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# Pyrophosphate-free glycolysis in *Clostridium thermocellum* increases both thermodynamic driving force and ethanol titers

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## Abstract

**Background** *Clostridium thermocellum* is a promising candidate for production of cellulosic biofuels, however, its final product titer is too low for commercial application, and this may be due to thermodynamic limitations in glycolysis. Previous studies in this organism have revealed a metabolic bottleneck at the phosphofructokinase (PFK) reaction in glycolysis. In the wild-type organism, this reaction uses pyrophosphate (PP<sub>i</sub>) as an energy cofactor, which is thermodynamically less favorable compared to reactions that use ATP as a cofactor. Previously we showed that replacing the PP<sub>i</sub>-linked PFK reaction with an ATP-linked reaction increased the thermodynamic driving force of glycolysis, but only had a local effect on intracellular metabolite concentrations, and did not affect final ethanol titer.

**Results** In this study, we substituted PP<sub>i</sub>-*pfk* with ATP-*pfk*, deleted the other PP<sub>i</sub>-requiring glycolytic gene *pyruvate:phosphate dikinase (ppdk)*, and expressed a soluble *pyrophosphatase (PPase)* and *pyruvate kinase (pyk)* genes to engineer PP<sub>i</sub>-free glycolysis in *C. thermocellum*. We demonstrated a decrease in the reversibility of the PFK reaction, higher levels of lower glycolysis metabolites, and an increase in ethanol titer by an average of 38% (from 15.1 to 21.0 g/L) by using PP<sub>i</sub>-free glycolysis.

**Conclusions** By engineering PP<sub>i</sub>-free glycolysis in *C. thermocellum*, we achieved an increase in ethanol production. These results demonstrate that optimizing the thermodynamic landscape through metabolic engineering can enhance product titers. While further increases in ethanol titers are necessary for commercial application, this work represents a significant step toward engineering glycolysis in *C. thermocellum* to increase ethanol titers.

**Keywords** *Acetivibrio thermocellus*, Biofuels, *Clostridium thermocellum*, Ethanol production, Metabolic bottleneck, Metabolic engineering, *Phosphofructokinase*, Thermodynamics

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## Background

Technologies are needed to decarbonize the transportation sector to help reduce the need for petroleum usage that is driving catastrophic climate change. While electrification may help replace the current usage of gasoline for light duty transportation, sustainable liquid fuel solutions are critically needed for aviation, rail, and marine sectors [1]. Conversion of lignocellulose into ethanol can be part of the solution because ethanol can be catalytically oligomerized to hydrocarbons that can be used for sustainable aviation fuel (SAF). However, better conversion technologies are needed to make SAF a reality.

*Clostridium thermocellum* (also known as *Acetivibrio thermocellus*, *Hungateiclostridium thermocellum*, and *Ruminiclostridium thermocellum*) is a thermophilic anaerobe that has been extensively studied and engineered for consolidated bioprocessing of lignocellulose to biofuels such as ethanol [2, 3], due to its strong native ability to solubilize and ferment lignocellulose [4, 5]. One of the unique properties of this organism is that it consumes crystalline cellulose (e.g., Avicel) at the same rate or faster than soluble substrates, such as cellobiose [6]. Previous metabolic engineering efforts aimed at transforming *C. thermocellum* into a commercial platform for lignocellulosic biofuel production have primarily concentrated on enhancing fuel yield. Notably, high ethanol yields exceeding 80% of the theoretical maximum have been achieved [7, 8]. Current research is now directed toward further engineering the bacterium to achieve higher ethanol titers. Existing engineered strains produce titers in the range of 25–30 g/L [7–9]. Concentrations in the 40–50 g/L range are thought to be necessary for commercial applications [1, 10].

The atypical Embden–Meyerhof–Parnas (EMP) glycolytic pathway found in wild-type *C. thermocellum* [11] was previously observed to function closer to thermodynamic equilibrium compared to organisms such as *Thermoanaerobacterium saccharolyticum* or *Escherichia coli* that utilize a canonical glycolytic pathway [12, 13], and may limit final product titer in *C. thermocellum*. For our purposes, we define a canonical glycolytic pathway as one that uses an ATP-consuming reaction to generate fructose 1,6-bisphosphate and an ATP-producing reaction to convert phosphoenolpyruvate to pyruvate, and both of these steps have a high thermodynamic driving force that allows for allosteric regulation.

Differences in cofactor usage for key glycolytic reactions were proposed as the underlying reason for the distinct pathway thermodynamics based on metabolic flux analysis [12]. Specifically, the

pyrophosphate ( $PP_i$ )-dependent phosphofructokinase ( $PP_i$ -PFK) reaction is thought to significantly contribute to the lower thermodynamic driving force observed in *C. thermocellum*. During exponential growth, the driving force of this reaction has been calculated as  $\Delta_r G'_{PP_i\text{-pfk}} = -1.45$  kJ/mol [12]. In microbes like *T. saccharolyticum*, which utilize an ATP-dependent phosphofructokinase (ATP-PFK), the PFK reaction exhibits the largest drop in Gibbs free energy change of the entire pathway. During exponential growth, the driving force of this reaction has been calculated as  $\Delta_r G'_{ATP\text{-pfk}} = -22.57$  kJ/mol [12]. (Note: Thermodynamic annotation conventions are adapted from eQuilibrator [14].) Moreover, research findings have suggested that the ATP/ADP ratio tends to be significantly higher than the  $PP_i$  to inorganic phosphate ( $PP_i/P_i$ ) ratio in many organisms [15], thus further widening the difference in thermodynamic driving force between the two reactions. Additionally, it has been previously noted that the two native pathways employed by *C. thermocellum* for the conversion of phosphoenolpyruvate (PEP) to pyruvate, namely, the pyruvate:phosphate dikinase (PPDK) that uses  $PP_i$  to convert PEP and AMP to pyruvate and ATP [16] and the malate shunt that converts PEP to oxaloacetate to malate to pyruvate [16], also represent thermodynamic bottlenecks [17].

We recently engineered *C. thermocellum* to use ATP as the main cofactor for the PFK reaction [18]. Although this increased the thermodynamic driving force of the PFK reaction, the effects on intracellular metabolites were limited to a small region adjacent to this reaction, and there was no effect on ethanol titer. Furthermore, resequencing analyses found that the resulting strain (LL1660) had a partial genome duplication, complicating subsequent genetic engineering.

In this work, we make further progress toward engineering a  $PP_i$ -free glycolysis in *C. thermocellum* glycolysis by eliminating the  $PP_i$ -consuming reactions PFK and PPDK and providing an alternative pathway for PEP to pyruvate conversion via the pyruvate kinase (PYK) reaction. We define a “ $PP_i$ -free glycolysis” strain as one that does not require pyrophosphate ( $PP_i$ ) for any of the reactions in glycolysis. A key enabling step of engineering this into *C. thermocellum* was the expression of a soluble pyrophosphatase (PPase). Finally, we show that  $PP_i$ -free glycolysis increases the levels of downstream glycolysis metabolites, increasing ethanol titers. This demonstrates the potential of engineering pathway thermodynamics as a general strategy for improving product titers.

## Material and methods

### Strains used in this work

#### Plasmid and strain construction

Plasmids were constructed via isothermal assembly [20], using commercially available kits (New England Biolabs NEBuilder<sup>®</sup> HiFi DNA Assembly Master Mix, catalog number E2621). Plasmids were maintained and propagated from BL21 derivative *E. coli* strains (New England Biolabs T7 Express *E. coli*, catalog number C2566) to ensure proper methylation of the plasmid DNA [21]. Plasmid DNA was purified using commercial kits available from either New England Biolabs or Zymo Research.

Transformation of *C. thermocellum* was performed as previously described [22].

#### Media and growth conditions

All reagents used in this study were of molecular grade and obtained from Sigma Aldrich or Fisher Scientific, unless otherwise noted.

*C. thermocellum* strains were grown in either pH controlled bioreactor in MTC-7 media at 55 °C under anaerobic conditions in anaerobic chambers (Coy Laboratory Products, Grass Lakes, MI) with a gas phase of 85% N<sub>2</sub>, 10% CO<sub>2</sub>, and 5% H<sub>2</sub>, as previously described [25] or in MTC-5 media in sealed serum bottles purged with N<sub>2</sub> gas as previously described [24].

Complex medium CTFUD was prepared as previously described [22] and used for culturing cells for use in transformations, or for preparing genomic DNA for strain resequencing. The CTFUD media contained 5 g/L cellobiose, 1.3 g/L (NH<sub>4</sub>)<sub>2</sub>SO<sub>4</sub>, 1.5 g/L KH<sub>2</sub>PO<sub>4</sub>, 0.13 g/L CaCl<sub>2</sub>·2H<sub>2</sub>O, 2.6 g/L MgCl<sub>2</sub>·6H<sub>2</sub>O, 0.001 g/L FeSO<sub>4</sub>·7H<sub>2</sub>O, 4.5 g/L yeast extract, 3 g/L sodium citrate tribasic dihydrate, 0.5 g/L L-cysteine-HCl monohydrate and 0.002 g/L resazurin. Defined MTC-5 medium was used for all other purposes [24].

