



Review

# Recent Advances in $\beta$ -Glucosidase Sequence and Structure Engineering: A Brief Review

Bei Ouyang 1, 10, Guoping Wang 1, 1, Nian Zhang 1, Jiali Zuo 2, Yunhong Huang 1, and Xihua Zhao 1, 10

- College of Life Science, Jiangxi Normal University, Nanchang 330022, China
- School of Computer and Information Engineering, Jiangxi Normal University, Nanchang 330022, China
- \* Correspondence: sallyyunhong@163.com (Y.H.); xhzhao@jxnu.edu.cn (X.Z.)
- † These authors contributed equally to this work.

Abstract:  $\beta$ -glucosidases (BGLs) play a crucial role in the degradation of lignocellulosic biomass as well as in industrial applications such as pharmaceuticals, foods, and flavors. However, the application of BGLs has been largely hindered by issues such as low enzyme activity, product inhibition, low stability, etc. Many approaches have been developed to engineer BGLs to improve these enzymatic characteristics to facilitate industrial production. In this article, we review the recent advances in BGL engineering in the field, including the efforts from our laboratory. We summarize and discuss the BGL engineering studies according to the targeted functions as well as the specific strategies used for BGL engineering.

**Keywords:** β-glucosidase; biocatalysis; biosynthesis; enzyme engineering

#### 1. Introduction

β-glucosidases (BGLs) are a class of enzymes that hydrolyze the β-1,4-glycosidic bond of the non-reducing terminal residue of β-D-glucoside while releasing glucose. BGLs have been applied in many biotechnological processes, such as the saccharification of lignocellulosic biomass for the production of bioethanol [1], wine and juice production to enhance flavor [2], and addition to feed to improve the digestion of cellulose in farm animals [3]. Additionally, BGLs play a role in cellulose digestion and phytohormone activation and participate in the hydrolysis of mammalian glucosyl ceramides [2].

There are two widely acknowledged classifications of BGLs at present: one based on substrate specificity and the other on BGL structural features. According to substrate specificity, BGLs are classified as aryl-BGLs (hydrolyzing only aryl- $\beta$ -glucoside bonds), cellobiases (hydrolyzing only cellobiose), and BGLs with broad substrate specificity (hydrolyzing a wide range of substrates with different bonds, e.g.,  $\beta(1\rightarrow 4)$ ,  $\beta(1\rightarrow 3)$ ,  $\beta(1\rightarrow 6)$ , and  $\alpha(1\rightarrow 6)$  bonds) [4]. In terms of BGL structural features, BGLs are mostly classified into two families: the glycoside hydrolase (GH) family 1, which presents a typical  $(\alpha/\beta)_8$  TIM-barrel structure and pocket-like catalytic channel [5] (Figure 1A), and the GH family 3, which has a more complicated structure including the  $(\beta/\alpha)_8$  TIM-barrel fold, the  $(\alpha/\beta)_6$  sandwich domain, and the FnIII domain of unknown function [6] (Figure 1B). In general, BGLs from the GH1 family are widely found in archaea, plants, and animals, while GH3 BGLs are mostly from bacteria, fungi, and yeasts [4].

BGLs catalyze hydrolytic reactions using either the "retention" or "inversion" mechanism (Figure 2). The inversion mechanism includes only a single step where the catalytic nucleophilic reagent of BGL deprotonates a water molecule (Figure 2A). This activated water molecule directly attacks the glycosidic bond to displace the aglycone and releases the sugar moiety with inversion of the configuration of the anomeric carbon [4]. The retention mechanism consists of two steps: glycosylation and deglycosylation (Figure 2B). In the first step, the catalytic nucleophilic reagent attacks the allosteric carbon of the glucose residue as the glycosyl donor and forms the enzyme–glucose intermediate with the help of



Citation: Ouyang, B.; Wang, G.; Zhang, N.; Zuo, J.; Huang, Y.; Zhao, X. Recent Advances in β-Glucosidase Sequence and Structure Engineering: A Brief Review. *Molecules* **2023**, *28*, 4990. https://doi.org/10.3390/molecules28134990

Academic Editor: Xiaoqiang Huang

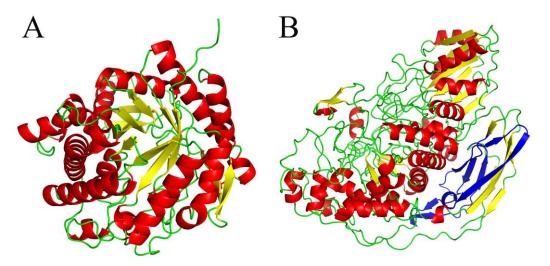
Received: 1 June 2023 Revised: 21 June 2023 Accepted: 23 June 2023 Published: 25 June 2023



