



Article Metabolic Difference Analysis of *Clostridium cellulovorans* Grown on Glucose and Cellulose

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Abstract: As an anaerobic butyrate-producing bacterium, Clostridium cellulovorans can secrete a variety of extracellular enzymes to degrade plant-based cellulose. However, with glucose as the carbon source, it still secretes a large amount of protein in the broth. The metabolism and regulation are obscure and need to be further studied. Hence, in this study, C. cellulovorans was used to conduct fed-batch fermentation of glucose and microcrystalline at pH 7.0 to produce a higher level of butyrate in the bioreactor. It produced 16.8 mM lactate, 22.3 mM acetate, and 132.7 mM butyrate in 72 h during glucose fermentation. In contrast, it produced only 11.5 mM acetate and 93.9 mM butyrate and took 192 h to complete the fermentation with cellulose as the carbon source. Furthermore, there was no lactate detected in the broth. The analysis of carbon source balance and redox balance showed that 57% of the glucose was consumed to form acids in glucose fermentation, while only 47% of the cellulose was used for acid generation in the cellulose fermentation. Meanwhile, a large amount of protein was detected in the fermentation broth in both glucose (0.9 ± 0.1 g/L) and cellulose (1.1 ± 0.2 g/L) fermentation. These results showed that protein was also a main product. C. cellulovorans metabolized glucose to generate intermediate metabolites and reducing powers (NADH and Fd_{red}), then protein and acid synthesis consumed this reducing power to maintain the carbon source balance and redox balance in the cell metabolism. The results of comparative transcriptomics and comparative proteomics also supported the above conclusion. The method of studying the protein during *Clostridium* species fermentation provides a new perspective for further study on metabolic regulation.

Keywords: butyrate; extracellular protein; carbon source balance; redox balance; metabolic regulation

1. Introduction

Lignocellulose is the most abundant sustainable energy and can provide around 10% of global primary energy for social activities [1,2]. As an anaerobic cellulolytic bacterium, *Clostridium cellulovorans* is able to produce acids (including formate, acetate, lactate, and butyrate) and gases (including CO₂ and H₂) by degrading complex carbohydrates such as cellulose, xylan, and pectin, which are main components of lignocellulose [2–4]. It has also been engineered to be a butanol-producing strain by integrating an exogenous aldehyde/alcohol dehydrogenase [5–7]. Thus, *C. cellulovorans* has become a promising candidate for producing industrial biofuels and biochemicals with the utilization of lignocellulosic biomass, which is of great significance in cutting the cords to fossil energy [8].

C. cellulovorans can adjust the metabolic pathways and product synthesis in response to changes in the fermentation environment [9,10]. Butyrate is the main product in the fermentation process of *C. cellulovorans*, and its metabolic pathway has been outlined clearly as shown in Figure 1 [2,11,12]. There are four biochemical reactions that occur



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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). during the conversion from acetyl-CoA to butyryl-CoA, including two redox reactions during which NADH acts as the sole electron donor. Then, butyrate is synthesized by phosphotransbutyrylase and butyrate kinase accompanied by ATP generation. Acetate and butyrate are the main products at pH 6.5, while the products include formic acid, lactate, and ethanol in addition to acetate and butyrate without pH control. Nevertheless, how pH affects the regulation mechanism of *C. cellulovorans* is still unclear. For the byproducts, the synthesis of acetate and formate does not require NADH, while lactate and ethanol require different amounts of NADH compared to that of butyrate synthesis (Figure 1). These phenotypes indicate that C. cellulovorans redistributes carbon sources and NADH to maintain the carbon balance and redox balance according to the pH change in the cell metabolism. Relative to the diversity of products, there are not many forms of reducing equivalents (mainly NADH and reduced ferredoxin) in the fermentation of anaerobic *Clostridium* species. As another reducing equivalent, reduced ferredoxin (Fd_{red}) is mainly reoxidated by H₂ production, which suggests that the H₂ concentration should also be determined as an important product in the redox balance analysis [5,12]. Significantly, electrons can be transferred between Fd_{red}/Fd_{ox} and NADH/NAD⁺ via a bifurcation reaction (Bcd/Etf complex, Figure 1), which is a unique characteristic of butanol/butyrateproducing clostridia. Thus, it is an effective strategy to study the metabolic regulation mechanism of *Clostridium* species by analyzing the production and distribution mechanism of reducing equivalents [13,14].



Figure 1. Metabolic pathway of acid biosynthesis in *C. cellulovorans*. Abbreviations: *pta*, phosphate acetyltransferase; *ack*, acetate kinase; *ptb*, phosphate butyryltransferase; *buk*, butyrate kinase; *adhE*, aldehyde/alcohol dehydrogenase; *pfor*, pyruvate:ferredoxin oxidoreductase; *ldh*, lactate dehydrogenase; *pfl*, pyruvate formate lyase; *thl*, thliolase/acetyl-CoA acetyltransferase; *hbd*, 3-hydroxybutyryl-CoA dehydrogenase; *bcd*, Acyl-CoA dehydrogenase; *etf*, electron transfer flavoprotein; *crt*, crotonase/short-chain-enoyl-CoA hydratase; Fd_{red}, reduced ferredoxin; Fd_{ox}, oxidized ferredoxin.

In order to obtain fermentable sugars from lignocellulose, C. cellulovorans secretes a quantity of carbohydrate activity enzymes (CAZys) to degrade its complex structure [15]. The CAZys have a variety of types, functions, and combinations that can act synergistically on the degradation. Some CAZys compose cellulosomes that are expressed at the cell surface. While there are also some enzymes called non-cellulosomal enzymes, these do not belong to cellulolytic enzymes but play a role in lignocellulose depolymerization [16]. These CAZys have been deeply studied with the completion of genome sequencing and application of omics technology in C. cellulovorans [2,17-20]. The genome data show that C. cellulovorans has a broader substrate spectrum and secretes 37% more types of CAZys than those of *Clostridium thermocellum*, which is recognized as the most efficient cellulose-degrading bacterium [21]. In addition, some research results also showed that the composition and production of CAZys varied widely with lignocellulosic biomass and soluble sugars. Theoretically, the synthesis of CAZys occupies the carbon source and energy during bacterium metabolism and will further affect the product production and redox balance. However, there is a gap in the experimental data on how CAZy synthesis affect the titer and yield of products. In the present study, we utilized two representative carbon sources, glucose and crystalline cellulose (Avicel in this study), in C. cellulovorans fermentation. Glucose can be metabolized directly through glycolysis, while Avicel must be degraded to soluble glucose by CAZys secreted by C. cellulovorans before it can be used as a carbon source. The relationship between products and CAZy synthesis was investigated by comparing the product concentration, carbon source and energy balance, functional genes, and protein expression under the two fermentation conditions. Because pH affects the product synthesis and growth, this study was carried out under a fixed pH condition at 7.0.

2. Materials and Methods

2.1. The Culture Medium and Batch Fermentation

C. cellulovorans 743B was purchased from the Deutsche Sammlung von Mikroorganismen und Zellkulturen GmbH (DSMZ), Braunschweig, Germany, and stored by freezing mid-exponential phase cultures with 30% glycerol at -80 °C. *C. cellulovorans* was revived and grown in a CM3 medium that contained (per liter): (NH₄)₂SO₄, 1.3 g; KH₂PO₄, 1.5 g; K₂HPO₄·3H₂O, 2.9 g; FeSO₄·7H₂O, 2 mg; MgCl₂·6H₂O, 0.2 g; CaCl₂·2H₂O, 75 mg; cysteine-HCl, 0.5 g; NaHCO₃, 0.5 g; SL-10 trace metal elements (1000×), 1 mL; yeast extract, 2 g; and cellobiose, 6 g. The composition of the fermentation medium was as follows (per liter): (NH₄)₂SO₄, 1.5 g; K₂HPO₄·3H₂O, 1.0 g; KCl, 0.5 g; MgSO₄·7H₂O, 0.5 g; CH₃COONa, 1.6 g; Cys-HCl, 2 g; yeast extract, 0.5 g; tryptone, 0.5 g; MnCl₂·4H₂O, 25 mg; CuCl₂·2H₂O, 2.5 mg; CuCl₂·2H₂O, 25 mg; ZnCl₂, 10 mg; H₃BO₃, 2.5 mg; NiCl₂·6H₂O, 2.5 mg; and NaMoO₄·2H₂O, 2.5 mg. Glucose or cellulose (microcrystalline, Avicel PH-101, Sigma-Aldrich Inc., St. Louis, MO, USA, in this study) was added into the medium as the carbon source at an appropriate concentration. During the medium preparation, the operation process was kept anaerobic through nitrogen replacement and an anaerobic workstation (Coy Laboratory, Grass Lake, MI, USA).