The MTC-7 medium contained 100 g/L cellobiose, 9.3 g/L MOPS (morpholinepropanesulfonic acid) sodium salt, 2 g/L potassium citrate monohydrate, 1.3 g/L citric acid monohydrate, 1 g/L Na<sub>2</sub>SO<sub>4</sub>, 1 g/L KH<sub>2</sub>PO<sub>4</sub>, 2.5 g/L NaHCO<sub>3</sub>, 2 g/L urea, 1 g/L MgCl<sub>2</sub>·6H<sub>2</sub>O, 0.2 g/L CaCl<sub>2</sub>·2H<sub>2</sub>O, 0.1 g/L FeCl<sub>2</sub>·4H<sub>2</sub>O, 1 g/L L-cysteine HCl monohydrate, 0.02 g/L pyridoxamine HCl, 0.004 g/L p-aminobenzoic acid, 0.002 g/L D-biotin, 0.002 g/L Vitamin B12, 0.004 g/L thiamine, 0.0005 g/L MnCl<sub>2</sub>·4H<sub>2</sub>O, 0.0005 g/L CoCl<sub>2</sub>·6H<sub>2</sub>O, 0.0002 g/L ZnCl<sub>2</sub>, 0.0001 g/L CuCl<sub>2</sub>·2H<sub>2</sub>O, 0.0001 g/L H<sub>3</sub>BO<sub>3</sub>, 0.0001 g/L Na<sub>2</sub>MoO<sub>4</sub>·2H<sub>2</sub>O, 0.0001 g/L NiCl<sub>2</sub>·6H<sub>2</sub>O. The medium components were prepared as separate solutions, A–F. Solution A, concentrated 1.2-fold, contained cellobiose and MOPS sodium salt. Solution B, concentrated

25-fold, contained potassium citrate monohydrate, citric acid monohydrate, Na<sub>2</sub>SO<sub>4</sub>, KH<sub>2</sub>PO<sub>4</sub> and NaHCO<sub>3</sub>. Solution C, concentrated 25-fold, contained urea. Solution D, concentrated 50-fold, contained MgCl<sub>2</sub>·6H<sub>2</sub>O, CaCl<sub>2</sub>·2H<sub>2</sub>O, FeCl<sub>2</sub>·4H<sub>2</sub>O, L-cysteine HCl monohydrate and trace minerals (solution F). Solutions E, concentrated 50-fold, contained pyridoxamine HCl, p-aminobenzoic acid, D-biotin, vitamin B12 and thiamine. Solution F, concentrated 1000×, contained MnCl<sub>2</sub>·4H<sub>2</sub>O, CoCl<sub>2</sub>·6H<sub>2</sub>O, ZnCl<sub>2</sub>, CuCl<sub>2</sub>·2H<sub>2</sub>O, H<sub>3</sub>BO<sub>3</sub>, Na<sub>2</sub>MoO<sub>4</sub>·2H<sub>2</sub>O and NiCl<sub>2</sub>·6H<sub>2</sub>O. MTC-5 medium is MTC-7 without thiamine.

For a 400-mL working volume with pH control in a bioreactor, 300 mL of solution A was prepared without MOPS sodium salt and autoclaved. The bioreactor was left inside the anaerobic chamber for 12 to 16 h for purging with the gas inlet/outlet tube open. Next, 16 mL of solution B, 8 mL of solution C, 8 mL of solution D, and 16 mL of solution E were added through a 0.22-μm filter (catalog no. 430517; Corning), and the final volume was adjusted to 400 mL using autoclaved distilled water stored in a nitrogen atmosphere. The pH was controlled at 7.0 ± 0.05 for using a Mettler–Toledo (Columbus, OH, USA) pH probe with the addition of 4 N KOH. To control for small random variations in media preparation and fermenter setup, biological replicate fermentations were performed on different days.

#### Enzyme assays

All chemicals were ordered from MilliporeSigma unless otherwise specified. All enzyme assays were performed anaerobically unless otherwise mentioned. For enzyme assays, cells were grown to mid-exponential phase (OD<sub>600</sub> between 0.6 and 1.0), harvested and lysed to obtain cell extract as described earlier [24]. Protein concentrations were determined using Bradford assay (Coomassie Plus Reagent, Thermo Scientific), with bovine serum albumin used as a protein standard. All the enzyme assays were performed at 55 °C except for the phosphofructokinase assay, which was performed at 40 °C due to precipitation issues associated with the aldolase coupling enzyme. All enzyme assays were performed in (1.2 - 1.4) ml reaction volume in a diode-array spectrophotometer.

#### Phosphofructokinase (PFK) assay

PFK activity was assayed by measuring the formation of fructose 1,6-bisphosphate coupled with consumption of NADH as previously described [11, 18]. The assay reaction contained 100 mM Tris-HCl (pH 7.0), 5 mM MgCl<sub>2</sub>, 0.15 mM NADH, 1 mM fructose-6-phosphate, 4 U/mL fructose bisphosphate aldolase, 4 U/mL triosephosphate isomerase, 4 U/mL α-glycerophosphate dehydrogenase, cell extract, and 2 mM either PP<sub>i</sub> or ATP.

The assay reaction was started by the addition of the phosphate donor ( $PP_i$  or ATP).

#### **Pyruvate phosphate dikinase (PPDK) assay**

PPDK activity was assayed by measuring the consumption of NADH by coupled assay with lactate dehydrogenase (LDH) as previously described with slight modification [11]. The assay mixture contained 100 mM Tris-HCl (pH 7.0), 5 mM  $MgCl_2$ , 2 mM AMP, 0.15 mM NADH, 20 mM  $NH_4Cl$ , 2 mM PEP, 1 mM fructose-1,6-bisphosphate, 4 U/ml lactate dehydrogenase, cell extract, and 2 mM  $PP_i$ . The assay reaction was started by the addition of  $PP_i$ .

#### **Pyruvate kinase (PYK) assay**

PYK activity was measured by coupled assay with lactate dehydrogenase (LDH) as described earlier with slight modification [11, 16, 26]. The assay buffer contained 100 mM Tris-HCl, pH 7.5 (at 55 °C), 5 mM dithiothreitol (DTT), 10 mM KCl, 12 mM  $MgCl_2$ , 10 mM ADP, 0.3 mM NADH, 0.1 mM 3-phosphoglyceric acid (3PG), 5 mM PEP, 12 U/ml LDH enzyme, and cell extract. This reaction could be started with either ADP or PEP. For this experiment, the assay reaction was started by the addition of ADP.

#### **Soluble pyrophosphatase (PPase) assay**

PPase activity was measured aerobically based on hydrolysis of pyrophosphate ( $PP_i$ ) to inorganic phosphate (Pi) using malachite green assay as defined earlier [27] with some modifications. The assay mixture contained 100 mM Tris-HCl at pH 8.0, 1 mM  $MgCl_2$ , 1 mM sodium pyrophosphate and 2, 4 or 8  $\mu$ l cell extract. This assay mixture was incubated at 55 °C for 2 min and the reaction was stopped by transferring the samples to ice. 2.5  $\mu$ l of this sample was added to 40  $\mu$ l of malachite green reagent (Malachite green:Ammonium molybdate at 3:1) in 96 wells plate. The wells with PPase activity turn green in color. 7.5  $\mu$ l of 34% sodium citrate was added, mixed and incubated at room temperature for 30 min to allow full color development [28]. Phosphate concentration was calculated by measuring absorbance at 660 nm using a calibration curve with phosphate concentration ranging from 0 to 5 mM.

#### **Aldehyde dehydrogenase (ALDH) assay**

ALDH activity was measured anaerobically as described earlier [29]. The assay reaction contained 100 mM Tris-HCl (pH 7.0), 5  $\mu$ M  $FeSO_4$ , 0.25 mM NADH or NADPH, 1.25 mM acetyl-CoA, 1 mM DTT, and cell extract. The assay reaction was started by the addition of acetyl-CoA.

#### **Alcohol dehydrogenase (ADH) assay**

ADH activity was measured anaerobically as described earlier [29]. The assay reaction contained 100 mM Tris-HCl (pH 7.0), 5  $\mu$ M  $FeSO_4$ , 0.25 mM NADH or NADPH, 18 mM acetaldehyde, 1 mM DTT, and cell extract. The assay reaction was started by the addition of acetaldehyde.