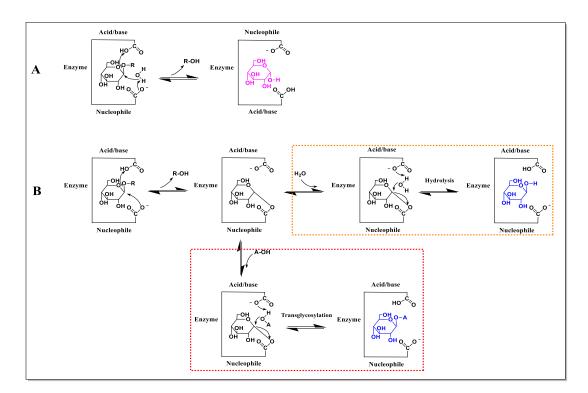
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the catalytic acid that protonates the glycosidic oxygen [7]. The second step (orange box) involves a water molecule attacking the carbohydrate—enzyme linkage, transferring the proton to the active site acid/base carboxylate and releasing glucose.



**Figure 1.** The three-dimensional structure of BGL. (**A**) Structure of PcBGL1A (PDB ID: 2e3z) from the GH1 *Phanerodontia chrysosporium* with  $\alpha$ -helices,  $\beta$ -sheets, and loops shown in red, yellow, and green, respectively. (**B**) Structure model of 16BGL from the GH3 *Penicillium oxalicum* with  $\alpha$ -helices,  $\beta$ -sheets, and loops shown in red, yellow, and green, respectively. The FnIII domain of unknown function is shown in blue.



**Figure 2.** Reaction mechanism of BGL. (**A**) The "inversion" mechanism. (**B**) The "retention" mechanism. Both the leaving group (R) and the acceptor (A) are different glycosyl molecules.

In addition to breaking the glycosidic bonds in sugars, BGLs can also lead to the formation of glycosidic bonds (i.e., transglycosylation) in non-aqueous media with hydroxyl groups [8]. The reaction mechanism is similar to the BGL hydrolysis process, with a slight difference in the second step (Figure 2B, red box) which involves the attack of another sugar

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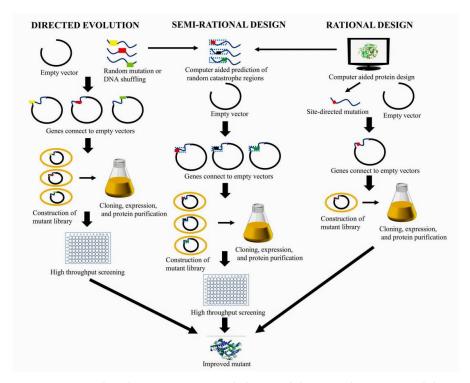
molecule (receptor A) rather than a water molecule, leading to transglycosylation [9]. The high added-value biomolecular products, such as alkyl- $\beta$ - and aryl- $\beta$ -glucosides as well as small-molecule oligosaccharides, have many promising applications in pharmaceuticals, chemicals, cosmetics, food, and detergents [10].

However, the rate of transglycosylation product synthesis by BGLs is extremely limited. Moreover, BGLs are most active only at 40–70 °C and pH 4.5–5, but industrial applications frequently go beyond these boundaries. For instance, the pre-treatment steps for removing lignin and other secondary wall components during biofuel production typically work at temperatures above 80 °C [11]. In flavor enhancement of fruit juice, enzymes with optimal activity at acidic pH 2.8–3.8 would be better adapted to release the glycosidically bound volatiles [7]. In the tandem cellulolysis process, the hydrolytic end product, glucose, inhibits BGL, leading to the accumulation of cellobiose, which in turn inhibits endo-1,4- $\beta$ -D-glucanase (EG) and cellobiohydrolase (CBH). This phenomenon renders BGL the most critical enzyme for bioethanol production through biomass conversions [4].

To broaden the applications of BGLs in industry, it would be beneficial to enhance the capability of BGLs to tolerate non-mild conditions such as high temperatures, high concentrations of glucose, extreme pH, and high concentrations of organic solvents, to name a few [12–15]. In this paper, we review the recent advances in engineering BGLs with enhanced enzymatic properties. We outline the strategies used for BGL engineering as well as discuss the structural features and molecular mechanisms that lead to improved enzymes.

## 2. BGL Engineering Strategies

Enzyme engineering strategies can be classified as nonrational, rational, or semirational, depending on the degree of the sequence, structure, and function information of a target enzyme that is taken into account (Figure 3). The most typical nonrational strategy is directed evolution [16,17], pioneered by Frances H. Arnold, laureate of the 2018 Nobel Prize in Chemistry. A common and effective strategy for rational or semirational design is computer-aided design, which can help reduce experimental costs and shorten development cycles [5]. All three strategies have been applied to engineer BGLs to improve their functionality (Table 1).



