i> (ADVE02_v2_14061)	3.22E-08	2.88
Vitamin synthesis	<i>bioB</i> (ADVE02_v2_14107)	8.70E-07	1.77
	<i>cobB</i> (ADVE02_v2_13108)	4.96E-06	1.71
	<i>cobD</i> (ADVE02_v2_10145)	6.51E-06	2.16
	<i>cobF</i> (ADVE02_v2_13107)	1.62E-06	2.17
	<i>cobH</i> (ADVE02_v2_13115)	1.20E-04	1.87
	<i>cobI</i> (ADVE02_v2_13114)	4.02E-05	2.00
	<i>cobJ</i> (ADVE02_v2_13113)	6.13E-05	1.63
	<i>cobL</i> (ADVE02_v2_13111)	6.21E-06	2.27
	<i>cobM</i> (ADVE02_v2_13109)	5.29E-08	2.41
	<i>cobN</i> (ADVE02_v2_11366)	3.49E-07	2.52
	<i>cobO</i> (ADVE02_v2_11365)	5.66E-08	3.02
	<i>cobQ</i> (ADVE02_v2_10146)	6.72E-06	1.76
	<i>cobT</i> (ADVE02_v2_10147)	1.25E-06	2.21
	<i>cobW</i> (ADVE02_v2_11367)	5.69E-06	1.89
ATP synthase	<i>atpA</i> (ADVE02_v2_10591)	1.25E-06	2.79
	<i>atpB</i> (ADVE02_v2_10589)	1.71E-07	3.21
	<i>atpB</i> (ADVE02_v2_11080)	7.11E-04	1.82
	<i>atpC</i> (ADVE02_v2_10588)	2.29E-08	3.30
	<i>atpE</i> (ADVE02_v2_11079)	1.31E-06	2.62
	<i>atpF1</i> (ADVE02_v2_11077)	1.62E-05	2.40
	<i>atpF2</i> (ADVE02_v2_11078)	3.21E-05	2.21
	<i>atpG</i> (ADVE02_v2_10590)	2.73E-07	3.05
Transcription regulators	<i>oxyR</i> (ADVE02_v2_13066)	6.59E-05	1.90
	TetR-like (ADVE02_v2_12329)	2.72E-04	1.61
Copper storage protein	<i>cspI</i> (ADVE02_v2_12455)	2.93E-24	2.85
Flagella synthesis	(ADVE02_v2_11181)	3.36E-04	1.92
	(ADVE02_v2_11202)	1.56E-04	1.81
Transporters	ABC-type)		
	(ADVE02_v2_12321)	6.34E-14	1.65
	(ADVE02_v2_12556)	7.89E-07	1.93

Table 4 (continued)