#### **$^{13}C$ labeling conditions**

For  $^{13}C$  labeling experiments, *C. thermocellum* cells were grown anaerobically on MTC-5 (medium for thermophilic clostridia) medium consisting of 3 mM naturally labeled cellobiose (Sigma C7252) and 3 mM uniformly labeled  $^{13}C$ -cellobiose (Omicron Biomedicals, CEL-002) as mentioned earlier [18]. 10 mL of this media was inoculated with 10  $\mu$ L freezer stock of LL1590, LL1592 and LL1711 and incubated at 55 °C. The freezer stocks were prepared by growing the cells to mid-exponential phase ( $OD_{600} \sim 0.6$ ) on MTC-5 with 5 g/L naturally labeled cellobiose.

Metabolite samples were extracted at three different phases during growth, i.e., early log phase ( $OD_{600} \sim 0.4$ ), late log phase ( $OD_{600} \sim 0.8$ ) and stationary phase (12 h after maximum OD has reached). The growth was monitored continuously using a custom-built absorbance reader. Intracellular metabolites were collected using vacuum filtration as previously described [12, 25, 30, 31]. For each sample, 2.5 mL of culture medium was filtered through 3.0  $\mu$ m hydrophilic nylon filter (SF14529, Tisch Scientific) to separate cells from medium components. The filter with cells was placed in 1.6 mL of cold extraction solvent (40% acetonitrile, 40% methanol, and 20% water) with the cell side facing down and kept on aluminum block from -80 °C to quench metabolism and extract metabolites. Cells were washed off the filter using extraction solvent and then centrifuged for 5 min to remove cell debris. The supernatant with metabolites was collected, dried using a sample concentrator (catalog no. EW-36620-40; Cole-Parmer) to remove the metabolite extraction buffer and resuspended in molecular-grade water. This metabolite extract was analyzed using LC-MS. Metabolites of interest were detected based on retention time and mass-to-charge ratio, compared with pure standards, using EI-MAVEN software [32].

#### **Quantification of $PP_i$ in cells**

To quantify the concentration of  $PP_i$  in cells, samples were resuspended in molecular-grade water as mentioned earlier (Sect. " $^{13}C$  labeling conditions"). Inorganic pyrophosphate ( $PP_i$ ) was quantified using a combination of two different kits; a  $PP_i$ Light inorganic pyrophosphate assay kit (catalog no. LT07-610; Lonza) which measures the sum of  $PP_i$  and ATP and an ADP/

ATP ratio assay kit (catalog no. MAK135; Sigma-Aldrich) which measures only ATP without cross-reacting with  $PP_i$ . Then,  $PP_i$  in cells was calculated using the first kit, and corrected for the effects of ATP using the second kit using the formula below:

$$PP_i \text{ (mM) per cell} = (PP_i \text{ (mM) in metabolite extract} \times \text{Volume of metabolite extraction buffer}) / \text{Intracellular volume (ml) where,}$$

$$PP_i \text{ (mM) in metabolite extract was calculated by using the kits above as } PP_i \text{ (mM)} = ((ATP + PP_i)_{LT07-610} - ATP_{MAK135}) / 1000,$$

$$\text{and Intracellular volume} = \text{cell volume} \times \text{cell number} \text{ [25].}$$

### pH-controlled bioreactor fermentation conditions and metabolites extraction

*C. thermocellum* cultures were grown anaerobically at 55 °C in a Coy (Ann Arbor, MI) anaerobic chamber with a gas phase of 85%  $N_2$ , 10%  $CO_2$ , and 5%  $H_2$ . Fermentations were carried out in a 400 mL working volume in MTC-7 medium with 100 g/L cellobiose as substrate and pH controlled at 7.0, as mentioned earlier (sect. Media and Growth Conditions).

The extracellular metabolites/fermentation products (ethanol, lactate, formate, acetate, pyruvate) at different timepoints during the fermentation were quantified by HPLC (Waters, Milford, MA or LC-2030, Shimadzu) with refractive index (RI) and UV detection using an Aminex HPX-87H column (Bio-Rad, Hercules, CA) with a 5 mM sulfuric acid solution eluent at 0.6 mL/minute flow rate and column temperature of 60 °C [33].

To quantify intracellular/glycolysis metabolites, samples were taken at the same timepoints as HPLC. Samples were prepared using a protocol we previously developed for metabolite quantification from high-substrate fermentations [25]. Briefly, samples were extracted using vacuum filtration followed by quenching. For each sample (0.5–8) mL of culture medium was filtered through 3.0  $\mu\text{m}$  hydrophilic nylon filter based on  $OD_{600}$  of cells. The samples were then quenched, dried, resuspended in molecular grade water and analyzed using LC–MS.

### Liquid chromatography–mass spectrometry (LC–MS) analysis

A Vanquish ultra-high-performance liquid chromatography (UHPLC) system (Thermo Scientific) coupled to a hybrid quadrupole-Orbitrap<sup>™</sup> mass spectrometer (Q Exactive<sup>™</sup>; Thermo Scientific) equipped with electrospray ionization operating in negative-ion mode as defined earlier [12] was used for LCMS analysis. The chromatography was performed at 25 °C using a 2.1  $\times$  100 mm reverse-phase C18 column with a

1.7  $\mu\text{m}$  particle size (Water<sup>™</sup>; Acquity UHPLC BEH). Two chromatography gradients were used. The first used Solvent A (97:3  $H_2O$ : methanol + 10 mM tributylamine) and Solvent B (100% methanol) as follows: 0–2.5 min, 5% B; 2.5–17 min, linear gradient from 5% B to 95% B; 17–19.5 min, 95% B; 19.5–20 min, linear gradient from 95% B to 5% B; 20–25 min, 5% B. The second also used Solvent A and Solvent B (100% methanol) and was as follows: 0–2.5 min, 5% B; 2.5–7.5 min, linear gradient from 5% B to 20% B; 7.5–13 min, 20% B to 55% B; 13–18.5 min, 55% B to 95% B; 18.5–19 min linear gradient from 95% B to 5% B; 19–25 min, 5% B. The flow rate was held constant at 0.2 mL/min for both chromatograph methods. Metabolites of interest were identified by retention times (based on pure standards) and monoisotopic mass using MAVEN [34] and El-MAVEN [32] software.

### Sequencing methods

Routine Sanger sequencing was outsourced to Azenta Life Sciences. Whole genome resequencing was performed by the Department of Energy Joint Genome Institute using the Illumina MiSeq sequencing platform, with a minimum of 100-fold coverage. Strains were analyzed with the software CLC Genomics Workbench (Qiagen) using strain DSM1313 as the reference genome (Genbank accession NC\_017304.1); reads were filtered against strain LL1649 (accession number SRP222669) [18] to exclude inherited mutations. A summary of the identified mutations is provided in Additional File 4.

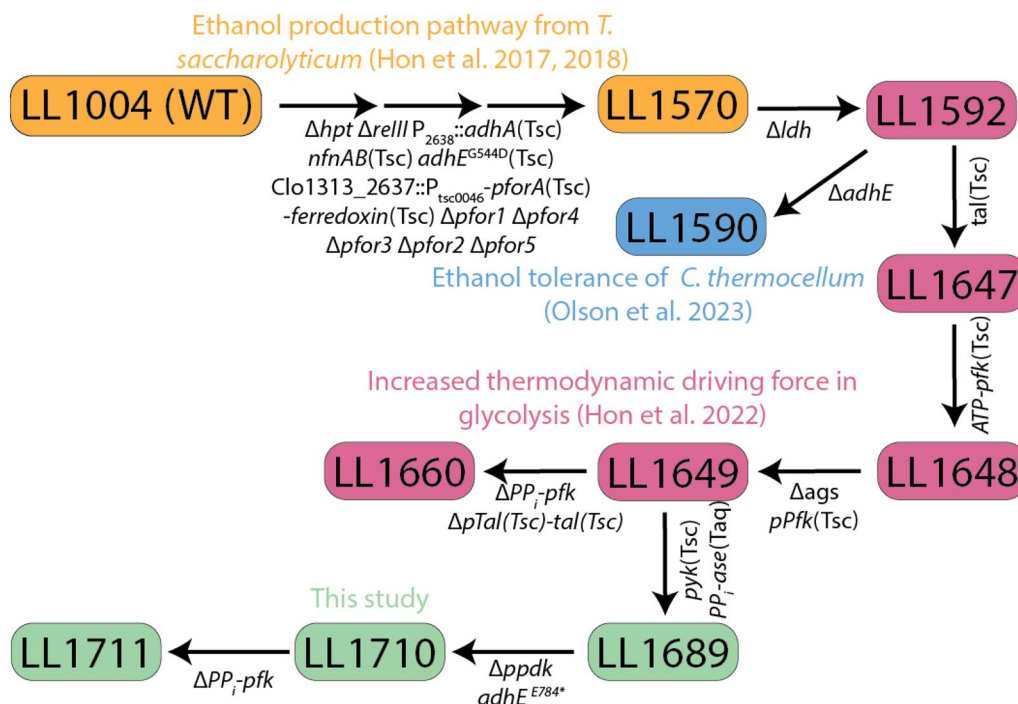
### Statistical analysis

Statistical analyses were conducted using *t* tests to assess significant differences, with a threshold set at  $p=0.05$ . A paired *t*-test was used to compare PPase enzyme activities between strains with and without PPase. A one-sided *t*-test was used to determine whether  $PP_i$  metabolite levels were lower in strains expressing PPase. Specifically,  $PP_i$  levels in the  $PP_i$ -free glycolysis strain (LL1711) were compared to those in the wild-type glycolysis strains (LL1590 and LL1592), with significance set at  $p=0.05$ .