The *C. cellulovorans* cells (5 mL) stored in glycerol bottles were inoculated into 50 mL of CM3 medium. After overnight cultivation, the culture was injected at 5% inoculum into a 5 L bioreactor (Infors Biotechnology Co., Ltd. Beijing, China) with a working volume of 2 L. Then, the fermentation process was kept at 36 °C and pH 7.0 with 2M KOH added automatically. Glucose (40 g/L) or Avicel (40 g/L) was used as a carbon source in the initial medium to study the effects of different carbon sources on fermentation product formation and metabolic regulation. An appropriate amount of glucose was added to the broth using a peristaltic pump to maintain the concentration at not less than 10 g/L, while Avicel (20 g) was added to the broth at 48 h and 72 h using a syringe to maintain an anaerobic environment. Three independent fermentations were performed for each growth condition of glucose- or Avicel-supplemented medium.

2.2. Analytical Methods

Cell growth was monitored via the absorbance at 600 nm (A_{600}) and determined using a Ultrospec 2100 Pro spectrophotometer (GE, Fairdield, CT, USA) during glucose fermentation at regular time intervals. The growth during cellulose fermentation was indicated by identifying the total amount of intracellular protein. The standard curve of the corresponding relationship between the absorbance (A_{600}) and intracellular protein concentration was established as follows: take out the cells in exponential phase during glucose fermentation and measure the OD value; collect the cells by centrifuging at 4 °C for 15 min, and wash the pellets twice with 0.9% (w/v) NaCl. Next, the cells were resuspended in different volumes to obtain different gradients of protein concentrations and treated using ultrasonication for 30 min. Then, 1 mL of the mixture was withdrawn and mixed with 1 mL of NaOH (0.1 M). The mixture was boiled for 10 min and centrifuged at $8000 \times g$ at 4 °C for 20 min. Then, the protein concentration in the supernatant was concentrated 10 times with a SpeedVac machine (CVE-2100 EYELA, Shenzhen, China) and determined by using a Bradford reagent (Sangon Biotec, Shanghai, China) following the manufacturer's instructions. Bovine serum albumin (BSA) was used as the standard. The standard curve of OD value and protein concentration was prepared according to measured data (Figure S1). Hence, the growth in cells during cellulose fermentation was measured by determining of intracellular protein concentration described above.

The total extracellular protein in the broth was determined by using the Bradford method described above. In addition, the total extracellular protein in the fermentation broth was determined by using the following weighing method. The broth was centrifuged for 20 min at 4 °C to remove precipitation, and the supernatant was transferred to a new beaker. The supernatant (1 L) was mixed with a 2-fold volume of ethanol for 12 h. The precipitated protein was obtained via centrifugation and transferred to a -80 °C freezer for 24 h. Then, the dry weight of the protein was determined after lyophilization overnight.

Glucose, lactate, acetate, butyrate, and ethanol in the broth were monitored with an Agilent 1100 high-performance liquid chromatography (HPLC) system equipped with a refractive index detector (RID) operated at 35 °C and a column (Aminex HPX-87H, 7.8 mm inner diameter and 30 cm length, BioRad Laboratories, Hercules, CA, USA) maintained at 65 °C; 5 mM of H_2SO_4 was used as the mobile phase at a flow rate of 0.7 mL/min. Glucose consumption during the whole fermentation process was calculated by subtracting the residual glucose concentration in the broth from the total added glucose. Similarly, the cellulose consumption was also calculated using this method. The mix gas (CO₂ and H₂) produced in the fermentation was collected in an air-collecting bag and analyzed with a GC system (GC-7820, HuiFen Chemical Instruments Co., Ltd., Zaozhuang, China) equipped with a TDX column (1.5 m length and 3 mm inner diameter). H₂ and CO₂ were detected using a thermal conductivity detector with high-purity argon as the carrier gas.

2.3. Carbon and Energy Flux Analysis

Acids and gas are the main products in *C. cellulovorans* fermentation of cellulose or glucose, and the metabolic pathways have been clarified (Figure 1). Based on the carbon source balance, it is obvious how to calculate the amount of glucose consumed in the formation of acids. However, since accurate measurement of bioenergy is still a challenge, the energy generation and consumption (which mainly refer to ATP, NADH, and Fd_{red} in this study) can only be estimated through glucose consumption and product formation. Bioenergy is mainly produced by glycolysis, during which one mole of glucose can produce two moles of ATP and two moles of NADH in *C. cellulovorans* fermentation. Acetate and butyrate formation can also produce ATP. If the synthesis of acetyl-CoA is catalyzed by pyruvate:ferredoxin oxidoreductase (PFOR), Fed_{red} will be formed in this reaction; if this reaction is catalyzed by pyruvate formate lyase (PFL), there is no Fd_{red} produced. Furthermore, Fd_{red} can be produced during butyrate formation due to the participation of the Bcd/Etf electron bifurcation enzyme complex. In this study, we established that all acetyl-CoA required in the synthesis of acetate and butyrate was catalyzed by PFOR.

Therefore, the molar concentration of Fd_{red} could be calculated through molar concentration of acetate and butyrate.

These forms of bioenergy—mainly ATP and NADH—promote the cell growth and metabolism. Excess energy is reoxidized through product formation to maintain the redox balance during cell metabolism. Lactate synthesis requires NADH (Figure 1). The synthesis of 1 mole of butyrate requires 3 moles of NADH, and 1 mole of H₂ consumes 1 mole of Fd_{red} (Figure 1). It should be pointed out that there was still 20 mM of acetate in the original fermentation medium, which should be taken into account when calculating the carbon source balance.

2.4. Gene Expression Analysis by RNA-Seq and qRT-PCR

Comparative transcriptomics of cells grown on glucose and cellulose was performed to investigate gene expression profiles based on three biological triplicates. Cell pellets at the late-exponential phase from cultures in the bioreactor were collected via centrifugation at 10,000 \times g and -4 °C for 10 min, frozen in liquid nitrogen immediately, and then stored at -80 °C. The RNA isolation and high-throughput RNA sequencing (RNA-Seq) were accomplished by Allwegenetech Corp. (Beijing, China). The total RNA was extracted using the mirVana miRNA Isolation Kit (Ambion, Santa Clara, CA, USA) following the manufacturer's protocol. RNA integrity was evaluated using the Agilent 2100 Bio-analyzer (Agilent Technologies, Santa Clara, CA, USA). The samples with an RNA Integrity Number $(RIN) \ge 7$ were subjected to subsequent analysis. The libraries were constructed using the TruSeq Stranded mRNA LTSample Prep Kit (Illumina, San Diego, CA, USA) according to the manufacturer's instructions. Then, these libraries were sequenced on the Illumina sequencing platform (HiSeqTM 2500), and 150 bp/125 bp paired-end reads were generated. Based on the reads per kilobase of transcript per million reads mapped (RPKM) normalization, the gene expression profiles were analyzed. The processed RNA-Seq data was submitted to the ArrayExpress database (www.ebi.ac.uk/arrayexpress, URL, accessed on 21 November 2022) under the accession number E-MTAB-12360. The transcriptional expression profiles of some genes were detected via quantitative reverse transcription-PCR (qRT-PCR). Triplicate samples were collected from cultures at the late exponential phase of growth. The collection and storage method of the bacterial pellets and the operation of the qRT-PCR were described in detail in a previous publication [22]. The quantities of transcripts from these genes were normalized with that of 16S rRNA as the internal standard. Relative transcript levels of the studied genes were calculated using the threshold cycle ($2^{-\Delta\Delta CT}$) method [22,23]. The primers used in this study are listed in Table S1 in the Supplementary Materials.