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change
	(ADVE02_v2_13887)	1.88E-07	1.87
	<i>cusA</i> (ADVE02_v2_12040)	1.68E-25	3.72
	<i>cusB</i> (ADVE02_v2_12041)	7.43E-95	5.48
	MATE-type (ADVE02_v2_10282)	6.89E-05	1.52
	<i>modA</i> (ADVE02_v2_12892)	1.13E-09	2.40
	Protein translocases		
	(ADVE02_v2_10024)	6.54E-07	2.45
	(ADVE02_v2_10025)	3.08E-06	2.24
	(ADVE02_v2_12441)	5.96E-06	2.14
	RND-type		
	(ADVE02_v2_11509)	1.25E-05	1.96
	(ADVE02_v2_11510)	2.93E-05	2.13
	(ADVE02_v2_11574)	3.97E-05	1.77
	TonB-dependent		
	(ADVE02_v2_10208)	3.24E-74	4.12
	(ADVE02_v2_10668)	1.39E-05	1.68
	(ADVE02_v2_13035)	3.01E-07	2.15
	(ADVE02_v2_14446)	7.98E-06	2.74
	(ADVE02_v2_14451)	3.37E-06	1.71
Downregulated in 10 μM copper + 25 μM cerium vs. 0 μM copper + 25 μM cerium			
Soluble methane monooxygenase	<i>mmoB</i> (ADVE02_v2_12512)	2.36E-137	-9.12
	<i>mmoC</i> (ADVE02_v2_12515)	0.00E+00	-8.14
	<i>mmoD</i> (ADVE02_v2_12514)	0.00E+00	-9.15
	<i>mmoG</i> (ADVE02_v2_12509)	5.93E-72	-5.26
	<i>mmoR</i> (ADVE02_v2_12507)	9.82E-50	-5.21
	<i>mmoX</i> (ADVE02_v2_12510)	0.00E+00	-10.00
	<i>mmoY</i> (ADVE02_v2_12511)	9.48E-141	-9.26
	<i>mmoZ</i> (ADVE02_v2_12513)	1.54E-171	-9.42
Xox-type methanol dehydrogenase	<i>xoxF2</i> (ADVE02_v2_11799)	2.93E-04	-1.84
	<i>xoxG2</i> (ADVE02_v2_11797)	7.79E-13	-3.06
	<i>xoxJ2</i> (ADVE02_v2_11798)	8.02E-09	-2.75
Formate dehydrogenase	<i>fdsG</i> (ADVE02_v2_11629)	2.48E-07	-1.68
Methanobactin synthesis and transport	<i>mbnA</i> (ADVE02_v2_13652)	3.87E-52	-6.88
	<i>mbnB</i> (ADVE02_v2_13653)	2.68E-54	-6.52
	<i>mbnC</i> (ADVE02_v2_13655)	1.06E-39	-5.73
	<i>mbnH</i> (ADVE02_v2_13659)	1.07E-80	-5.65
	<i>mbnM</i> (ADVE02_v2_13656)	1.10E-33	-4.78
	<i>mbnN</i> (ADVE02_v2_13657)	1.70E-15	-4.10
	<i>mbnP</i> (ADVE02_v2_13658)	4.07E-77	-6.12
	<i>mbnT</i> (ADVE02_v2_13651)	9.31E-26	-4.33
Pyoverdine synthesis and transport	<i>fpvA</i> (ADVE02_v2_30019)	9.71E-12	-2.64
	<i>macB</i> (ADVE02_v2_30010)	1.49E-09	-1.66
	<i>mbtH</i> (ADVE02_v2_30032)	2.15E-32	-4.86
	<i>pvdA</i> (ADVE02_v2_30015)	1.35E-30	-3.87
	<i>pvdF</i> (ADVE02_v2_30013)	5.28E-41	-4.45
	<i>pvdH</i> (ADVE02_v2_30016)	2.07E-26	-3.58
	<i>pvdL</i> (ADVE02_v2_30029)	7.13E-14	-2.29
Nitrogenase	<i>fixA</i> (ADVE02_v2_13288)	4.27E-07	-1.85
	<i>nifB</i> (ADVE02_v2_13287)	7.85E-10	-2.55
	<i>nifD</i> (ADVE02_v2_13304)	5.89E-04	-2.06
	<i>nifE</i> (ADVE02_v2_13306)	1.89E-04	-2.28
	<i>nifH</i> (ADVE02_v2_13303)	3.59E-04	-2.18
	<i>nifN</i> (ADVE02_v2_13307)	5.26E-04	-2.05
	<i>nifU</i> (ADVE02_v2_13,315)	1.33E-04	-2.36
	<i>nifW</i> (ADVE02_v2_13,319)	8.93E-04	-1.76

Table 4 (continued)