## Results

### Strain construction to eliminate and replace $PP_i$ -dependent glycolytic reactions

In our previous work, we created strain LL1660 (Fig. 1), where the  $PP_i$ -*pfk* gene was replaced with an ATP-*pfk* gene [18], eliminating a major sink for  $PP_i$ . We also observed the spontaneous occurrence of a large partial genome duplication. This partial genome duplication region encodes proteins that may serve as



**Fig. 1** Strain lineage diagram showing the sequence of genetic modifications for strains presented in this work and relevant prior work. Strains shown in blue, orange and pink colors correspond to previous metabolic engineering work in our group. The green color represents the strains that were created in this study. Genetic modification between the strains are mentioned below specific arrows. Multiple arrows indicate multiple genetic modifications between different strains. The complete genotype of strains used in this work are presented in Table 1

**Table 1** Strains used in this work are described below

Organism	Strain ID	Description	Accession Number	References
<i>C. thermocellum</i>	LL1592	DSM 1313 $\Delta hpt$ , $\Delta ldh$ , $\Delta rellI$ , P2638:: <i>adhA</i> (Tsc), <i>nfnAB</i> (Tsc), <i>adhEG544D</i> (Tsc), <i>Clo1313_2637::P<sub>tsc0046</sub>-pforA</i> (Tsc)-ferredoxin(Tsc), $\Delta pfor1$ , $\Delta pfor2$ , $\Delta pfor3$ , $\Delta pfor4$ , $\Delta pfor5$	SRX5290154	[18]
<i>C. thermocellum</i>	LL1590	LL1592 $\Delta adhE$	SRX5290158	[19]
<i>C. thermocellum</i>	LL1649	LL1592 <i>tal</i> (Tsc), <i>ATP-pfk</i> (Tsc), $\Delta ags$ , <i>pPfk</i> (Tsc)	SRX6875980	[18]
<i>C. thermocellum</i>	LL1689	LL1649 <i>pyk</i> (Tsc), <i>PPase</i> (Taq)	SRX7724531	This study
<i>C. thermocellum</i>	LL1710	LL1689 $\Delta ppdk$ , <i>adhE</i> E784*	SRX9409012	This study
<i>C. thermocellum</i>	LL1711	LL1710 $\Delta PP_i$ - <i>pfk</i>	SRX9409011	This study

Tsc and Taq refers to genes introduced from *T. saccharolyticum* and *T. aquaticus*, respectively.

alternative sinks for  $PP_i$ , including a membrane-bound pyrophosphatase gene (*hpaA-Clo1313\_0823*) and pyruvate:phosphate dikinase gene (*ppdk-Clo1313\_0949*).

We, therefore, hypothesized that the partial genome duplication event might have occurred to address an imbalance in the supply and demand of  $PP_i$  created by the mutations in strain LL1660. To address this potential problem, we set out to construct a new strain where  $PP_i$ -consuming reactions in glycolysis were eliminated, and where the excess  $PP_i$  generated by metabolism was hydrolyzed using a soluble PPase [27]. Initially, we

attempted to express soluble PPase in wild-type *C. thermocellum*, but we did not get any colonies in at least two transformations. This was not surprising, given our prior work showing the importance of  $PP_i$  as a cofactor for the PFK reaction in glycolysis [11, 16].

Next, we tried to express the soluble PPase in a strain with ATP-linked PFK activity (strain LL1649), which we hypothesized would be more compatible with the metabolic effects of the PPase. In this strain, we occasionally obtained a small number of colonies with our PPase expression plasmid. However, in those

colonies, the PPase gene was invariably inactivated either by a transposon insertion or inactivating nonsense mutation. In this phase, we tested PPases from *Geobacillus stearothermophilus*, *Geobacillus thermoglucosidasius*, *Thermoplasma acidophilum*, *Thermus aquaticus*, and *Thermus thermophilus* (plasmids pLL1501 to pLL1505, Table 2). Out of these, only PPase from *Geobacillus thermoglucosidasius* and *Thermus aquaticus* showed PPase activity (data not shown).

We further hypothesized that in addition to eliminating the need for  $PP_i$  in the PFK reaction, we also needed to eliminate the need for  $PP_i$  in the PPDK reaction (which converts PEP to pyruvate) [16, 35]. To do this, we designed an integration construct to simultaneously introduce pyruvate kinase and a soluble PPase onto the chromosome, in this case using the PPases from *G. thermoglucosidasius* and *T. aquaticus*, since we had in some instances observed PPase activity from cell extracts of *C. thermocellum* that expressed those PPases [27]. Successful strain construction was obtained only with the *T. aquaticus* PPase containing construct, pLL1507 (Table 2), which was validated by the gain of both pyruvate kinase and cytosolic PPase activity (Fig. 2). Our ability to observe functional PPase expression only in strains with both ATP-PFK and PYK activity provides further evidence of progress toward eliminating  $PP_i$  as a key energy carrying cofactor in *C. thermocellum*.

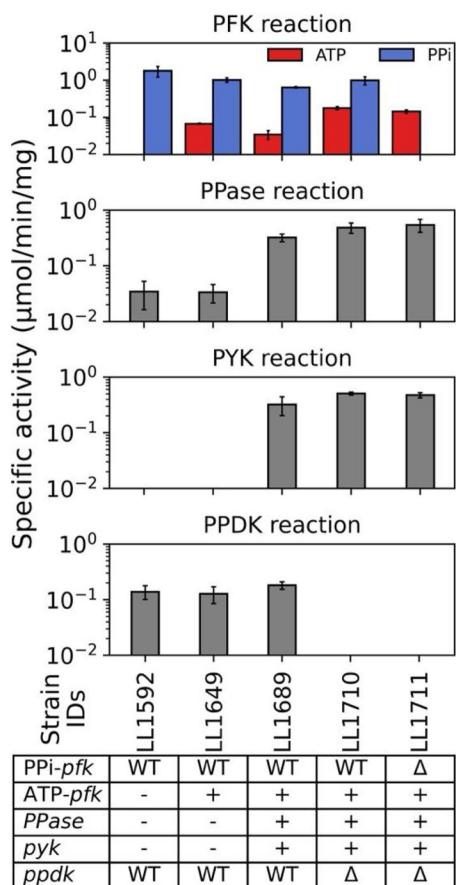
Strain LL1592, which uses the native *C. thermocellum* glycolytic pathway, with the *T. saccharolyticum* pyruvate-to-ethanol pathway [18] was selected as starting strain for further engineering. Strain LL1649 was derived

from strain LL1592, by introduction of the *T. saccharolyticum* transaldolase, followed by simultaneous deletion of the ADP-glucose synthase operon and expression of *T. saccharolyticum* ATP-*pfk*. Strain LL1689 was derived from strain LL1649 by the simultaneous integration of the *T. saccharolyticum* pyruvate kinase and the cytosolic pyrophosphatase from *Thermus aquaticus*. The purpose of introducing a heterologous pyruvate kinase was to allow subsequent deletion of the *ppdk* gene. The purpose of introducing a soluble PPase was to serve as an alternative sink for  $PP_i$ , once both the *PP\_i-pfk* and *ppdk* genes were deleted. With these modification in place, we were then able to successfully delete glycolytic sinks for  $PP_i$ , including the *ppdk* gene (resulting in strain LL1710), and then, subsequently, the *PP\_i-pfk* gene (resulting in strain LL1711) (Fig. 1).