**Figure 3.** Directed evolution, computer-aided rational design and semi-rational design strategies for enzyme engineering.

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**Table 1.** Summary of BGL engineering approaches.

Organism Source	Engineering Methods	High Throughput Screening Method	Improved Characteristics	Reference
Clostridium thermocellum (BglA)	Directed evolution Error-prone PCR	Assay medium screening method (0.02% Magenta GlcA)	Thermostability: $\uparrow$ T <sub>i</sub> by 6.4 °C.	[18]
Alteromonas sp. L82 (bgla)	Rational design Site-directed mutation		Glucose tolerance: 40.7% of relative activity (glucose: 4 M).	[13]
Metagenomic library of Turpan Depression ( <i>bgl1317</i> )	Rational design Site-directed mutation		Activity: $\uparrow$ by 80%. Glucose tolerance: $IC_{50}$ from 0.8 to 1.5 M.	[19]
P. oxalicum 16 (16BGL)	Directed evolution Error-prone PCR	Assay medium screening method 6-(β-D-glucopyranosyloxy)-7- hydroxy-2H -1-benzopyran-2-one	Activity: ↑ specific activity 70% at 40 °C.	[20]
Thermotoga naphthophila RKU-10 (TN0602)	Rational design Site-directed mutation		Transglycosylation: ↑ GOS productivity by 50%.	[9]
Soil Macrogenome Library (Bgl15)	Directed evolution Error-prone PCR	Double assay medium screening method (0.1% hesperidin)	Glucose tolerance: $IC_{50}$ from 0.04 to 2.1 M. Thermostability: $T_{1/2}$ from 0.8 h to 180 h at 50 °C.	[21]
Trichoderma harzianum (ThBgl)	Rational design Site-directed mutation		Glucose tolerance: 300% of relative activity (glucose: 0.25 M). pH: stability at broad range (pH 4–9).	[22]
Caldicellulosirutor Saccharolyticus (CsBglA)	Semi-rational design Site-directed mutation	Cell surface display Fluorescence detection medium screening method (pNPG)	Activity: $\uparrow K_{cat}/K_{M}$ by 150% at 55 °C.	[23]
GenBank FJ686869 (Bgl1D)	Directed evolution Error-prone PCR	Assay medium screening method (0.1% hesperidin)	Activity: $\uparrow K_{cat}/K_M \sim 23$ -fold. Thermostability: $\uparrow T_{1/2} \sim 10$ -fold.	[24]
Paenibacillus polymyxa (Glu1C)	Rational design Site-directed mutation		Thermostability: ↑ ~4-fold. Glucose tolerance: from 50% to 75% active at 1 M glucose.	[25]
Talaromyces amestolkiae (BGL-1)	Rational design Site-directed mutation		Transglycosylation: ↑ epigallocatechin gallate productivity by 48.8%.	[26]
Trichoderma reesei	Directed evolution (UV light, N-methyl-N'- nitro-N-nitrosoguanidine)	Detection medium screening method (phosphoric acid-swollen cellulose)	Activity: ↑ ~5-fold.	[27]
T. reesei (TrCel1b)	Rational design (Hydropathy index for enzyme activity) Site-directed mutation		Transglycosylation: †disaccharides productivity by 3.5-fold.	[28]
Bacillus sp. D1 (BglD1)	Semi-rational design Site-directed mutagenesis		Transglycosylation: ↑ GOS productivity by 11.5%.	[29]
Marine microbial metagenomic library (Bgl1A)	Semi-rational design Site-directed mutagenesis		Glucose tolerance: $\uparrow IC_{50} \sim 1.4$ - to 2.4-fold. Thermostability: $\uparrow T_{1/2} \sim 4.3$ -fold.	[30]
Lentinula edodes (LXYL-P1)	Rational design Site-directed mutagenesis		Activity: ↑ ~3-fold.	[31]
Penicillium piceum H16	Rational design Site-directed mutation		Thermostability: ↑ by 46.3%.	[32]
Thermotoga Neapolitana (TnBgl1A)	Rational design Site-directed mutation		Transglycosylation: ↑ by 7-fold.	[33]
Neosartorya fischeri (NfBGL)	Rational design Site-directed mutation		Activity: ↑ by 8%.	[34]
A dairy run-off metagenome (BG3L)	Rational design Site-directed mutation		Activity: ↑ ~2 or 3-fold.	[35]
Metagenomic library of Turpan Depression (Bgl6-M3)	Semi-rational design Site-directed mutation		Thermostability: $\uparrow T_{1/2} \sim 20$ -fold. Activity: $\uparrow K_{\rm cat}/K_{\rm M} \sim 5.6$ -fold. Glucose tolerance: $\uparrow \Delta IC_{50}$ of 200 mM.	[36]

# 2.1. Directed Evolution

Directed evolution, an artificial procedure designed to mimic natural evolution, is an effective strategy for protein engineering in the absence of structural and functional knowledge. It accelerates the pace of mutagenesis, recombination, and protein selection in an explicit manner to obtain desired properties. The approach typically comprises an iterative cycle of mutagenesis to generate diverse mutants followed by high-throughput screening [37].