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change	
Hydrogenase	<i>nifX</i> (ADVE02_v2_13,308)	4.08E-04	-2.00	
	<i>hupF</i> (ADVE02_v2_14424)	6.16E-04	-2.13	
	<i>hupG</i> (ADVE02_v2_14423)	4.04E-05	-2.54	
	<i>hupH</i> (ADVE02_v2_14422)	1.33E-04	-2.43	
	<i>hupJ</i> (ADVE02_v2_14420)	9.40E-04	-2.14	
	<i>hyaA</i> (ADVE02_v2_14429)	4.08E-06	-2.95	
	<i>hyaB</i> (ADVE02_v2_14428)	6.84E-05	-2.65	
	<i>hyaC</i> (ADVE02_v2_14427)	2.92E-04	-2.44	
	<i>hyaD</i> (ADVE02_v2_14426)	4.15E-04	-2.21	
	<i>hybF</i> (ADVE02_v2_14418)	1.64E-04	-1.94	
	<i>hydA</i> (ADVE02_v2_11109)	7.35E-04	-1.72	
	<i>hypB</i> (ADVE02_v2_14417)	6.88E-06	-2.19	
	<i>hypC</i> (ADVE02_v2_14415)	8.96E-04	-1.73	
	<i>hypD</i> (ADVE02_v2_14414)	9.12E-05	-1.81	
<i>hypF</i> (ADVE02_v2_14416)	6.84E-05	-1.96		
Copper storage protein	Nickel-dependent hydrogenase			
	(ADVE02_v2_10849)	1.11E-04	-2.04	
	(ADVE02_v2_10852)	5.92E-04	-1.84	
	(ADVE02_v2_10853)	7.65E-06	-2.11	
	<i>csp2</i> (ADVE02_v2_10455)	9.26E-07	-2.32	
	Transcription regulators	FecRI-homologs		
		(ADVE02_v2_10212)	9.68E-04	-1.62
		(ADVE02_v2_11296)	9.88E-38	-3.19
		(ADVE02_v2_11297)	1.58E-22	-3.68
		(ADVE02_v2_13990)	6.10E-11	-2.44
(ADVE02_v2_14098)		1.36E-09	-2.34	
(ADVE02_v2_14393)		9.06E-07	-2.06	
<i>fixJ</i> (ADVE02_v2_11038)		1.54E-11	-2.68	
LuxR-homolog				
(ADVE02_v2_12868)		2.49E-07	-1.69	
<i>rpoH</i> (ADVE02_v2_11218)	1.18E-07	-3.37		
SigH-homolog (ADVE02_v2_10962)	1.30E-05	-2.16		
TetR-homolog (ADVE02_v2_10058)				
σ^{24}	1.12E-10	-1.68		
(ADVE02_v2_11827)				
(ADVE02_v2_12264)	8.52E-05	-1.58		
(ADVE02_v2_14,394)	2.32E-09	-2.15		
σ^{70}	5.90E-08	-2.86		
(ADVE02_v2_13661)				
(ADVE02_v2_30017)	2.81E-84	-4.90		
Transporters	ABC-type	2.79E-15	-2.60	
	(ADVE02_v2_12305)			
	(ADVE02_v2_30003)	2.91E-04	-1.83	
	(ADVE02_v2_30018)	1.22E-04	-1.53	
	(ADVE02_v2_30146)	1.02E-10	-2.15	
	<i>actP</i> (ADVE02_v2_14129)	1.64E-07	-1.59	
	MATE-type (ADVE02_v2_12268)	3.32E-05	-1.70	
	RND-type	1.54E-04	-1.71	
	(ADVE02_v2_11413)			
	(ADVE02_v2_30009)	3.06E-09	-1.64	
	TonB-dependent	5.58E-09	-2.12	
	(ADVE02_v2_10030)			
	(ADVE02_v2_10151)	2.58E-05	-1.98	
	(ADVE02_v2_11295)	1.55E-42	-4.86	
(ADVE02_v2_11307)	1.81E-24	-3.14		

Table 4 (continued)

Function	Gene/locus number	<i>p</i> value	Log ₂ fold change
	(ADVE02_v2_11411)	2.71E-07	- 1.84
	(ADVE02_v2_11588)	1.42E-05	- 1.54
	(ADVE02_v2_12266)	1.17E-19	- 4.85
	(ADVE02_v2_12284)	8.00E-13	- 2.29
	(ADVE02_v2_12822)	3.13E-11	- 1.98
	(ADVE02_v2_13641)	1.81E-06	- 2.21
	(ADVE02_v2_13988)	1.95E-21	- 2.82
	(ADVE02_v2_14392)	1.42E-19	- 1.97
	(ADVE02_v2_20043)	5.70E-09	- 2.30

expression when the geometric mean of all three reference standards was used; similar trends were found when any one reference gene was used (Supplementary Figs. S2–S4).