Biochemical assays were performed to confirm the effect of the genetic modifications of the strains used in this study. As expected, strain LL1592 has exclusively  $PP_i$ -PFK activity. Strains LL1649, LL1689, and LL1710 have both ATP- and  $PP_i$ -linked PFK activity, as expected (PFK reaction, Fig. 2). Finally, strain LL1711 has exclusively ATP-PFK activity as expected. Functional expression of the *pyk* gene was confirmed by the presence of PYK activity in strains LL1689, LL1710 and LL1711 (PYK reaction, Fig. 2). The effect of the *ppdk* gene deletion was confirmed in strains LL1710 and LL1711 based on elimination of PPDK activity (PPDK reaction, Fig. 2). Low levels of PPase activity were still detected in strains LL1592 and LL1649; this could be attributed to the native membrane bound PPase enzyme being present

**Table 2** Plasmids used in this study

Plasmid	Description	Accession no	References
pDGO143	<i>C. thermocellum</i> expression vector	KX259110	[23]
pDGO145	Deletion/Integration vector backbone	KY852359	[24]
pMU2051	Plasmid for deletion of <i>ppdk</i> gene	KC146550	[11]
pLL1392	Deletion vector; deletes <i>C. thermocellum</i> <i>PP_i-pfk</i> only in strain LL1647 and its derivatives	ON809513	[18]
pLL1498	pDGO143 with <i>C. thermocellum</i> Clo 1313_2638 promoter driving <i>T. saccharolyticum</i> ATP- <i>pfk</i> and <i>T. aquaticus</i> PPase	PP855251	This work
pLL1499	pDGO143 with <i>C. thermocellum</i> Clo 1313_2638 promoter driving <i>T. aquaticus</i> PPase	PP855252	This work
pLL1500	pDGO143 with <i>C. thermocellum</i> Clo 1313_2638 promoter driving <i>Geobacillus stearothermophilus</i> PPase	PP855253	This work
pLL1501	pDGO143 with <i>T. saccharolyticum</i> enolase promoter driving <i>Geobacillus stearothermophilus</i> PPase	PP855254	This work
pLL1502	pDGO143 with <i>T. saccharolyticum</i> enolase promoter driving <i>Geobacillus thermoglucosidasius</i> PPase	PP855255	This work
pLL1503	pDGO143 with <i>T. saccharolyticum</i> enolase promoter driving <i>T. acidophilum</i> PPase	PP855256	This work
pLL1504	pDGO143 with <i>T. saccharolyticum</i> enolase promoter driving <i>T. aquaticus</i> PPase	PP855257	This work
pLL1505	pDGO143 with <i>T. saccharolyticum</i> enolase promoter driving <i>T. thermophilus</i> PPase	PP855258	This work
pLL1506	pDGO145 with <i>T. saccharolyticum</i> <i>pyk</i> and <i>G. thermoglucosidasius</i> cytosolic PPase driven by <i>T. saccharolyticum</i> enolase promoter	PP855259	This work
pLL1507	pDGO145 with <i>T. saccharolyticum</i> <i>pyk</i> and <i>T. aquaticus</i> cytosolic PPase driven by <i>T. saccharolyticum</i> enolase promoter	PP855260	This work



**Fig. 2** Enzyme activity of *C. thermocellum* strains for reactions related to PP<sub>i</sub>-linked reactions. These reactions include phosphofruktokinase (PFK, EC 2.7.1.11 or 2.7.1.90), pyruvate phosphate dikinase (PPDK, EC 2.7.9.1), pyruvate kinase (PYK, EC 2.7.1.40) and thermostable soluble PPase (EC 3.6.1.1). In the PFK reaction panel, red bars and blue bars represent activity with either ATP or PP<sub>i</sub> as the cofactor. In the table at the bottom of the figure, the '+' and '-' signs indicate the presence or absence of heterologous genes at a given locus. The 'WT' and 'Δ' signs indicate the presence or absence (i.e., by deletion) of native genes. All the reactions were carried out using cell extracts. Missing bars indicate the absence of activity (i.e., below the limit of detection, <0.02 μmol/min/mg). Error bars represent 1 standard deviation ( $n \geq 3$  biological replicates). Raw enzyme assay data is available as Additional File 1

in the cell extracts. Previous studies have reported the presence of membrane-bound pyrophosphatase in *C. thermocellum* cells [27]. Nonetheless, strains LL1689, LL1710, and LL1711 exhibited PPase activities that were approximately 13-fold higher on average (paired t-test,  $p=0.0003$ ) than those of strains LL1592 and LL1649, which lack soluble PPase. We attribute this increase to the expression of a soluble PPase in the former strains. As such, it was determined that strain LL1711 had been engineered to not require PP<sub>i</sub> as a cofactor in glycolysis,

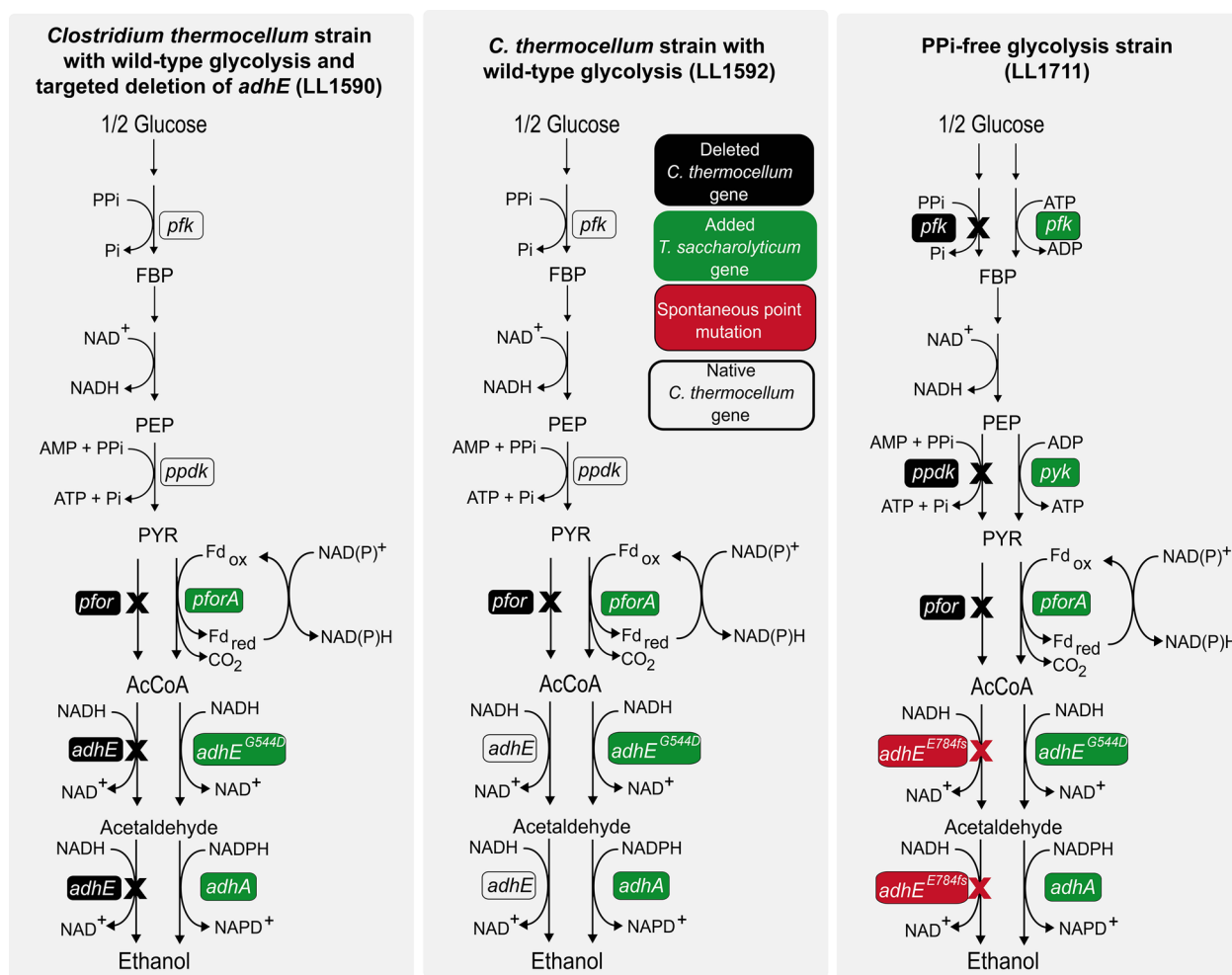
and that it now possessed a more-canonical glycolytic pathway [12].

#### Use of ATP-dependent pathway alters thermodynamics of glycolysis

To determine the effect the genetic modifications had on the reversibility of the PFK reaction, we performed <sup>13</sup>C labeling on *C. thermocellum* strains LL1590, LL1592 and LL1711. Initially, we were planning to compare only the parent strain (LL1592) and the PP<sub>i</sub>-free glycolysis strain (LL1711); however, whole genome sequencing of strain LL1711 revealed a frameshift mutation in the wild-type *C. thermocellum adhE* gene corresponding to amino acid position E784 that eliminated its function (Figure S1). We, therefore, included another control strain (LL1590) derived from the parent strain (LL1592) with a targeted deletion of the wild-type *C. thermocellum adhE* gene [19], to better understand the effects of our changes to the glycolytic pathway without the confounding effects of the modification to ethanol production pathway. Note that all three strains (LL1590, LL1592, and LL1711) still produce ethanol via the heterologous *T. saccharolyticum adhE<sup>G544D</sup>* (Figs. 1, 3).