2.5. Proteomic Analysis

The extracellular proteome technology was used to compare the metabolism difference of *C. cellulovorans* grown on glucose and cellulose. Extracellular protein samples were harvested via centrifugation ($8000 \times g$, 4 °C, 10 min) from glucose- (36 h) and cellulosesupplemented (96 h) cultures, and the supernatant was stored at -80 °C for the following proteome analysis. Protein digestion and a Sequential Window Acquisition of all Theoretical Fragment Ion Spectra–Mass Spectrometry (SWATH-MS) analysis were conducted by a specialized company (Allwegenetech Corp., Beijing, China) [24]. Briefly, the protein concentration of each sample was determined, and 100 µg protein from each sample was taken out for enzymatic hydrolysis following the detailed description by Yin et al. [25–27].

LC-MS/MS analyses were performed using a Orbitrap Fusion Lumos coupled with an Easy nanoLC 1000 system (Thermo Scientific, Waltham, MA, USA). Peptide (3 µg) was loaded into a home-packed column (3 µm, Waters Bridge C18, 120 Å, 4.6 mm × 250 mm) with an integrated spray tip. The mobile phase was a mixture of 0.1% (v/v) formic acid in water (buffer A) and 0.1% (v/v) formic acid in acetonitrile (buffer B) at a flow rate of 400 nL/min. The peptides were separated by a 120 min gradient (6% buffer B for 1 min, 36% buffer B for 100 min, 60% buffer B for 106 min, 100% buffer B for 110–118.50 min, then held at 1% buffer B). To generate SWATH-MS spectral library, the reference spectral library was firstly constructed using the data-dependent acquisition (DDA) mode. Then, a cyclic data-independent analysis (DIA) was also constructed. The software used for the data analysis and setting of the mass spectra parameters was described in detail in previous reports [28,29]. All of the raw data files were deposited in the PRIDE database with the accession number PXD037889.

The mass spectrometry proteomics data provided information about the differential expression of the extracellular protein secreted by *C. cellulovorans* grown on glucose and cellulose. In combination with the whole genome sequence of *C. cellulovorans*, the present study focused on determining: (1) the proteins with the highest expression levels in glucose-supplemented fermentation (the top 60 proteins); (2) the proteins with the highest expression levels in cellulose-supplemented fermentation (the top 60 proteins); and (3) the proteins with the greatest differences in expression levels between glucose- and cellulose-supplemented fermentation [16].

3. Results

3.1. Growth and Fed-Batch Fermentation

C. cellulovorans grew well in the fermentation with glucose as the carbon source: the highest optical density (OD; 600 nm) achieved 3.5 ± 0.2 at 48 h. The strain produced 16.8 ± 5.8 mM of lactate, 22.3 ± 7.5 mM of acetate, and 132.7 ± 5.5 mM of butyrate in the present study (Figure 2). A total of 268 ± 2 mM of glucose was consumed in the entire fermentation (72 h). H_2 and CO_2 generated during the fermentation were collected in an air-collection bag. Through calculation, we determined that 117.2 ± 14 mM of H₂ and 36.8 ± 3 mM of CO₂ were produced by *C. cellulovorans*, respectively. Furthermore, we drew a standard curve of the OD and total intracellular protein concentration for cells grown in glucose (Figure S1). This standard curve helped us determine the OD of cells in cellulose-supplemented culture. When C. cellulovorans grew in cellulose-supplemented culture at pH 7.0, it consumed around 33 g/L cellulose (equivalent to 204 \pm 12 mM of glucose) and mainly produced 11.5 mM \pm 1.3 mM of acetate and 93.9 \pm 4.4 mM of butyrate by the end of fermentation. Lactate was not detected under this condition. The highest OD achieved 2.6 \pm 0.3 at 120 h based on determination of the total intracellular cell proteins (Figure 2). The gas productivity was measured as above; the data are shown in Table S2. In comparison, the *C. cellulovorans* grown on cellulose produced fewer acids, the growth rate was much lower than that on glucose, and the fermentation course time was 2.7 times longer (Figure 2).

3.2. Carbon Source, Redox Balance Analysis, and Stoichiometry

Regarding the metabolic pathways (Figure 1), acids were predominantly generated by glucose metabolism. Acid formation required 152.3 mM of glucose in C. cellulovorans fermentation grown on glucose, while 268 mM of glucose was consumed in the entire fermentation process (Tables 1 , S2 and S3). Therefore, 57% of the carbon source went toward acid synthesis. Similarly, 49% of the total glucose consumed (33 g/L cellulose; equivalent to 204 ± 12 mM of glucose) in the *C. cellulovorans* fermentation with cellulose as the carbon source was used to synthesize acids. These results suggested that around half of the carbon source was metabolized to other products in *C. cellulovorans* fermentation. Meanwhile, two methods were used to determine the protein concentration in broth. Around 0.52 \pm 0.1 g/L and 0.61 \pm 0.2 g/L of protein were determined using the Bradford method in the supernatant of the broth with glucose and cellulose as carbon sources, respectively; the protein concentrations measured using the lyophilization method were 0.9 ± 0.1 g/L and 1.1 ± 0.2 g/L. C. cellulovorans is a cellulose-degrading bacterium that can secrete extracellular enzymes to obtain soluble sugar in cellulose-supplemented fermentation. However, the results showed that *C. cellulovorans* also produced a large amount of protein in the glucose-supplemented culture in this study.



Figure 2. Growth and products profiles of *C. cellulovorans* grown on glucose (A) and cellulose (B).

Table 1. Detailed data from the carbon source, redox balance analysis, and stoichiometry in *C. cellulovorans* fermentation.

	Glucose ^a	Glucose ^b	Ratio ^c	RE ^d	RE ^e	Ratio ^f
	(mM)	(mM)	(%)	(mM)	(mM)	(%)
Glucose	$\begin{array}{c} 268\pm2\\ 204\pm8 \end{array}$	152.3	57	1072	399.4	37
Cellulose		99.7	49	816	329.2	40

^a Glucose consumption in the entire fermentation process, during which the molecular weight of glucose in cellulose was 162; ^b glucose required for the acetate, lactate, and butyrate synthesis; ^c ratio of glucose required for acid formation to total glucose consumption; ^d total reducing equivalent (NADH and Fd_{red}) formed during glucose metabolism to acetyl-CoA; ^e total reducing equivalent (NADH and Fd_{red}) required for acid and hydrogen synthesis during the entire fermentation process; ^f ratio of reducing equivalent to reducing equivalent (e/d).

The synthesis and consumption of bioenergy promote cell metabolism and maintain redox balance in C. cellulovorans fermentation. According to the metabolic mechanism that was previously clarified, ATP and NADH were mainly produced in glycolysis (Figure 1). The synthesis of acetyl-CoA and butyryl-CoA could produce Fd_{red}. Butyrate and lactate formation consumed NADH, and the hydrogen generation consumed Fd_{red} (Figure 1). Theoretically, around 1072 mM of reducing equivalents (the total NADH and Fd_{red}) were produced by the glycolysis pathway in glucose fermentation. The syntheses of butyrate, hydrogen, and lactate required 399.4 mM of reducing equivalents, accounting for 37% of the total reducing equivalents. In addition, the ratio was 40% in the cellulose fermentation (Table 1). Around 536 mM of NADH was produced with glucose as the carbon source in the present study, and the synthesis of butyrate and lactate required 414.9 mM of NADH. Therefore, the NADH required for acid synthesis covered 77% of the total NADH. Similarly, the NADH required for butyrate synthesis accounted for 69% of the total NADH generated in the glycolysis of the cellulose fermentation (Table S3). Fd_{red} was generated along with acetyl-CoA generation, which was the precursor of butyrate and acetate. As a result, it could be calculated that 420.4 mM of H₂ was supposed to be generated in the glucose fermentation. However, the hydrogen yield collected in the practical fermentation was 117.2 mM, which meant only 28% of the total Fd_{red} was used for H_2 formation in the glucose

fermentation. Correspondingly, 48% of Fd_{red} was used to generate H_2 in the condition of cellulose-supplemented culture (Table S3).