As expected from RNA-Seq data, expression of *mmoX* and *mbnA* significantly decreased when copper was added, while *pmoA* expression increased, and such changes occurred regardless if cerium was present or not ($p < 0.05$; Fig. 3). Further, expression of *xoxF1* increased when cerium was added both in the absence and presence of copper while expression of *xoxF2* increased when cerium was added only in the absence of copper. *mxoF* expression only decreased when cerium was added in the absence of copper (Fig. 3, $p < 0.05$). *nifH* expression was also found to decrease in the presence of both copper and cerium as compared in the absence of both metals or in the presence of cerium only, i.e., there was no difference in *nifH* expression for *M. trichosporium* OB3b grown with 10 μ M copper + 0 μ M cerium and 10 μ M copper + 25 μ M cerium. Finally, *pvdF* was also found to be upregulated when cerium was added, but only in the absence of copper. Interestingly, RT-qPCR indicated that *pvdF* expression decreased slightly when copper was added (Fig. 3) but no significant changes were observed in the RNA-Seq data. Collectively, the RT-qPCR data support the RNA-Seq data in that copper and cerium differentially affected gene expression in *M. trichosporium* OB3b.

Discussion

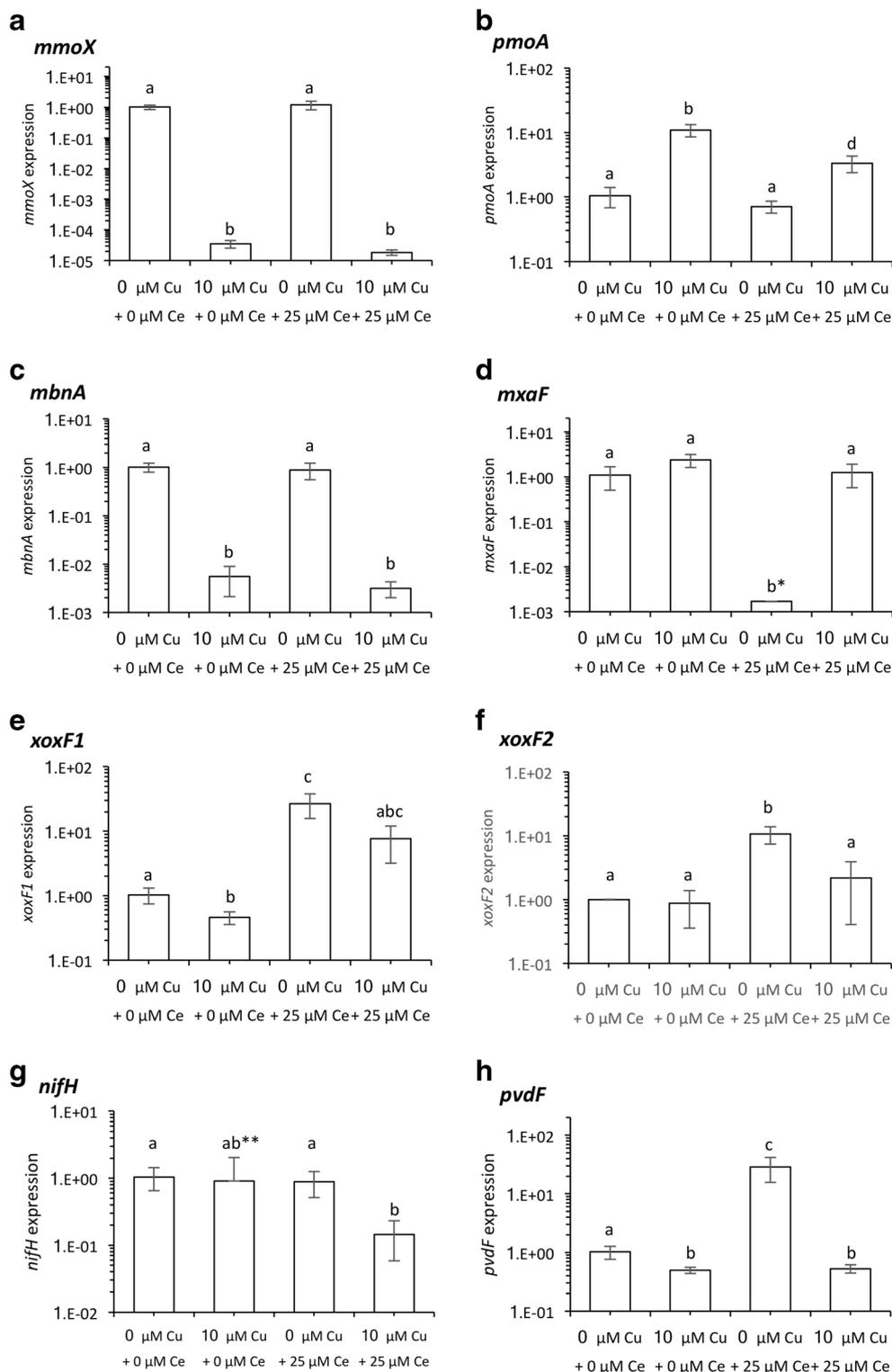
An earlier study of the transcriptome of *M. trichosporium* OB3b grown in the presence of 9 μ M copper found expression of many genes reported here, e.g., *pmo*, *nif*, *mxo*, and *pvd* genes (Matsen et al. 2013). That study was very informative in elucidating the metabolism of methanotrophs, and we extend that initial work to consider how the transcriptome of *M. trichosporium* OB3b varies in response to copper and cerium. These metals were chosen as it has been found that they control expression of key parts of methanotrophic metabolism, i.e., genes encoding for methane and methanol oxidation (Choi et al. 2003; Chu and Lidstrom 2016; Farhan UI Haque