*C. thermocellum* does not readily consume glucose [37], and thus cellobiose is the most commonly used soluble sugar for laboratory growth experiments. Strains were cultured on a 1:1 ratio of naturally labeled to uniformly <sup>13</sup>C-labeled cellobiose. We confirmed that <sup>13</sup>C cellobiose and naturally labeled cellobiose are taken up equally by measuring the ratio of M+0 to M+6 isotopomers for glucose 6-phosphate, which ranged from 0.8 to 1.2, and is close to the expected value of 1.0 (Additional File 2). Samples were collected at three different phases (early log, late-log and stationary) during growth (Figure S2). As previously described [12], the forward glycolysis reaction should generate a 1:1 mixture of fully labeled (M+6) and fully unlabeled (M+0) glucose-6-phosphate (G6P), fructose-6-phosphate (F6P) and fructose-1,6-bisphosphate (FBP). The forward flux of fructose-bisphosphate aldolase reaction (FBA) will generate 50% unlabeled (M+0) and 50% fully labeled (M+3) dihydroxyacetone phosphate (DHAP) and glyceraldehyde-3-phosphate (G3P). However, the reverse FBA reaction flux generates a 1:2:1 mixture of M+0, M+3 and M+6 FBP. The reverse flux from phosphofruktokinase (PFK) and phosphoglycerate isomerase (PGI) reactions transfer these M+3 species into the F6P and G6P pools. Appearance of the M+3 isotopomer in the F6P and G6P pools allows us to uniquely identify reverse flux through the PFK reaction. If the PFK reaction were completely irreversible, we would expect to see no M+3 species in either the F6P or G6P pools.

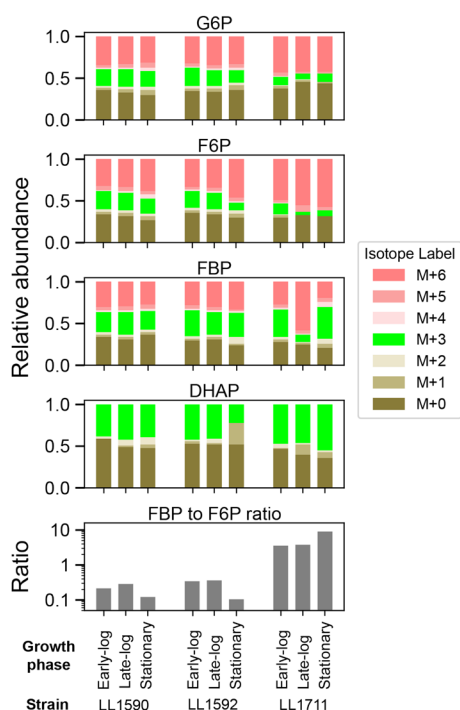




**Fig. 3** Graphical representation of *C. thermocellum* strains used for fermentation and metabolite analysis. White boxes represent native *C. thermocellum* genes, black boxes represent knocked out genes, green boxes represent heterologously expressed *T. saccharolyticum* genes and red boxes indicate spontaneous mutation present in strain LL1711. X sign represents inactivated reactions. Strain LL1592 is the parent strain. Strain LL1590 is a control for loss of wild-type *C. thermocellum* AdhE activity (note that strain LL1590 is descended from strain LL1592 despite what might be assumed from the strain ID number, see Fig. 1). Strain LL1711 is the PP<sub>i</sub>-free glycolysis strain. Strain LL1590 (LL1592 with a targeted deletion of *C. thermocellum* *adhE*) is included to control for the effects of inactivation of the native *adhE* gene, to allow the effects of the changes to glycolysis to be seen more clearly. In strains LL1590 and LL1711, the only functional *adhE* gene is the one heterologously expressed from *T. saccharolyticum*. Key: fructose 1,6-bisphosphate (FBP); phosphoenolpyruvate (PEP); pyruvate (PYR); acetyl-CoA (AcCoA); phosphofructokinase (*pfk*); pyruvate phosphate dikinase (*ppdk*); pyruvate kinase (*pyk*); pyruvate ferredoxin/ferredoxin oxidoreductase (*pfor*); alcohol dehydrogenase (*adh*). Figure adapted from [36]

As expected, based on our prior work [18], we observed that the M+3 pool in the glycolytic intermediates G6P and F6P decreased substantially in the PP<sub>i</sub>-free glycolysis strain (LL1711) vs. the parent and control strains (LL1590 and LL1592), indicating that the genetic modifications introduced into LL1711 reduced the reversibility of the PFK reaction (G6P, F6P; Fig. 4). We saw an unexpected decrease in the M+3 fraction of FBP in mid-log phase in the PP<sub>i</sub>-free glycolysis strain (LL1711) (Figs. 4, S3). This suggests reduced reversibility of FBA reaction, although the reason for this change is not known.

In addition to comparing the isotope ratios, we also compared the ratio of the FBP and F6P metabolite pool sizes. This gives us an additional indication of the thermodynamic driving force of the reaction. A high thermodynamic driving force at the PFK reaction would be expected to give a high FBP/F6P ratio. Comparisons of FBP/F6P ratio showed a lower ratio for the parent and control strains that use the PP<sub>i</sub>-PFK reaction (LL1590 and LL1592) and a much higher ratio for the PP<sub>i</sub>-free glycolysis strain (LL1711), which uses the ATP-PFK reaction (Fig. 4). This ratio is 10-fold and 98-fold higher on average in ATP-*pfk* strain compared to PP<sub>i</sub>-*pfk* strains during



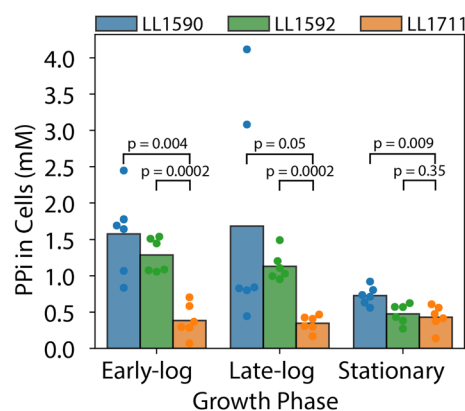
**Fig. 4**  $^{13}\text{C}$ -labeling patterns of key glycolysis metabolites near the PFK reaction. The metabolites glucose-6-phosphate (G6P), fructose-6-phosphate (F6P), fructose 1,6-bisphosphate (FBP) and dihydroxyacetone phosphate (DHAP) were measured at different stages of growth for cells grown with a 50:50 mixture of uniformly labeled and naturally labeled cellobiose. 'M+' notation indicates the number of  $^{13}\text{C}$ -labeled carbon atoms. One set of representative data is shown for each strain ( $n=2$  biological replicates). Strain LL1592 is the parent strain, strain LL1590 is a control for loss of wild-type *C. thermocellum* AdhE activity, strain LL1711 is the  $\text{PP}_i$ -free glycolysis strain. The ratio represents the ratio of absolute abundance of FBP to F6P. Figure S3 shows a comparison between biological duplicates of this experiment. Raw data used for the analysis is available as Additional File 2

log phases and stationary phases, respectively. The higher FBP/F6P ratio is similar to what is observed in organisms with canonical glycolytic pathways, such as *E. coli* and *T. saccharolyticum* [12, 38]. Taken together, these two lines of evidence (M+3 abundance changes and FBP/F6P ratio changes) support the conclusion that we have increased the thermodynamic driving force of the PFK reaction in our  $\text{PP}_i$ -free glycolysis strain.

#### Expression of PPase results in lower $\text{PP}_i$ levels

To determine the effect of PPase expression in  $\text{PP}_i$  levels of *C. thermocellum* strains with wild-type glycolysis (strains LL1590 and LL1592) and  $\text{PP}_i$ -free glycolysis (strain LL1711), we quantified the concentration of  $\text{PP}_i$  in cells.