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#### 2.1.1. Generation of Diverse Mutants

With advances in molecular biology tools and techniques, several mutagenesis strategies have been developed for DNA sequence diversification. Two natural evolutionary processes, random mutation and genetic recombination, have been employed to generate sequence diversification in vitro. Random mutagenesis is a non-recombination process in which one or more point mutations, additions, deletions, or inversions of the genome take place due to improper DNA replication or damage repair. The methods for generating sequence diversity of BGLs include error-prone PCR [38] and cassette mutagenesis [39]. Our laboratory has improved multiple enzymatic characteristics of 16BGL using error-prone PCR, including enhanced activity and product tolerance [20]. However, it is difficult for random mutagenesis to obtain highly active mutants. To address this, DNA shuffling similar to the homologous recombination method—was introduced, which is a technique that includes Dnase I limited treatment of targeted DNA for primer-less PCR, PCR with primers, and construction of a mutant library. This technique was successfully utilized and increased the affinity of substrates for BGL [40]. Other recombination methods included the staggered extension process (StEP) [41], random-priming in vitro recombination (RPR) [42], and phage-assisted continuous evolution (PACE) [43], to name a few.

#### 2.1.2. Mutant Screening

Directed evolution necessitates a sensitive and efficient method for high-throughput screening of the huge number of mutants generated. Agar plate and 96-well microplate screening mainly account for traditional library screening. The agar plate-based screening exploits the direct correlation between host growth on selective agar plates and exocytosis of enzymes from cells into the solid medium with specific substrates for rapid screening of improved variants by the size of the halo [44]. The 96-well microplate is currently dominating the screening tests due to its flexibility in sample manipulation, low cost, and simple operation. A large number of protocols have been implemented by machine automation; however, in practice, the micro-titration plate method is limited to screening tens of thousands of clones [45].

In recent years, researchers have developed many efficient, precise, and sensitive methods for screening mutant libraries such as fluorescence-activated cell sorting (FACS), microfluidics technology, and deep mutation scanning (DMS). FACS, an advanced high-throughput screening technique, allows rapid screening and sorting of cells or other suspension particles according to their fluorescent features [46]. Hardiman et al. used FACS to screen BGL mutants with higher specificity and catalytic efficiency [47]. However, due to its high non-specific background, FACS necessitates further rescreening and can only be used to analyze intracellular or membrane-bound products that produce a fluorescent signal associated with target compounds. The analysis of extracellular products is challenging when using FACS [48]. All these advanced methods require complex setups and sufficient expertise in microfluidics, optics, electronics, and programming to fully operate the functional sorting equipment. Recently, Yao et al. reported a red-emission probe for the determination of BGL synthesized through conjugating a glucoside to an aggregation-induced emission (AIE) fluorophore, which offers intriguing ideas about screening for highly active BGLs [49].

#### 2.1.3. Machine Learning-Assisted Directed Evolution

Most of the time, directed evolution is limited by the fact that even the most high-throughput screening or selection methods sample only a small portion of the sequence space for hits with improved function and discard unimproved sequences. It has been shown that machine learning (ML)-assisted directed evolution methods can use the information extracted from these unimproved mutants to accelerate evolution and expand the number of enzymes that can be optimized for desired performance [50]. In addition, ML has been used to more intelligently navigate sequence space during directed evolution of protein function, and to produce proteins from scratch that satisfy sets of constraints associ-

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ated with binding interfaces [51]. Computational power is consistently increased, while the sequencing costs and time continue to decline. Therefore, ML-based targeted evolutionary applications will become more feasible and fuel the engineering of BGL enzymes.

#### 2.2. Rational Design

Though directed evolution is powerful, it is still challenging to obtain improved mutants because of the complexity of building a sensitive and efficient screening system as well as the high workload of screening huge mutant libraries. Computer-aided rational design has become a favored strategy. It entails a thorough comprehension of active sites and functions of enzymes, and specific residues are selected for targeted mutagenesis. The three main methods used to help identify mutation-specific residues are structural analysis, multiple sequence alignment (MSA), and robust computational techniques [37].