et al. 2015a; Gu et al. 2016; Nielsen et al. 1996, 1997; Vu et al. 2016). Interestingly, copper and cerium affected the expression of other genes, but such control was strongly dependent on if both metals were present.

In the absence of cerium, copper affected expression of genes encoding for sMMO, pMMO, and methanobactin, as found earlier using more focused RT-qPCR assays (Farhan UI Haque et al. 2015a; Gu et al. 2016; Semrau et al. 2013). Interestingly, although copper is an important component of methanotrophic metabolism, these microbes (like others) appear to carefully regulate the distribution and amount of copper in vivo (Braymer and Giedroc 2014; Le Brun 2014; Porcheron et al. 2013). That is, expression of *mbn* genes (responsible for methanobactin synthesis) decreased in the presence of copper while expression *csp1* and *cusAB* (encoding for a copper storage protein and a copper efflux system respectively) increased. Such data indicates that *M. trichosporium* OB3b actively controls copper homeostasis and that it has a complex, interconnected system whereby copper uptake, storage, and excretion pathways are tightly coupled to effectively utilize copper while minimizing its toxicity.

When cerium was varied in the absence of copper, expression of fewer genes was observed to vary as compared to when copper was varied in the absence of cerium, suggesting that cerium (and by extension other REEs) plays a less significant role in methanotrophic metabolism than copper. Most notably, genes encoding for Xox-MeDH increased in expression, while those encoding for Mxa-MeDH had lower expression when cerium was added in the absence of copper. The finding of increased expression of pyoverdine synthesis genes when cerium was added in the absence of copper, however, is novel. Typically, expression of metal uptake systems increase with decreasing metal availability (Baichoo and Helmann, 2002; Baichoo et al. 2002; Ratledge and Dover 2000), suggesting that pyoverdine synthesis increased when cerium was added as cerium may have affected iron uptake in the absence of copper. When cerium was added in the presence of copper, however, expression of genes encoding for pyoverdine synthesis did not change.