We observed a significant decrease in  $\text{PP}_i$  concentration in the  $\text{PP}_i$ -free glycolysis strain (strain LL1711) (Fig. 5)



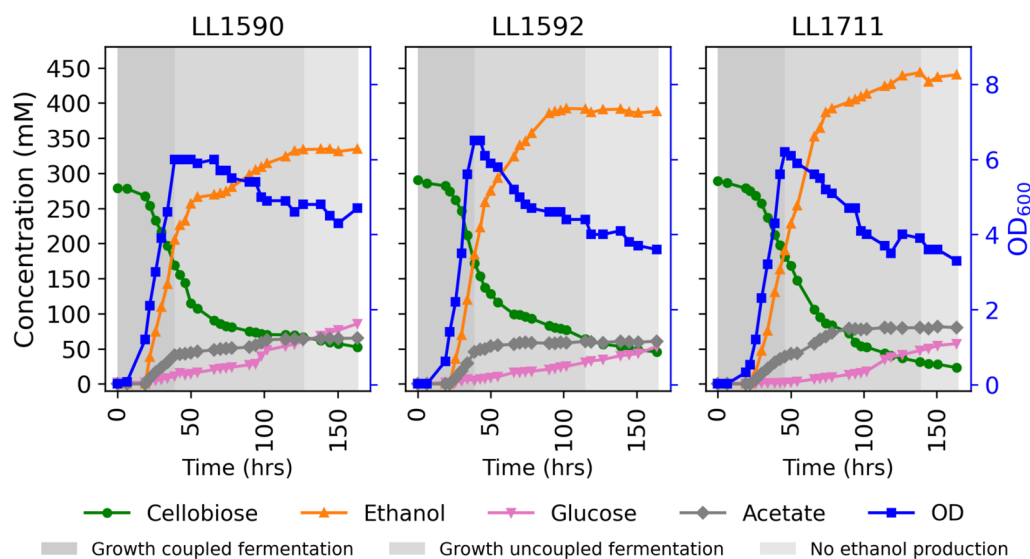
**Fig. 5**  $\text{PP}_i$  concentration in *C. thermocellum* strains without PPase expression (strain LL1590 and strain LL1592) and with PPase expression (strain LL1711). The bar plot represents average values. The colored circles represent individual data points.  $\text{PP}_i$  levels were measured in cell extracts and the intracellular concentration was calculated as described in the materials and methods section. p-values were calculated using one-sided paired t-test statistics. ( $n=6$ ; 3 biological replicates, 2 technical replicates)

during the early log and late-log growth phases. During the stationary phase, the difference between strain LL1592 and strain LL1711 was not as significant, which might be due to the depletion of the  $\text{PP}_i$  pool during this phase of growth. We see consistently higher levels of  $\text{PP}_i$  during the early log and late-log phases in strains LL1590 and LL1592, which then drop during the stationary phase in both strains.

#### Increased driving force leads to higher level of fermentation products in ATP-*pfk* strain

Having demonstrated increased thermodynamic driving force in glycolysis in the  $\text{PP}_i$ -free glycolysis strain, we explored its impact on fermentation behavior and ethanol production using batch fermentations of all three strains with high substrate concentrations (100 g/L cellobiose). We optimized fermentation conditions to get repeatable results using strain LL1592 (Supplementary Figure S4), and used those conditions for all three strains. The fermentations had three distinct phases: (1) growth coupled fermentation, where both the cell growth and ethanol production are at the highest rate, (2) growth uncoupled fermentation, where cell growth stops and the rate of ethanol production decreases, and (3) cessation of both growth and ethanol production. During this final phase, cellobiose is hydrolyzed to glucose at a slow rate, but metabolism appears to be inactive.

The final ethanol titer was  $329 \pm 8$  mM ( $15.1 \pm 0.4$  g/L) for strain LL1590,  $403 \pm 11$  mM ( $18.6 \pm 0.5$  g/L) for strain LL1592, and  $455 \pm 12$  mM ( $21.0 \pm 0.6$  g/L) for strain LL1711. Titer of another fermentation product, acetate,



**Fig. 6** Batch fermentations of *C. thermocellum* strains with wild-type glycolysis (strains LL1590 and LL1592) and  $PP_i$ -free glycolysis (strain LL1711). Fermentations were performed with 100 g/L cellobiose in MTC-7 chemically defined medium with pH maintained at  $7.0 \pm 0.05$  by addition of 4 M potassium hydroxide. The shaded background represents different phases of fermentation: dark gray, growth coupled fermentation; medium gray, growth uncoupled fermentation; and light gray, no ethanol production phases. One representative fermentation profile is shown for each strain ( $n \geq 2$ ). Figure S5 shows a biological duplicate of this experiment. Additional File 3 (LL1590-1, LL1592-1, and LL1711-1) shows additional fermentation product data for this experiment.

was  $65 \pm 0$  mM ( $3.8 \pm 0$  g/L) for strain LL1590,  $51 \pm 9$  mM ( $3.0 \pm 0.5$  g/L) for strain LL1592 and  $88 \pm 7$  ( $5.2 \pm 0.4$  g/L) for strain LL1711. (Figs. 6, S5, Additional File 3). Comparison of the fermentation products between LL1592 and LL1590 suggests that deletion of *C. thermocellum adhE* impairs the production of ethanol. Taking the effect of the native *adhE* inactivation into account (i.e., comparing LL1711 to LL1590), allows us to observe the effect of  $PP_i$ -free glycolysis on ethanol production without the confounding effects of changes in the ethanol production pathway. In this comparison (LL1711 vs. LL1590), we observe a 38% increase in ethanol titer, and a 35.4% increase in acetate titer. Together, these suggest that our  $PP_i$ -free glycolysis strain exhibits increased glycolytic flux, resulting in an increased abundance of acetyl-CoA, which is then converted to more ethanol and acetate.

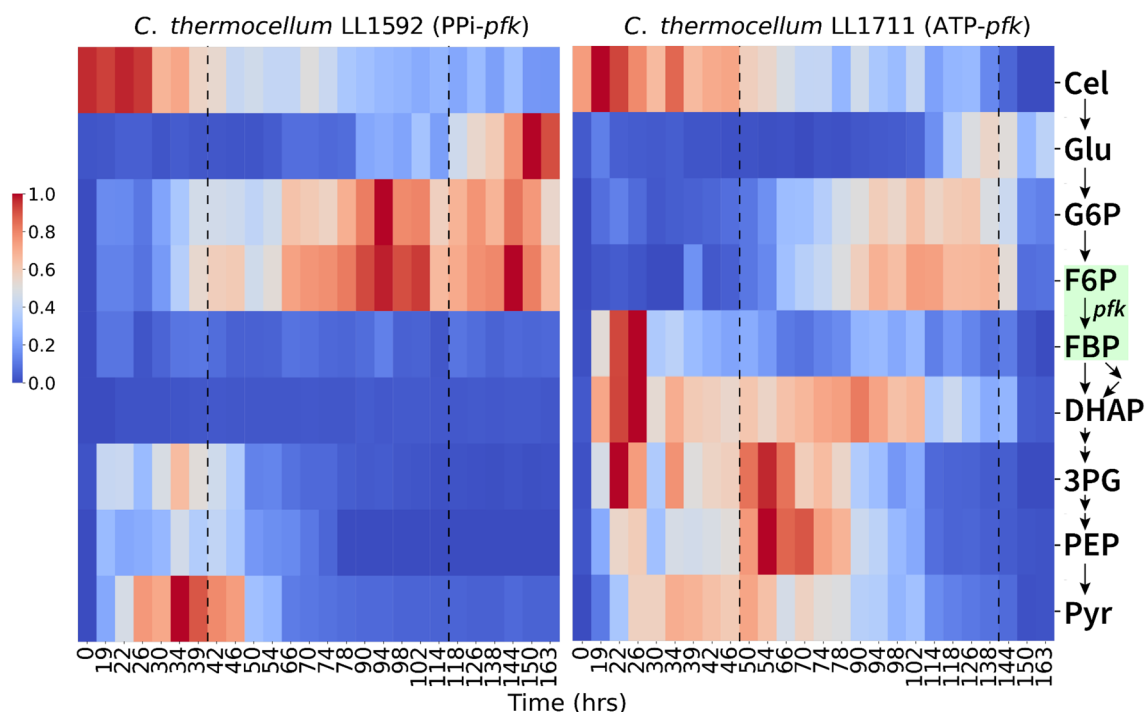
#### Changes in glycolysis metabolite levels at elevated substrate concentrations in pH-controlled fermentations

To better understand the changes in central metabolism that allowed for increased ethanol titer in the  $PP_i$ -free glycolysis strain, we measured intracellular glycolytic metabolites over the course of the fermentation using the same fermentation conditions from Fig. 6 (100 g/L cellobiose, pH-controlled batch fermentations). Since preliminary data showed similar pattern of glycolytic metabolites (Figure S6) and  $^{13}C$  labeling patterns were

similar for both the  $PP_i$ -*pfk* strains (Fig. 4, S3), and strain LL1590 produced lower levels of ethanol than strain LL1592 (Fig. 6, S5), we compared glycolytic metabolite levels in strains LL1592 and LL1711.

In *C. thermocellum*, cellobiose is transported into cells via an ATP-binding cassette (ABC) transport system [11, 39, 40]. Once inside, cellobiose is cleaved into glucose and glucose 1-phosphate (G1P) by the enzyme cellobiose phosphorylase (EC 2.4.1.20). G1P and glucose are then converted to glucose 6-phosphate (G6P) through the actions of phosphoglucomutase (EC 5.4.2.2) and GTP-linked glucokinase (EC 2.7.1.2), respectively. G6P subsequently enters the Embden–Meyerhof–Parnas (EMP) glycolysis pathway, as previously described [11].