# 2.2.1. Structural Analysis

In most cases, molecular modeling of proteins is the first step in structural analysis. Currently, a significant number of protein structures are being registered in the Protein Data Bank (PDBs) and the AlphaFold Protein Structure Database [52] to facilitate homology modeling studies. The sequence similarity of newly discovered proteins can model structures based on sequence comparisons with similar protein sequences as long as the sequence similarity is high enough (>25%). There are several famous homology modeling tools available, such as Yang Zhang Lab (https://zhanggroup.org/, accessed on 1 May 2023), Swiss-Model [53], or Rosetta [54].

Subsequently, structural analysis methods can select mutation sites by comparing structures with high/low protein sequence homology or by observing the structures surrounding active pockets. In general, observation of the structures around active pockets can be achieved by docking the substrate to the enzyme. Commonly used docking tools are AutoDock [55], AutoDock Vina [56], Glide [57], and GOLD [58].

# 2.2.2. Multiple Sequence Alignment (MSA)

For desired modifications, conserved amino acid residues are identified by alignment with other related sequences. Residues with low conserved scores, which are not essential for enzymatic structure and function, can be utilized as targeted sites for modification. Common MSA tools include ClustalW, Clustal Omega, MAFFT, T-Coffee, etc. [59]. Since proteins' structures evolve more slowly than their sequences, integrating structural information in MSA can enhance the quality of alignment and provide more reliable data for analysis. Structure-based MSA tools include 3D-COFFEE, EXPRESSO and MICAlign [60].

## 2.2.3. Computational Approaches

With advances in computational biology, many strategies for identifying protein engineering hotspots have been developed. Molecular dynamics (MD) simulations, which help predict mutation sites by providing atomic information about dynamic molecular interactions that determine protein properties, have achieved significant breakthroughs with the use of graphical processing units over the years [61]. Virtual screening is used to find potential candidates through a fast search of large enzyme libraries based on computational simulations, which is considered a promising alternative computational design approach before the experimental screening of mutant libraries [62]. The neural network-based model AlphaFold2 [63] provides help in identifying amino acid substitution sites by accurately predicting protein structures, while Rosetta, developed by Baker, also provides assistance by modeling protein–protein complexes, docking small molecule ligands into proteins [64].

However, it is impossible for MD simulations or Rosetta to typically capture the data about the overall global behavior and properties of proteins [65]. A data-driven approach of ML combined with statistics overcame this disadvantage by inferring the numerous and possibly unknown factors which map from sequence to function according to the above data and provided superior predictive accuracy for predicting mutation sites in BGL [66].

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For example, a regression model based on a dual-input convolutional neural network was used to predict the binding affinity of cellulase to the substrate to improve enzyme activity [67]. Due to the lack of negative sequence examples in the DMS dataset, and the inability to learn directly from the large-scale sequence function DMS dataset with the ML-supervised method, a method was developed to classify the DMS dataset as positive unlabeled data and successfully applied to design thermally stable BGLs [68]. It is believed that the availability of computational tools such as ML will become more crucial along with screening capacity, computational power, and increased workload.

# 2.2.4. Site-Directed Mutagenesis (SDM)

SDM is an important tool in protein engineering and is also known as oligonucleotide-specific mutagenesis or site-specific mutagenesis. Typical SDM methods are the overlapping extension PCR (OEP) and the whole-plasmid single-round PCR. OEP uses complementary primers to amplify two DNA fragments with overlapping ends [69]. Sun et al. used OEP to obtain a BGL mutant with higher glucose tolerance than the wild type [13]. However, the long-length PCR products, which are used as primers, limit the amplification efficiency in OEP. Guo et al. introduced an improved OEP method to increase the amplification efficiency of long-length multisite directed fragments by providing primers continuously [70]. The whole-plasmid single-round PCR method is involved in PCR replication of double-stranded plasmid DNA template using two complementary primers with the desired mutation for better glucose tolerance [37].

## 2.3. Semi-Rational Design

Semi-rational design exploits the advantages of directed evolution and rational design and requires information about protein sequence, structure and function with predictive algorithms. Several targeted sites are identified and mutated to form "smart" libraries and to obtain the desired mutants [71]. Therefore, the mutant libraries generated by this approach are usually small. Semi-rational design is generally achieved by directed evolution and site-saturated mutagenesis. Two web-based computational tools are worth mentioning, the HotSpot Wizard server which combines information from extensive sequence and structure database searches with functional data to create a map of mutation candidate residues for enzymatic activity of BGL [72,73], and Consensus Finder which uses a consensus sequence approach to identify the most frequently occurring amino acids, to replace rarely occurring amino acids, and to achieve BGL with high thermostability [36,74]. In addition to sequence-based design strategies, there exists effective methods based on protein structural information, such as combinatorial active-site saturation test [75], and focused rational iterative site-specific mutagenesis [76]. Both methods involve saturation mutagenesis at sites lining the binding pocket with the help of in-silico methods such as ML [77]. Similarly, both MD simulations and ML are valuable tools for efficiently exploring the effects of amino acid substitutions on protein structure and function in semi-rational design.