Fig. 3 RT-qPCR of selected genes using the geometric mean of the expression of *rrs* (16S rRNA), *clpX* (subunit of a ClpX-ClpP ATP-dependent serine protease), and *yjg* (YjgP/YjgO family permease) as an internal standard. **a** *mmoX* (α -subunit of sMMO hydroxylase). **b** *pmoA* (27-kDa polypeptide of pMMO). **c** *mbnA* (polypeptide precursor of methanobactin). **d** *mxoF* (66-kDa polypeptide of Mxa-MeDH). **e** *xoxF1* (65-kDa polypeptide of Xox1-MeDH). **f** *xoxF2* (65-kDa polypeptide of Xox2-MeDH). **g** *nifH* (dinitrogenase reductase subunit). **h** *pvdF* (responsible for synthesis of formyl hydroxamate groups in pyoverdine). Each bar represents average of triplicate cultures; error bars represent standard deviation. Bars within each plot labeled by different letters are significantly different ($p < 0.05$). Asterisk = error bars are too small to be visible. Double asterisk = lower error bar is too large to plot on the logarithmic scale



Quite unexpectedly, expression of nitrogenase decreased when copper and cerium were both added as compared to when only copper or cerium was present (Tables 3 and 4). Nitrogenase activity was not predicted under any condition as nitrate mineral salts (NMS)

medium containing 9.9 mM NO_3^- was used for all cultures, and it has been shown that *M. trichosporium* OB3b has no N_2 -fixation activity in this medium (Murrell and Dalton 1983). Others have shown, however, low expression of nitrogenase genes in *M. trichosporium* OB3b

when grown in NMS medium amended with copper (Matsen et al. 2013). Our data support these findings, and further indicate that nitrogenase expression is most affected when both copper and cerium are present, for reasons as yet unknown.

If copper was varied in the presence of cerium, expression of many genes was found to be affected (Fig. 2, Table 4). Under this condition, it again appears that copper homeostasis must be carefully managed given that, when copper was added in the presence of cerium, genes involved in copper uptake decreased (*mbnA*) while those involved in copper efflux and storage increased (*cusAB* and *cspI*, respectively). Further, genes for ATP synthase, ribosomal proteins, and many steps for the conversion of formaldehyde to biomass via the serine cycle and ethylmalonyl-CoA pathway were found to substantially increase when both copper and cerium were provided vs. cerium alone. In the presence of copper and cerium, *Mxa*- and *Xox1*-MeDH were both expressed, and as such, *M. trichosporium* OB3b may be converting methanol to formaldehyde more rapidly. In doing so, however, the cell must also increase the rate at which formaldehyde is transformed, either through oxidation to formate or assimilation into biomass, to control the buildup of this toxic intermediate. It is interesting to note that hydrogenase expression decreased in the presence of copper and cerium as compared to when cerium was only added (Table 4). It has been observed that several methanotrophs, including *M. trichosporium* OB3b, can generate significant amounts of H₂, with production dependent on the oxidation of formate to carbon dioxide (Hanczár et al. 2002; Kawamura et al. 1983). It appears H₂ generation is used to balance the ratio of NAD⁺ to NADH by regenerating NAD⁺ consumed during formate oxidation (Kawamura et al. 1983). It may be that in the presence of copper and cerium, carbon flux through the serine cycle and ethylmalonyl-CoA pathway increased to control the buildup of formaldehyde. In this scenario, carbon flow to carbon dioxide through formate would be reduced, decreasing the need to generate H₂ to balance NAD⁺-NADH ratios. This speculation is supported (but not proven) by the finding of reduced expression of at least one gene encoding for a subunit of the NAD-linked formate dehydrogenase under these conditions (Fig. 2).

Alternatively, these hydrogenases may be used to consume hydrogen to consume H₂ generated from N₂ fixation. In this scenario, reduced hydrogenase expression in the presence of copper and cerium may be due to reduced nitrogenase expression. We must stress, however, that we cannot adequately explain reduced expression of either nitrogenase or hydrogenase in the presence of both copper and cerium with transcriptomic data alone. It would be interesting to examine the metabolome of *M. trichosporium* OB3b under varying amounts of copper and cerium, but such experiments are beyond the scope of this research.

In conclusion, we show herein that both copper and cerium affect the expression of many genes in *M. trichosporium* OB3b, but that the greatest changes occurred when both metals were present. Such studies may be very informative for manipulating methanotrophic metabolism for the valorization of methane. There is still much to be learned, however, about the role of copper and rare earth elements in methanotrophy, and it is difficult to overstate the importance of these metals in the metabolism of these microbes.

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Compliance with ethical standards

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

Ethical approval This article does not contain any studies with human participants or animals performed by any of the authors.

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