These results showed that in the fermentation of the two types of carbon sources, *C. cellulovorans* modified the distribution mechanism of the carbon flux and energy flux to maintain the carbon balance and redox balance, leading to a wide variation in product yields.

3.3. Transcriptional Analyses of C. cellulovorans Grown on Glucose and Cellulose

RNA-Seq technology was used to identify key genes specifically associated with glucose or cellulose metabolism in *C. cellulovorans* fermentation. *C. cellulovorans* grown on glucose produced more acids and consumed more carbon sources than that on cellulose (Figure 1 and Table 1). Therefore, the genes involved in glycolysis and acid formation were firstly analyzed; the transcription profiles of these genes are exhibited in Figure 3 and Tables S4 and S5. For the large majority of these genes, the expression levels were higher in glucose fermentation than those in cellulose fermentation. This observation was basically consistent with the previous comparative proteomic results [2]. Then, the transcription profiles of cellulose genes, which are essential for cellulose degrading, were analyzed (Figure 4 and Table S5). The results showed that the expressions of cellulose-degrading genes were largely upregulated in cellulose fermentation compared to that in glucose fermentation.

Furthermore, particular attention was paid to the genes with transcriptional reads per kilobase of transcript per million mapped reads (RPKM) greater than 30 and fold-changes greater than 3 (log2 value greater than 1.6 or less than -1.6). About 103 genes upregulated in cellulose fermentation were selected; these are listed in Supplementary Table S4. Among these, there were 29 cellulose-degrading genes reported in a previous study; these are marked in blue in Table S4. An operon (Clocel_2816-2824) that was predicted to code for cellulose degrading was highly induced in cellulose fermentation. Its RPKM values were very high; some of them were greater than 10,000, indicating that this operon plays an important role in microcrystalline degradation (Table S4). On the contrary, the RPKM values of genes belonging to another operon (Clocel_2593-2600) that was also highly induced in cellulose fermentation. Based on the gene sequence information, we speculated that this operon was involved in the uptake of oligosaccharides that derived from cellulose depolymerization.

The 79 genes upregulated in glucose were selected; these are listed in Table S4. All of the 79 protein sequences were submitted to a website for predicting signal peptides (http://www.cbs.dtu.dk/services/SignalP-4.1). We found that the proteins encoded by four genes (Clocel_0521, Clocel_4152, Clocel_1183, and Clocel_2675) had signal peptides; these are marked in red in Table S4. Since there was a large amount of protein (0.9 g/L) found in the glucose-supplemented culture, the five proteins may have been the main components of extracellular proteins. However, further verification using a quantitative proteome is required.

About 11 genes were randomly selected from the transcriptome for validation. The expression profiles of these 11 genes were investigated using RT-PCR to verify the RNA-Seq results. The gene information and primers are listed in Table S1, and the RT-PCR results are shown in Figure S2. The results showed that the trends in the change in transcription levels obtained by the two methods were consistent (Figures 3, 4 and S2 and Table S4). The genes used in the RT-PCR are underlined in Table S4.

3.4. Quantitative Proteome Analyses of Culture Supernatants in C. cellulovorans

Generally, it is unnecessary for *C. cellulovorans* to produce cellulase in the fermentation with glucose as the carbon source. However, a large amount of protein was detected in the supernatant (around 0.9 g/L). Quantitative proteome analyses of the culture supernatant in glucose and cellulose fermentation were performed to identify the extracellular proteins, and the protein abundance was indicated by spectral counts of the identified peptides.

Therefore, we firstly focused on proteins whose spectral counts were greater than 10×10^{10} . Then, the protein sequences of these selected proteins were submitted to a website (http://www.cbs.dtu.dk/services/SignalP-4.1) to predict the signal peptides [30]. With the above cutoff criteria, 44 proteins were identified in glucose fermentation (including 3 proteins with signal peptides), and 60 proteins including 14 proteins with signal peptides were identified in cellulose. These proteins are listed in Figure 5 (top 30 in glucose fermentation), Figure 6 (top 30 in cellulose fermentation), and Table S6. Among these proteins, 20 were identical (marked in red in Table S6), indicating that they were expressed in a high abundance under the two fermentation conditions.

Gene Name	Log2FC	Product		
Clocel_2901		ATP-dependent 6-phosphofructokinases		
Clocel_0388		ATP-dependent 6-phosphofructokinases		
Clocel_1603		Pyrophosphate (PPi)-fructose 6-phosphate 1-phosphotransferase		
Clocel_0719		Glyceraldehyde-3-phosphate dehydrogenase		
Clocel_0720		Phosphoglycerate kinase		
Clocel_0721		Triosephosphate isomerase Glycolyusis		olyusis
Clocel_1364		Glucose-6-phosphate isomerase		
Clocel_1533		Lactate dehydrogenase, <i>ldh</i>		
Clocel_2700		Lactate dehydrogenase, <i>ldh</i>		
Clocel_4097		Fe-only hydrogenase, hyd		
Clocel_1684		Pyruvate ferredoxin oxidoreductase, pfor		
Clocel_1811		Pyruvate formate lyase, pfl		
Clocel_1812		Pyruvate-formate lyase activating enzyme, <i>pflAE</i>	Co	ntrol
Clocel_1891		Phosphate acetyltransferase, <i>pta</i>		1111 al
Clocel_1892		Acetate kinase, <i>ack</i> metabolism		bolism
Clocel_3058		Acetyl-CoA acetyltransferase, thl		
Clocel_2972		3-hydroxybutyryl-CoA dehydrogenase, hbd		
Clocel_2973		Electron transfer flavoprotein subunit alpha		
Clocel_2974		Electron transfer flavoprotein subunit beta		
Clocel_2975		Acyl-CoA dehydrogenase, bcd		
Clocel_2976		Short-chain-enoyl-CoA hydratase, ech		
Clocel_3674		Butyrate kinase, <i>buk</i>		
Clocel_3675		Phosphate butyryltransferase, <i>ptb</i>		
Clocel_1405		Hydratase, aconitase		max
Clocel_3688		Citrate/2-methylcitrate synthase, citrate synthase		TCA
Clocel_2469		Isocitrate/isopropylmalate dehydrogenase family prote	ein	circle
Clocel_0392		Class II fumarate hydratase, fumC		
Clocel_1284		NADP-specific glutamate dehydrogenase, gdhA		
Clocel_2665		Glutamate synthase large subunit, gltB		
Clocel_2992		NADPH-dependent glutamate synthase, gltA		

-3 0 3

Figure 3. Expression profiles of genes located in the central metabolic pathways (Figure 1). The red color indicates that the gene expression level was higher in glucose-supplemented culture than that in cellulose-supplemented culture. On the contrary, the green color indicates that the gene expression level was higher in cellulose-supplemented culture. The details of the expression profiles are listed in Table S3. Gene name: genes are listed in the order of old ORF (open reading frame) numbers; Log2FC: data represent the log₂ value fold-changes in the reads per kilobase per transcript per million reads mapped (RPKM) during cellulose fermentation as compared to that during glucose fermentation.