Three major changes were observed in the glycolytic metabolite profiles between these two strains. First, in the parent strain (LL1592, with wild-type glycolysis) we see gradual accumulation of hexose phosphates (G6P, F6P) as the fermentation progresses. In the  $PP_i$ -free glycolysis strain (LL1711), hexose phosphates were still observed to accumulate, but to a lesser extent as the fermentation progressed. Second, during the growth-uncoupled fermentation phase, we observed a dramatic increase in the levels of lower glycolysis metabolites (DHAP, 3PG, and PEP) in the  $PP_i$ -free glycolysis strain. Finally, in the phase where fermentation and ethanol production stop, the parent strain shows a large accumulation of upper glycolysis metabolites (glucose, G6P, and F6P), while the



**Fig. 7** Abundance of glycolytic metabolites in *C. thermocellum* strains LL1592 and LL1711 during the course of fermentation. The dotted lines differentiate different growth phases (from left to right, growth coupled fermentation, growth uncoupled fermentation and no ethanol production, respectively). Absolute metabolite concentrations were determined by using external standards. Metabolite concentrations were normalized (per metabolite) from 0 to 1, with 0 being the least and 1 being the highest concentration measured. The green box shows the location of the PFK reaction in glycolysis. Figure S7 shows a biological duplicate of this experiment. Additional File 6 shows absolute intracellular metabolite concentrations. Cel cellobiose, Glu glucose, G6P glucose 6-phosphate, F6P fructose 6-phosphate, FBP fructose 1,6-bisphosphate, DHAP dihydroxyacetone phosphate, 3PG 3-phosphoglycerate, PEP phosphoenolpyruvate, Pyr pyruvate

PP<sub>i</sub>-free glycolysis strain shows low levels of almost all metabolites (Figs. 7, S7).

These intracellular metabolites data over the course of fermentation also underscores the importance of conducting metabolomics studies throughout the fermentation process. Most previous metabolomics studies in *C. thermocellum* and other microbes have focused on metabolite levels at a single-timepoint, typically during the mid-exponential growth phase [12, 38, 41]. However, analyzing metabolites at multiple timepoints during fermentation reveals important dynamic changes in the metabolite pools.

## Discussion

We have successfully engineered a strain of *C. thermocellum* where PP<sub>i</sub> no longer plays a role in central metabolism, which increased the thermodynamic driving force in glycolysis. In our previous work, where we replaced the PP<sub>i</sub>-PFK reaction with an ATP-PFK reaction without engineering other aspects of PP<sub>i</sub> metabolism [18], we observed an increased thermodynamic driving force at the PFK reaction, and an increased FBP/F6P ratio, but this metabolic

perturbation appeared to be confined to a localized region around the PFK reaction. For example, the FBP level increased, but the downstream metabolites (DHAP, 3PG, or PEP) did not. In this work, by contrast, the levels of these downstream metabolites do increase. There are several possible explanations for this difference. One is that changes in PP<sub>i</sub> levels resulting from expression of a soluble PPase affect glycolytic flux. It is known that PP<sub>i</sub> concentrations allosterically regulate enzymes in the malate shunt [42], and it is possible that PP<sub>i</sub> concentrations regulate other enzymes in central metabolism as well. Another possible explanation is that we previously measured intracellular metabolite concentrations in bottle fermentations where pH was only controlled by MOPS buffer, whereas in this work, the pH was actively controlled. Changes in pH may have limited the effects of the ATP-PFK reaction in those experiments. Finally, a third possible explanation is that the previously observed localization of the effect of ATP-PFK was a temporal effect, since our prior work only measured intracellular metabolites at a single timepoint in mid-log phase. Among these three possibilities, we have no evidence to distinguish

between the first two. We can, however, tentatively reject the third one. In the  $PP_i$ -free glycolysis strain (LL1711), the increased abundance of downstream metabolites (DHAP, 3PG, and PEP) is observed in both mid-log and early stationary phases (approximately 22–78 h). Comparing any of the points in this range with our prior results shows a clear difference with the much lower levels of these metabolites observed in mid-log phase with our previously developed ATP–PFK strain (LL1660) [18].

In our  $PP_i$ -free glycolysis strain (strain LL1711), whole genome sequencing revealed a frameshift mutation (E784) in *C. thermocellum adhE* that eliminated its function. We have routinely observed mutations in *adhE* in strains that either have higher ethanol production or tolerance [19, 43, 44]. Previous studies have shown that inactivating mutations in *adhE* that eliminated NADH-linked alcohol dehydrogenase (ADH) activity increase ethanol tolerance in *C. thermocellum* [43, 45]. We believe that this is an adaptive response by the strain to avoid a thermodynamic limitation that can result from glyceraldehyde 3-phosphate dehydrogenase (GAPDH) and ADH reactions using the same cofactor (i.e., NADH) [19, 44, 45].

Although the  $PP_i$ -free glycolysis strain produced 455 mM (21.0 g/L) ethanol, it is likely that titers of 40–50 g/L are needed for commercial application [1]. Nonetheless this work represents another step along the path toward converting the atypical glycolysis of *C. thermocellum* to the canonical glycolysis [11, 12]. In our previous work, we replaced the  $PP_i$ -linked PFK reaction with an ATP-linked PFK reaction [18]. In this work, we needed to recreate this modification due to the presence of a spontaneous partial genome duplication event in our prior strain, and additionally introduce a deletion of the *ppdk* gene and heterologous expression of a soluble *PPase* gene. The expression of a soluble *PPase* appears to be the enabling factor for engineering  $PP_i$ -free glycolysis [27]. Subsequent steps along this path may include eliminating the malate shunt [16], and understanding the role of GTP vs. ATP in the glucokinase and phosphoglycerate kinase reactions [11].

## Conclusions

In the field of Metabolic Engineering, strategies for improving product yield are relatively well developed compared to strategies for improving product titer. Engineering the thermodynamic landscape of a metabolic pathway provides an interesting approach to address product titer limitations. Although there is extensive prior literature on analysis of the thermodynamic landscape of metabolic pathways [12, 15, 17, 46], there

have been far fewer attempts to apply this knowledge for targeted improvement of these pathways. Several prior studies have hypothesized that the low thermodynamic driving force of the atypical glycolysis of *C. thermocellum*, and/or a limited  $PP_i$  supply for the  $PP_i$ -consuming reactions might limit product titer [11, 27, 47]. Here we show that the improved thermodynamic driving force of our  $PP_i$ -free glycolysis allowed a 38% increase in ethanol titer (Fig. 6), providing evidence of the utility of this approach.

## Supplementary Information

The online version contains supplementary material available at <https://doi.org/10.1186/s13068-024-02591-5>.

Additional file 1. Enzyme assay data.

Additional file 2. Quantification of different isotopes of Glucose 6-phosphate, Fructose 6-phosphate, Fructose 1,6-bisphosphate and Dihydroxyacetone phosphate.

Additional file 3. Fermentation data for the strains LL1590, LL1592 and LL1711

Additional file 4. Table of mutations identified by genome resequencing.

Additional file 5. Compiled supplementary information document with figures S1 through S7.

Additional file 6. Intracellular metabolite concentrations for the strains LL1590, LL1592 and LL1711.

## Acknowledgements

Not applicable.

## Author contributions

BDS: Conceptualization; Data curation; Formal analysis; Investigation; Methodology; Software; Validation; Visualization; Writing—original draft. SH: Conceptualization; Investigation; Strain development; Formal analysis; Visualization; Writing—Review and Editing. ET: Data curation; Investigation; Writing—Review and Editing. DMS: Data curation; Investigation. DAN: Writing—Review and Editing. AMG: Conceptualization, Writing—Review and Editing. LL: Funding Acquisition, Project Administration, Writing—Review and Editing. DGO: Conceptualization, Writing—Review and Editing, Supervision, Project Administration, Funding Acquisition.

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## Availability of data and materials

Enzyme assay data, extracellular metabolite data, intracellular metabolite data,  $^{13}C$  labeling data and genome resequencing data are all provided in the supporting information. Strain resequencing data is available from the NCBI Sequence Read Archive <https://www.ncbi.nlm.nih.gov/sra/> (Table 1). Plasmid DNA sequences and annotations are available from GenBank (Table 2). Materials available by request.

## Declarations

### Ethics approval and consent to participate

Not applicable.

**Consent for publication**

Not applicable.

**Competing interests**

Lee R. Lynd is the co-founder and CTO of Terragia Biofuels, Inc (<https://terragiabiobiofuel.com/>). Shuen Hon is an employee of Terragia Biofuels. Terragia has a financial interest in commercialization of *Clostridium thermocellum*. There are no other competing interests.

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