## 3. Engineering of BGL Functionalities

#### 3.1. Enhancing Activity

Table 2 summarizes examples of BGL activity enhancement in recent years. Currently, computer-assisted semi-rational design is considered a very promising strategy for improving BGLs activity based on its advantage of balancing the size of the mutant library to reduce screening effort while obtaining the desirable results [73]. In addition, the molecular mechanisms of BGL activity enhancement have been revealed in order to engineer BGL [73,78]. Some studies focus on engineering the active-site tunneling residues. The BGL–cellobiose complex is mainly stabilized by hydrogen-bonding and hydrophobic interactions between cellobiose and side chains of amino acids located at the glycone (–1) and aglycone (+1) sites, such as the conserved Tyr320 from Neosartorya fischeri (NfBGL) [34]. BGL activity is also shown to be related to high glycosylation, as deglycosylation results in a significant decrease in enzymatic activity [10]. BGL has also been studied to focus on the

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loops and residues interacting with substrates. Higher substrate affinity with BGL may be due to the F256 binding residue that is located on a shorter loop [79]. The Exiguobacterium marinum BGL was found to be able to process longer cello-oligosaccharides, which is atypical in the GH1 family, and the discovery of this structure at the topologically specific catalytic interface provides a theoretical basis for designing BGLs with a strong capacity for cleaving cellulose oligosaccharides [80].

<b>Table 2.</b> Summary of	protein	engineering	g studies to :	improve B	GL activity.

Organism	Strategy	Mutations	Molecular Effects	Improved Characteristics	References
Halothermothrix orenii (B8CYA8)	Rational design OEP	V169C, I246A	Lack of stable polar contacts; Reduction in side chain volume	Specific activity ↑ ~2-fold.	[81]
Coniophora puteana (CpBgl)	Semi-rational design (HotSpot, Alanine scanning technique) SDM	Q20C, A240S	A combination of structural changes in the active pocket and protein-ligand interactions	↑ By 65.75% and 58.58%, respectively.	[73]
Chaetomella raphigera (D2-BGL)	Directed evolution Error-prone PCR	F256M/Y260D /D224G	F256 and Y260 on a short loop related to the high substrate affinity of the enzyme	↑~2.7-fold.	[82]
Metagenomic library of Turpan soil ( <i>Bgl1317</i> )	Rational design SDM	A397R, L188A, A262S	Increase in the polarity of residues and hydrogen bonding contacts	↑ By 80%.	[19]
Talaromyces leycettanus JCM12802	Rational design OEP	M36E, M36N, F66Y, E168Q	Increase in hydrophobic stacking interactions and hydrogen bonding networks of active centers	↑~1.4–2.3-fold.	[83]
P. oxalicum 16 (16BGL)	Directed evolution Error-prone PCR	M280T/V484L /D589E	Increase in the number of hydrogen bonds formed by the substrate to increase the binding free energy	↑ By 22%.	[6]
C. saccharolyticus	Directed evolution Error-prone PCR, Random drift mutagenesis		Smaller residues near catalytic residues allow more flexibility in the active site or more access to the substrate	↑~2-fold.	[47]
P. oxalicum 16 (16BGL)	Directed evolution Error-prone PCR	G414S/D421V/ T441S	Tighter active site pockets	↑ Specific activity 70% at 40 °C.	[20]
Pyrococcus furiosus (CelB)	Directed evolution DNA shuffling	N415S		↑ Up to 3-fold.	[40]
C. saccharolyticus (CsBglA)	Semi-rational design (SDM combined with random mutagenesis)	L64R/Y73F/ T221N/H324L		$\uparrow$ K <sub>cat</sub> /K <sub>M</sub> by 150% at 55 °C.	[23]

# 3.2. Improving Product Tolerance

The tandem enzymatic saccharification of lignocellulose releases the product (glucose) that inhibits BGLs, leading to the accumulation of cellobiose which further inhibits CBH and EG. Therefore, excellent BGL enzymes should be able to tolerate high-concentrations of glucose. Here, we summarize some mechanisms and strategies of the glucose-tolerant and stimulated BGL action discovered in recent years.