Gene Name	Log2FC	Product
Clocel_0031		Glycoside hydrolase family 3 C-terminal domain-containing protein
Clocel_0035		Glycoside hydrolase family 3 C-terminal domain-containing protein
Clocel_0589		Glycoside hydrolase family 95 protein
Clocel 0619		Cellulase family glycosylhydrolase
Clocel 0905		Cellulase family glycosyl hydrolase
Clocel 0930		Glycoside hydrolase family 9 protein
Clocel 0983		Cellulase family glycosylhydrolase, Exoglucanase
Clocel 1045		Glycoside hydrolase family 3 C-terminal domain-containing protein
Clocel 1073		Glycoside hydrolase
Clocel 1134		CIA30 family protein, mannanase
Clocel 1150		Cellulase family glycosylhydrolase, Endoglucanase
Clocel 1420		Glycoside hydrolase family 9 protein
Clocel 1432		Cellulase family glycosylhydrolase
Clocel 1476	1	Glycoside hydrolase family 9 protein
Clocel 1477		Glycoside hydrolase family 9 protein
Clocel 1478		Glycoside hydrolase family 9 protein
Clocel 1543		Glycoside hydrolase family 25 protein
Clocel 1624	4	Glycoside hydrolase family 9 protein. Endoglucanase
Clocel 2256		Glycoside hydrolase family 88 protein
Clocel 2295		Glycoside hydrolase family 11 protein
Clocel 2575		Dockerin type I domain-containing protein, mannanase
Clocel 2576		Glycoside hydrolase family 9 protein, Endoglucanase
Clocel 2595		Glycoside hydrolase family 43 protein
Clocel 2600		Discoidin domain-containing protein Endoglucanase
Clocel 2606		Cellulase family glycosylhydrolase. Endoglucanase
Clocel 2607		Chitobiase/beta-hexosaminidase, mannanase
Clocel 2741		Glycoside hydrolase family 9 protein Endoglucanase
Clocel 2816		Glycoside hydrolase family 9 protein
Clocel 2818		Dockerin type I domain-containing protein. Cellulosose-binding protein
Clocel 2819		Glycoside hydrolase family 9 protein
Clocel 2820		Cellulosome anchoring protein cohesin region
Clocel 2821		Glycoside hydrolase family 9 protein Exoglycanase
Clocel 2822		Glycoside hydrolase family 9 protein Endoglucanase
Clocel 2824		Cellulose-binding protein
Clocel 2882		Glycoside hydrolase family 1 protein
Clocel 2002		Endo-heta-vylanase
Clocel 3099		Cellulase family glycosylbydrolase
Clocel 3111		Cellulase family glycosylhydrolase Evoslucanase
Clocel 3196		Glycoside hydrolase family 130 protein
Clocel 3205		Glycoside hydrolase family 2 protein
Clocel 3242		Cellulase family alvosylbydrolase
Clocel 3350		Cellulase family glycosylhydrolase Evoglucanase
Clocel 3657		Glycoside bydrolase family 43 protein
Clocel 3662		Cellulase family alvosyllydrolase
Clocal 4062		Chroseida hudrolasa familu 1 protain
Clocel 4110		Dockerin tyme I domain containing protein mannanase
CIOCCI_4119		Dockerin type i domani-containing protein, mannanase

Figure 4. Expression profiles of genes involved in cellulose degrading. The blue color indicates that the gene expression level was higher in cellulose-supplemented culture than that in glucose-supplemented culture. The details of the expression profiles are listed in Table S3. Gene name: genes are listed in the order of old ORF (open reading frame) numbers; Log2FC: data represent the log2 value fold-changes in the reads per kilobase of transcript per million mapped reads (RPKM) during cellulose fermentation as compared to that during glucose fermentation.

C. cellulovorans can produce extracellular enzymes to obtain soluble fermentation sugar in cellulose fermentation. Hence, in cellulose fermentation, many proteins with high abundance are involved in polysaccharide depolymerization and sugar transport. We found that 7 out of 60 high-abundance proteins (gene number underlined in Table S6) belonged to this class. In addition, some proteins were discovered to participate in butyrate synthesis (e.g., the products of the genes Clocel_1684, Clocel_2973, and Clocel_2974; Figure 1). Furthermore, some Fe-S-dependent proteins were also identified (Table S6), which suggested that iron and sulfur sources played an important role in metabolism of *C. cellulovorans*.

In the glucose fermentation, only 3 proteins (Clocel_2823, Clocel_2824, and Clocel_2900) of the selected 44 high-abundance proteins had signal peptides. The three proteins were all involved in plant polysaccharide depolymerization, indicating that they were constitutively expressed even if there was no lignocellulose substrate in the medium. Moreover, the analysis data revealed that the proteins involved in butyrate biosynthesis were abundant, including pyruvate:ferredoxin oxidoreductase (PFOR, Clocel_1684, and Clocel_2840), pyruvate formate lyase (PFL and Clocel_1811), and the Bcd/Etf complex (Clocel_2972, Clocel_2973, and Clocel_2974). These enzymes were located in the central metabolic path-

way and upregulated in glucose fermentation (Figure 3 and Table S3). The quantitative proteome data listed in Table S6 also revealed that the majority of proteins were not secreted proteins but intracellular proteins. The possible reason why these proteins were present in the supernatant of the fermentation broth was that they were released with cell autolysis. The data also showed that the proteins involved in butyrate synthesis occupied a large proportion of the total intracellular proteome, especially in the fermentation with glucose as the carbon source (Table 1 and Figure 3).

Gene-ID	LogFC	Products
Clocel_2823		Dockerin type I domain-containing protein
Clocel_2050		Hypothetical protein
Clocel_2974		Electron transfer flavoprotein subunit beta
Clocel_2018		Phosphoglycerate dehydrogenase
Clocel_2973		Electron transfer flavoprotein subunit alpha
Clocel_0111		Trypsin-like peptidase domain-containing protein
Clocel_3736		Elongation factor G
Clocel_0553		Class II fructose-1,6-bisphosphate aldolase
Clocel_0528		GTP-binding protein
Clocel_1775		Translation elongation factor Ts
Clocel_1454		Pyruvate, phosphate dikinase
Clocel_3735		Elongation factor Tu
Clocel_2849		Calcium-binding protein
Clocel_2359		Calcium-binding protein
Clocel_1684		Pyruvate:ferredoxin (flavodoxin) oxidoreductase
Clocel_1674		Aminopeptidase
Clocel_2086		Hypothetical protein
Clocel_3111		Cellulase family glycosylhydrolase
Clocel_0510		Molecular chaperone HtpG
Clocel_3686		Phosphoenolpyruvateprotein phosphotransferase
Clocel_0730		Phosphopyruvate hydratase
Clocel_2975		Acyl-CoA dehydrogenase
Clocel_3475		Cysteine synthase A
Clocel_1811		Formate C-acetyltransferase
Clocel_0379		NADH peroxidase
Clocel_1516		Anaerobic carbon-monoxide dehydrogenase
Clocel_2885		Cold-shock protein
Clocel_1773		GTP-sensing pleiotropic transcriptional regulator
Clocel_0272		Hypothetical protein
Clocel_2665		Glutamate synthase large subunit

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Figure 5. Expression profiles of proteins (top 30 in spectral counts) in glucose fermentation. The red color indicates that the protein expression level was higher in cellulose-supplemented culture than that in glucose-supplemented culture. On the contrary, the green color indicates that protein expression level was higher in glucose-supplemented culture. The details of the expression profiles are listed in Table S4. Gene ID: genes are listed in the order of old ORF (open reading frame) numbers; LogFC: data represent the log₂ value fold-changes in the spectral counts during cellulose fermentation as compared to that during glucose fermentation.

The protein expression profiles of the four genes (Clocel_0521, Clocel_4152, Clocel_1183, and Clocel_2675) with signal peptides and a high transcription level are listed in Table S4 (marked in blue). The protein expression level of three genes (Clocel_4152, Clocel_1183, and Clocel_2675) had little change in the fermentation using glucose or cellulose as the carbon source. The gene (Clocel_0521) coding for a sulfate transporter had a higher level of transcription and expression in glucose fermentation than that in cellulose fermentation. However, its RPKM value and spectral counts were not outstanding (Tables S4 and S5), indicating that the proportion of this protein in the total extracellular proteins was not high in glucose fermentation.