The majority of glucose-tolerant BGLs belong to the GH1 family, because most GH1 BGLs have a narrow and deep substrate binding pocket which is difficult for glucose to enter, and this binding pocket can be binned into three regions: glycone-binding site (–1 subsite), aglycone-binding site (+1 and +2 subsites), and the gatekeeper region [84]. Based on this property, the molecular mechanism of BGL product tolerance suggests that increasing the hydrophobicity of the aglycone-binding sites (+1 and +2 subsites) in the active site tunnel and the hydrophobicity and steric properties of the non-conserved residues in the gatekeeper region can improve BGL product tolerance. Other inactive sites are also associated with high tolerance of BGL products, including separate glucose binding sites [85] and some active channel residues [86]. Table 3 summarizes examples for enhancing product tolerance of BGLs in recent years.

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Table 3. Summar	v of protein	engineering	r studies fo	r enhancing	product tolerance	of BCI e
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Organism	Strategy	Mutations	Molecular Effects	Improved Characteristics	References
Metagenomic library of Turpan soil ( <i>Bgl1317</i> )	Rational design SDM	L188A, A262S	Active site metastable interactions	IC <sub>50</sub> from 0.8 to 1.5 M.	[19]
Agrobacterium tumefaciens 5A (H0HC94)	Rational design SDM OEP	W127F, C174V, V176A, L178A, L178E, H229S	Increase in the hydrophobicity of the aglycone-binding sites and gatekeeper regions	↑~2.2-fold	[87]
Trichoderma Harzianum (ThBgl)	Rational design SDM	L167W/P172L	Replacement of gatekeeper residues to alter active site accessibility	300% of relative activity (glucose: 0.25 M).	[22]
T. Cel1A (Bgl II)	Rational design SDM OEP	L167W/P172L	Replacement of gatekeeper residues to narrow the entrance to the active pocket	$IC_{50} = 650 \text{ mM}.$	[88]
Humicola insolens (Bglhi)	Directed evolution Error-prone PCR	H307Y, D237V, N235S	Increasing trans-glycosylation Unbinding of unproductive substrates		[89]
A. tumefaciens 5A			Presence of separate glucose binding sites		[90]
Marine microbial Metagenome (SrBGL)	Rational design SDM	H228T	Interaction leading to glucose excretion by slingshot mechanism	↑ Affinity score for cellobiose.	[91]
H. orenii (B8CYA8)	Rational design SDM	V169C/E173L/ I246A	Increasing backbone kinetics of active channel residues and flexibility of active site pockets	75% of specific activity in 1.0 M glucose.	[84]
GenBank MK490918 (Bg115)	Directed evolution Error-prone PCR Petri-dish-based double-layer high-throughput screening	S167V/W178L	Increasing transglycosylation activity	IC <sub>50</sub> from 0.04 to 2.1 M.	[21]
Marine bacteria ( <i>bgla</i> )	Rational design OEP	F171W	Increase in volume of side chains near the active site	40.7% of relative activity (glucose: 4 M).	[13]
Hot-spring metagenome (BglM)			The narrow space between the remnants of the gatekeeper's base		[92]

A low concentration of glucose stimulates BGL activity, which may be caused by alleviating substrate inhibition [88]. A novel mechanism of BGL stimulation by "saccharide capture" through the response of the monosaccharide secondary binding region to alter the size of the catalytic gap entrance has also been recently proposed [93]. Indeed, the stimulation of BGL activity in response to glucose is sometimes not clearly explained by a single mechanism. The stimulation phenomenon may be explained by a competitive mechanism of glucose with the nonproductive binding of substrate and by transglycosylation, and the possible contribution of the two mechanisms in the activation by inhibitor was dependent on the rate-limiting step of glycosidic bond hydrolysis as well as on whether and which glucose-unit-binding subsites are interacting [94].

In brief, studies on glucose tolerance and stimulation of BGL have attributed this phenomenon to several mechanisms, including metastable effects, transglycosylation, disinhibition of substrates, and unbinding of nonproductive substrates. In addition, a relatively complete database of glucose tolerance of BGL products, Glutant $\beta$ ase, provides valid information for its rational design [91].

#### 3.3. *Improving Transglycosylation*

In nature, glycosylation is mainly accomplished by Leloir glycosyltransferases [95]. However, glycosyltransferases are not ideal enzymes for glycosylation reactions due to their costly and complex processing. Glycosidic bonds also come to be formed through kinetically controlled transglycosylation of BGLs (Figure 2) with broad specificity and high stereoselectivity for natural or engineered substrates [96]. To improve the transglycosylation-to-hydrolysis (T/H) ratio, an effective strategy is to restrict the hydrolysis reaction to transglycosylation. As shown in Table 4, the rational design of targeted BGL catalytic tunneling of subsite residues provides methodological strategies: (1) reducing the binding in

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glycone (–) subsites; (2) increasing the affinity in aglycone (+) subsites; and (3) disrupting the binding of catalytic water: mainly by removing the hydrogen-bonding interactions with the catalytic water and the retention of nucleophilic water molecules at key amino acid residues, or enhancing the hydrophobicity at the active site entry or acceptor subsite [95]. For example, the Hydropathy Index For Enzyme Activity (HIFEA) strategy to reduce the hydrophilic index of BGL amino acid residues has been used for the rational design of oligosaccharide synthesis [28].