Gene-ID	LogFC	Products
Clocel_2050		Hypothetical protein
Clocel_2823		Dockerin type I domain-containing protein
Clocel_1454		Pyruvate, phosphate dikinase
Clocel_0379		NADH peroxidase
Clocel_3111		Cellulase family glycosylhydrolase
Clocel_2849		Calcium-binding protein
Clocel_2900		Endo-1,4-beta-xylanase
Clocel_2596		Sugar ABC transporter substrate-binding protein
Clocel_1684		Pyruvate:ferredoxin oxidoreductase
Clocel_1516		Carbon-monoxide dehydrogenase
Clocel_4153		Rubrerythrin family protein
Clocel_1773		GTP-sensing pleiotropic transcriptional regulator
Clocel_0272		Hypothetical protein
Clocel_4154		Desulfoferrodoxin
Clocel_2607		Chitobiase
Clocel_2402		Acetaldehyde/alcohol dehydrogenase
Clocel_3817		Iron-containing alcohol dehydrogenase
Clocel_2665		Glutamate synthase large subunit
Clocel_3196		Glycoside hydrolase family 130 protein
Clocel_0391		N,N'-diacetylchitobiose phosphorylase
Clocel_2006		Translation initiation factor IF-3
Clocel_0038		ABC transporter substrate-binding protein
Clocel_3736		Elongation factor G
Clocel_0148		Leucine-rich repeat protein
Clocel_0590		Xylose isomerase
Clocel_2818		Dockerin type I domain-containing protein
Clocel_4143		Acyl carrier protein
Clocel_2744		RidA family protein
Clocel_2741		Glycoside hydrolase family 9 protein
Clocel_0146		Protease inhibitor I42 family protein



Figure 6. Expression profiles of proteins (top 30 in spectral counts) in cellulose fermentation. The red color indicates that the protein expression level was higher in cellulose-supplemented culture than that in glucose-supplemented culture. On the contrary, the green and blue colors indicate that the protein expression level was higher in glucose-supplemented culture. The details of the expression profiles are listed in Table S4. Gene ID: genes are listed in the order of old ORF (open reading frame) numbers; LogFC: data represent the log₂ value fold-changes in spectral counts during cellulose fermentation, as compared to that during glucose-fermentation.

4. Discussion

4.1. Growth and Metabolic Product Characteristics

The growth in *C. cellulovorans* was greatly affected by the substrate in the fermentation. *C. cellulovorans* grew fast and metabolized rapidly in soluble sugar fermentation, but it had a low growth rate and a long fermentation period in lignocellulose and pectin fermentation [9,15,17]. In this study, the maximum OD value was achieved at 48 h in

glucose-supplemented fermentation; while in cellulose-supplemented fermentation, it appeared at 120 h. Similar findings were reported in a previous study [2]. Due to the solid structure and insolubility of natural lignocellulose, it must be digested into soluble sugars by enzymes before the fermentation. All of the enzyme production, secretion, combination with the substrate, and subsequent enzymatic hydrolysis will slow down the acquisition time of soluble sugars, resulting in reduced growth and metabolic rates [3,10]. This phenomenon occurs in the fermentation of all lignocellulose-degrading bacteria [31,32]. These results showed that the bioconversion of lignocellulose to biochemical was still limited by the enzymatic hydrolysis rate of lignocellulose.

The optimal pH range of *C. cellulovorans* fermentation is very narrow, which means that the pH in fermentation plays a very important role in the growth and metabolism [2,9,10]. In this study, the pH value was performed at 7.0, which is also the optimal pH of *C. cellulovorans*. Under this condition, acetate and butyrate were mainly produced. If conducted without pH control, when the pH was reduced to 6.0, C. cellulovorans no longer grew or metabolized glucose. Meanwhile, ethanol was synthesized, indicating that C. cellulovorans redistributed the carbon source and energy flux in response to the pH change in the external environment. There is a more obvious phenomenon showing that pH affects product synthesis in the ABE-fermentation of *C. acetobutylicum* [12,33]. The main products are acids in the high pH fermentation, which is called acidogenesis; meanwhile, the main products change to alcohols in the low-pH fermentation, which is named solventogenesis. In particular, this conversion mechanism from acidogenesis to solventogenesis has not been completely clarified. Obviously, alcohol formation requires more NAD(P)H than acid formation (Figure 1), which suggests that the production and distribution mechanisms of NAD(P)H should be firstly clarified to understand the relationship between the conversion mechanism from acid formation to alcohol production with the pH value change in the *Clostridium* species fermentation [5].

The addition of key elements to the medium and the application of appropriate fermentation technology can also affect the growth and product yield in *Clostridium* species fermentation. In this study, we used fed-batch fermentation technology and increased the concentration of the sulfur source (Cys-HCl) in the medium. As a result, *C. cellulovorans* consumed 33 g/L cellulose, which was much higher than the previously reported consumption of 17 g/L [9]. The high cellulose consumption greatly increased the butyrate titer, which achieved 8.1 g/L in the cellulose fermentation of *C. cellulovorans*. Similarly, the glucose consumption and butyrate titer in this study were also higher than those previously reported [2]. The high product titer obtained in this study provides an obvious advantage to study the metabolisms in different fermentation conditions of *C. cellulovorans*.

4.2. Preliminary Analysis of Carbon Source Distribution Mechanism

Based on the carbon source balance analysis, we found that the protein was also a main product whose synthesis occupied a large amount of carbon sources derived from glucose metabolism in C. cellulovorans fermentation. The precursors of acid (butyrate and acetate) synthesis such as pyruvate and acetyl-CoA, which are important intermediates in glucose metabolism, are also precursors in amino acid synthesis (Figure 1). Therefore, the protein synthesis and acid generation compete in the utilization of the carbon source. However, the distribution mechanism of the carbon source is still unclear. Different substrates can also affect the carbon flow in C. cellulovorans fermentation. The glucose and nutrient elements are abundant in glucose fermentation of C. cellulovorans. Hence, the strain accumulates biomass rapidly and requires a great deal of ATP for amino acid and nucleic acid synthesis. Butyrate and acetate formation can provide ATP in addition to glycolysis (Figure 1). As a result, the carbon source is mainly distributed for acid formation in glucose fermentation of C. cellulovorans. In this study, the glucose for acid formation accounted for 67% of the total glucose consumption; meanwhile, this ratio reached 98% in glucose fermentation in previous reports [2]. On the contrary, the carbon source was preferentially used for cellulase synthesis to obtain soluble sugars for growth and metabolism in the cellulose

fermentation of *C. cellulovorans*. Therefore, the acid titer and ATP synthesis rate decreased, resulting in a lower growth rate compared to glucose fermentation. The comparison of the transcriptome and proteome results further verified the fermentation results at the transcription and translation levels, which indicated that different substrates can affect the carbon source distribution in the fermentation of *C. cellulovorans*.

Interestingly, a large amount of protein was also determined in the supernatant in the glucose fermentation of *C. cellulovorans*. The majority of these proteins had no signal peptide; some proteins such as PFOR, PFL, and the Bcd/Etf complex were involved in butyrate synthesis (Figure 3 and Table S4). We speculated that these proteins were released though cell autolysis of *C. cellulovorans*, indicating that the butyrate fermentation process was accompanied by cell autolysis (Figure 2). Cell autolysis is a significant characteristic in bacteria fermentation; this phenomenon is caused by nutrient deficiency or fermentation environmental changes [34–37]. In this study, the fermentation temperature and pH remained stable. Thus, we speculated that the deficiencies in some certain nutrient elements caused autolysis of *C. cellulovorans*.

4.3. Preliminary Analysis of Redox Balance Mechanism

NADH and Fd_{red} are the main reducing equivalents produced during glucose metabolism in *Clostridium* species fermentation [12,38]. They cannot be accumulated in cells and must be oxidized immediately to maintain the redox balance in cells. Butyrate synthesis can oxidize NADH to generate NAD⁺, and H_2 formation is a main pathway for Fd_{red} oxidization (Figure 1). The data showed that the NADH required for butyrate formation accounted for 77% of the total NADH produced by glycolysis in glucose fermentation, which was higher than that (69%) in cellulose fermentation (Table 1). Moreover, the ratio of Fd_{red} required for H_2 formation (48%) to total Fd_{red} produced in acid synthesis was higher in cellulose fermentation than that (28%) in glucose fermentation (Table S3). These results suggested that Fd_{red} participated in metabolic activities other than H_2 formation in C. cellulovorans fermentation. Based on our knowledge, the specific metabolic reaction in which Fd_{red} participates is still unclear [12]. In the anaerobic bacteria and archaea, many ferredoxin:NAD⁺/NADP⁺ oxidoreductase (FNOR) enzymes or complexes have been found and recognized as a key bridge in NADH/NADPH formation via electron bifurcation or direct electron transfer from Fd_{red} [13,39]. Those FNOR enzymes with specific functions (including the Nfn complex and Rnf complex) were not found in *C. cellulovorans*. Recently, a ferredoxin:NAD⁺ reductase (CA_C0764) and a ferredoxin: NADP⁺ reductase (CA_C1502) were confirmed in C. acetobutylicum, and similar enzymes were found in the genome of C. cellulovorans according to transcriptome data [13]. These are encoded by the genes of Clocel_1284 and Clocel_2665, whose transcription levels were high in both glucose and cellulose fermentation (Figures 3 and 4). Another NFOR enzyme confirmed in Thermoanaer*obacterium saccharolyticum* (Tsac_1705) was also found in *C. cellulovorans* (Clocel_1556) [39]. This is a dihydroorotate dehydrogenase electron transfer subunit and is a part of a putative operon for de novo synthesis of pyrimidine. The redox balance analysis data indicated that Fd_{red} indirectly participated in cell metabolism by producing NAD(P)H, which is necessary for the synthesis of amino acids and nucleic acids in microbial growth.

In this study, it was assumed that the acetyl-CoAs required for acid formation were all catalyzed by PFOR from pyruvate. However, acetyl-CoA can be synthesized by PFL catalysis of pyruvate (Figure 1). The omics results showed that the transcriptional and expression levels of PFL and PFOR were very high in both glucose and cellulose fermentation (Figure 3 and Table 1). It is still a challenge to determine the percentage of acetyl-CoA that is catalyzed by PFOR using existing methods. As a result, it was difficult to accurately calculate how much Fd_{red} was generated at this step in the *C. cellulovorans* fermentation. Nevertheless, this had little impact on the analysis and comparison of the energy balance under different carbon sources. In this study, the results obviously indicated that the Fd_{red} required for cellulase synthesis was less than that required for the formation of key enzymes located in the central metabolic pathways (Tables 1, S2 and S3).

5. Conclusions

The growth and product yield in *C. cellulovorans* fermentation are highly dynamic. Here, two representative carbon sources (glucose and cellulose) were used to explore the metabolic regulation mechanism. In the cellulose fermentation, *C. cellulovorans* secreted carbohydrate activity enzymes to obtain soluble sugars. The enzymatic hydrolysis rate restricted bioconversion from lignocellulose to biochemical, resulting in a low growth rate and a long fermentation period. The protein was also found to be a main product whose synthesis consumed a large amount of carbon sources and energy sources. Even in glucose fermentation, a large amount of protein was detected in the supernatant. Most of these proteins participated in butyrate synthesis and did not have signal peptides, indicating that the butyrate generation was accompanied by cell autolysis. Both protein and acid syntheses consumed reducing powers to maintain the carbon source balance and redox balance. Overall, protein was a significant product of *C. cellulovorans* fermentation, which provides a useful framework for further study on metabolic regulation and high-yield biochemical production.

Supplementary Materials: The following supporting information can be downloaded at: https: //www.mdpi.com/article/10.3390/fermentation9040321/s1, Figure S1: The standard curve of the corresponding relationship between absorbance (A600) and intracellular protein concentration; Figure S2: Expression profiles of selected genes using RT-PCR. Gene name: Genes are listed in the order of old ORF (open reading frame) numbers; Table S1: The primers used for RT-PCR in this study; Table S2: The detailed products data in the end of fermentation of *C. cellulovorans*; Table S3: The detailed data of carbon source, redox balance analysis and stoichiometry in *C. cellulovorans* fermentation; Table S4: The expression profiles of the genes strongly induced during cellulose- and glucose-fermentation of *C. cellulovorans*; Table S5: The expression profiles of the important genes during cellulose- and glucose-fermentation of *C. cellulovorans*.

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Conflicts of Interest: The authors declare that they have no known competing financial interest or personal relationship that could have appeared to influence the work reported in this paper.

References

- Sims, R.E.; Mabee, W.; Saddler, J.N.; Taylor, M. An overview of second generation biofuel technologies. *Bioresour. Technol.* 2010, 101, 1570–1580. [CrossRef]
- Usai, G.; Cirrincione, S.; Re, A.; Manfredi, M.; Pagnani, A.; Pessione, E.; Mazzoli, R. *Clostridium cellulovorans* metabolism of cellulose as studied by comparative proteomic approach. *J. Proteom.* 2020, 216, 103667. [CrossRef]
- 3. Aburaya, S.; Aoki, W.; Kuroda, K.; Minakuchi, H.; Ueda, M. Temporal proteome dynamics of *Clostridium cellulovorans* cultured with major plant cell wall polysaccharides. *BMC Microbiol.* **2019**, *19*, 118. [CrossRef]
- 4. Palop, M.L.; Valles, S.; Pinaga, F.; Flors, A. Isolation and characterization of an anaerobic, celluloytic bacterium, *Clostridium celerecrescens* Sp-Nov. *Int. J. Syst. Bacteriol.* **1989**, *39*, 68–71. [CrossRef]

- Bao, T.; Zhao, J.; Li, J.; Liu, X.; Yang, S.T. n-Butanol and ethanol production from cellulose by *Clostridium cellulovorans* overexpressing heterologous aldehyde/alcohol dehydrogenases. *Bioresour. Technol.* 2019, 285, 121316. [CrossRef] [PubMed]
- 6. Wen, Z.; Ledesma-Amaro, R.; Lin, J.; Jiang, Y.; Yang, S. Improved n-butanol production from *Clostridium cellulovorans* by integrated metabolic and evolutionary engineering. *Appl. Environ. Microbiol.* **2019**, *85*, e02560-18. [CrossRef]
- Xin, F.X.; Dong, W.L.; Zhang, W.M.; Ma, J.F.; Jiang, M. Biobutanol production from crystalline cellulose through consolidated bioprocessing. *Trends Biotechnol.* 2019, *37*, 167–180. [CrossRef] [PubMed]
- 8. Lynd, L.R.; Liang, X.; Biddy, M.J.; Allee, A.; Cai, H.; Foust, T.; Himmel, M.E.; Laser, M.S.; Wang, M.; Wyman, C.E. Cellulosic ethanol: Status and innovation. *Curr. Opin. Biotechnol.* **2017**, *45*, 202–211. [CrossRef] [PubMed]
- Ou, J.F.; Bao, T.; Ernst, P.; Si, Y.N.; Prabhu, S.D.; Wu, H.; Zhang, J.Y.; Zhou, L.F.; Yang, S.T.; Liu, X.G. Intracellular metabolism analysis of *Clostridium cellulovorans* via modeling integrating proteomics, metabolomics and fermentation. *Process Biochem.* 2020, 89, 9–19. [CrossRef]
- Yang, X.; Xu, M.; Yang, S.T. Metabolic and process engineering of *Clostridium cellulovorans* for biofuel production from cellulose. *Metab. Eng.* 2015, 32, 39–48. [CrossRef]
- Li, F.; Hinderberger, J.; Seedorf, H.; Zhang, J.; Buckel, W.; Thauer, R.K. Coupled ferredoxin and crotonyl coenzyme A (CoA) reduction with NADH catalyzed by the butyryl-CoA dehydrogenase/Etf complex from *Clostridium kluyveri*. J. Bacteriol. 2008, 190, 843–850. [CrossRef]
- 12. Lutke-Eversloh, T.; Bahl, H. Metabolic engineering of *Clostridium acetobutylicum*: Recent advances to improve butanol production. *Curr. Opin. Biotechnol.* **2011**, 22, 634–647. [CrossRef]
- Foulquier, C.; Riviere, A.; Heulot, M.; Dos Reis, S.; Perdu, C.; Girbal, L.; Pinault, M.; Dusseaux, S.; Yoo, M.; Soucaille, P.; et al. Molecular characterization of the missing electron pathways for butanol synthesis in *Clostridium acetobutylicum*. *Nat. Commun.* 2022, 13, 4691. [CrossRef]
- 14. Zhao, C.; Zhao, Q.; Li, Y.; Zhang, Y. Engineering redox homeostasis to develop efficient alcohol-producing microbial cell factories. *Microb. Cell Fact.* **2017**, *16*, 115. [CrossRef]
- 15. Aburaya, S.; Esaka, K.; Morisaka, H.; Kuroda, K.; Ueda, M. Elucidation of the recognition mechanisms for hemicellulose and pectin in *Clostridium cellulovorans* using intracellular quantitative proteome analysis. *AMB Express* **2015**, *5*, 29. [CrossRef]
- Tamaru, Y.; Miyake, H.; Kuroda, K.; Nakanishi, A.; Kawade, Y.; Yamamoto, K.; Uemura, M.; Fujita, Y.; Doi, R.H.; Ueda, M. Genome sequence of the cellulosome-producing mesophilic organism *Clostridium cellulovorans* 743B. *J. Bacteriol.* 2010, 192, 901–902. [CrossRef]
- 17. Cho, W.; Jeon, S.D.; Shim, H.J.; Doi, R.H.; Han, S.O. Cellulosomic profiling produced by *Clostridium cellulovorans* during growth on different carbon sources explored by the cohesin marker. *J Biotechnol.* **2010**, *145*, 233–239. [CrossRef]
- 18. Esaka, K.; Aburaya, S.; Morisaka, H.; Kuroda, K.; Ueda, M. Exoproteome analysis of *Clostridium cellulovorans* in natural softbiomass degradation. *AMB Express* 2015, *5*, 2. [CrossRef]
- 19. Matsui, K.; Bae, J.; Esaka, K.; Morisaka, H.; Kuroda, K.; Ueda, M. Exoproteome profiles of *Clostridium cellulovorans* grown on various carbon sources. *Appl. Environ. Microb.* **2013**, *79*, 6576–6584. [CrossRef]
- Morisaka, H.; Matsui, K.; Tatsukami, Y.; Kuroda, K.; Miyake, H.; Tamaru, Y.; Ueda, M. Profile of native cellulosomal proteins of *Clostridium cellulovorans* adapted to various carbon sources. *AMB Express* 2012, 2, 1–5. [CrossRef]
- Liu, H.; Sun, J.; Chang, J.S.; Shukla, P. Engineering microbes for direct fermentation of cellulose to bioethanol. *Crit. Rev. Biotechnol.* 2018, 38, 1089–1105. [CrossRef] [PubMed]
- Liu, Z.Y.; Yao, X.Q.; Zhang, Q.; Liu, Z.; Wang, Z.J.; Zhang, Y.Y.; Li, F.L. Modulation of the acetone/butanol ratio during fermentation of corn stover-derived hydrolysate by *Clostridium beijerinckii* strain NCIMB 8052. *Appl. Environ. Microbiol.* 2017, 83, e03386-16. [CrossRef] [PubMed]
- 23. Livak, K.J.; Schmittgen, T.D. Analysis of relative gene expression data using real-time quantitative PCR and the 2(T)(-Delta Delta C) method. *Methods* **2001**, *25*, 402–408. [CrossRef] [PubMed]
- Chen, M.X.; Sun, C.; Zhang, K.L.; Song, Y.C.; Tian, Y.; Chen, X.; Liu, Y.G.; Ye, N.H.; Zhang, J.; Qu, S.; et al. SWATH-MS-facilitated proteomic profiling of fruit skin between Fuji apple and a red skin bud sport mutant. *BMC Plant Biol.* 2019, 19, 445. [CrossRef] [PubMed]
- Choi, M.; Chang, C.Y.; Clough, T.; Broudy, D.; Killeen, T.; MacLean, B.; Vitek, O. MSstats: An R package for statistical analysis of quantitative mass spectrometry-based proteomic experiments. *Bioinformatics* 2014, 30, 2524–2526. [CrossRef]
- 26. Wisniewski, J.R.; Zougman, A.; Nagaraj, N.; Mann, M. Universal sample preparation method for proteome analysis. *Nat. Methods* **2009**, *6*, 359–362. [CrossRef]
- Yin, Q.; Han, X.; Chen, J.; Han, Z.; Shen, L.; Sun, W.; Chen, S. Identification of specific glycosyltransferases involved in flavonol glucoside biosynthesis in ginseng using integrative metabolite profiles, DIA Proteomics, and Phylogenetic Analysis. J. Agric. Food Chem. 2021, 69, 1714–1726. [CrossRef]
- Eng, J.K.; McCormack, A.L.; Yates, J.R. An approach to correlate tandem mass spectral data of peptides with amino acid sequences in a protein database. J. Am. Soc. Mass Spectrom. 1994, 5, 976–989. [CrossRef]
- MacLean, B.; Tomazela, D.M.; Shulman, N.; Chambers, M.; Finney, G.L.; Frewen, B.; Kern, R.; Tabb, D.L.; Liebler, D.C.; MacCoss, M.J. Skyline: An open source document editor for creating and analyzing targeted proteomics experiments. *Bioinformatics* 2010, 26, 966–968. [CrossRef]

- Yu, N.Y.; Wagner, J.R.; Laird, M.R.; Melli, G.; Rey, S.; Lo, R.; Dao, P.; Sahinalp, S.C.; Ester, M.; Foster, L.J.; et al. PSORTb 3.0: Improved protein subcellular localization prediction with refined localization subcategories and predictive capabilities for all prokaryotes. *Bioinformatics* 2010, 26, 1608–1615. [CrossRef]
- Desvaux, M. Unravelling carbon metabolism in anaerobic cellulolytic bacteria. *Biotechnol. Prog.* 2006, 22, 1229–1238. [CrossRef] [PubMed]
- Rydzak, T.; McQueen, P.D.; Krokhin, O.V.; Spicer, V.; Ezzati, P.; Dwivedi, R.C.; Shamshurin, D.; Levin, D.B.; Wilkins, J.A.; Sparling, R. Proteomic analysis of *Clostridium thermocellum* core metabolism: Relative protein expression profiles and growth phase-dependent changes in protein expression. *BMC Microbiol.* 2012, *12*, 214. [CrossRef] [PubMed]
- Moon, H.G.; Jang, Y.S.; Cho, C.; Lee, J.; Binkley, R.; Lee, S.Y. One hundred years of clostridial butanol fermentation. *FEMS Microbiol. Lett.* 2016, 363, fnw001. [CrossRef] [PubMed]
- Kacena, M.A.; Smith, E.E.; Todd, P. Autolysis of *Escherichia coli* and *Bacillus subtilis* cells in low gravity. *Appl. Microbiol. Biotechnol.* 1999, 52, 437–439. [CrossRef]
- Lacriola, C.J.; Falk, S.P.; Weisblum, B. Screen for agents that induce autolysis in *Bacillus subtilis*. *Antimicrob. Agents Chemother*. 2013, 57, 229–234. [CrossRef]
- 36. Leduc, M.; van Heijenoort, J. Autolysis of Escherichia coli. J. Bacteriol. 1980, 142, 52–59. [CrossRef]
- Liu, Z.; Qiao, K.; Tian, L.; Zhang, Q.; Liu, Z.Y.; Li, F.L. Spontaneous large-scale autolysis in *Clostridium acetobutylicum* contributes to generation of more spores. *Front. Microbiol.* 2015, *6*, 950. [CrossRef]
- Wu, Y.D.; Wang, Z.Z.; Xin, X.; Bai, F.W.; Xue, C. Synergetic engineering of central carbon, energy, and redox metabolisms for high butanol production and productivity by *Clostridium acetobutylicum*. *Ind. Eng. Chem. Res.* 2020, 59, 17137–17146. [CrossRef]
- 39. Tian, L.; Lo, J.; Shao, X.; Zheng, T.; Olson, D.G.; Lynd, L.R. Ferredoxin:NAD⁺ oxidoreductase of thermoanaerobacterium saccharolyticum and its role in ethanol formation. *Appl. Environ. Microbiol.* **2016**, *82*, 7134–7141. [CrossRef]

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