Table 4. Protein	engineering	to enhance	BGL tr	ansolvcos	vlation
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Organism	Strategy	Mutations	Molecular Effects	Improved Characteristics	References
T. amestolkiae (BGL-1)	Rational design SDM	E521G	Stimulating glycosyl donor departure. Absence of side chains to reduce steric hindrance	↑ Epigallocatechin gallate productivity by 48.8%.	[26]
T. naphthophila RKU-10 (Tn0602)	Rational design SDM	F226G/F414S	Reducing steric hindrance and removing interactions at the aglycone-binding sites	↑ GOS productivity ~1.3-fold.	[97]
T. naphthophila RKU-10 (Tn0602)	Rational design SDM	F414S	Improving hydrophilicity of the lumen of the $-1$ subsite	↑ GOS productivity by 50%.	[9]
Thermotoga maritima (TmBglA)	Rational design SDM	N222F/Y295F /F414S	Creating a more suitable environment for hexanol in the active center pocket to inhibit hydrolysis	Hexyl-β-glycoside productivity from 14.49 to 22.8 mM.	[96]
A. niger (BGL1)	Directed evolution Error-prone PCR	Y305C	Reducing hydrolytic activity	$K_i$ from 2.98 to 4.78 mM.	[98]
T. neapolitana (TnBgl1A)	Rational design SDM	N220F, N220R, N220Y	Inhibiting hydrolysis	Transglycosylation/hydrolysis from 0.33 to 1.45–2.71.	[95]
T. reesei (TrCel1b)	Rational design SDM HIFEA Strategy	I177S/I174S/ W173H	Inhibition of hydrophilicity of key amino acid residues in the catalytic sites	† Disaccharides productivity by 3.5-fold.	[28]

#### 3.4. Improving Thermostability

BGL plays a key role in consolidated bioprocessing; however, high temperature causes BGL denaturation [11,99]. A comparative analysis on the enzymatic properties and amino acid composition of mesophilic, thermophilic, and hyperthermophilic BGLs revealed a number of factors that contribute to the thermal stability of proteins, such as hydrophobic effects [100,101], hydrogen-bonding and electrostatic interactions [100,102], aromatic interactions [100,103], protein structural densification [100], reduction in unfolding entropy [99,101], etc.

Structural comparison revealed that thermophilic and hyperthermophilic enzymes are more rigid than mesophilic enzymes. Since high temperatures unfold the highly flexible regions of the proteins quickly, flexibility can be used as an indicator to identify potential areas for modification to improve the thermal stability of BGLs [104]. Most of the current studies target mutations in flexible regions to increase protein rigidity and thermal stability. Common experimental methods used to determine protein flexibility include high-resolution ultrasound spectroscopy, pressure perturbation calorimetry, and nuclear magnetic resonance spectroscopy [100]. With the improvement of algorithm optimization and computational capacity, a series of bioinformatics software has been developed for analyzing protein structures and predicting flexible regions, as shown in Table 5.

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**Table 5.** Methods for improving protein stability.

Method	Access	Description	Reference
Constraint network analysis (CAN)		Local and global flexibility/stiffness properties of proteins calculated by the graph theory-based rigidity analysis of thermal unfolding simulation.	[105]
MD simulation	e.g., GROMACS	Analysis of protein unfolding pathways at higher temperatures.	[71]
B-Fitter	https://www.kofo.mpg.de/en/ research/organic-synthesis, accessed on 23 April 2023	Calculates and averages the B-factor values for all atoms in an amino acid.	[71]
FoldUnfold	http://bioinfo.protres.ru/ogu/, accessed on 23 April 2023	Uses the expected average number of contacts per residue calculated from the amino acid sequence as an indicator for whether a given region is folded or unfolded.	[106]
PredyFlexy	https://www.dsimb.inserm.fr/ dsimb_tools/predyflexy/, accessed on 23 April 2023	Combines the B-factor with the state of motion of amino acid residues during molecular dynamics simulations.	[104]
FIRST		Representation of protein structure as a set of constraints on bond-angle interactions, identification of rigid and flexible regions of protein conformation by CAN.	[107]
FlexPred	https://kiharalab.org/flexPred/, accessed on 23 April 2023	Flexibility in predicting elastic residues using the SVM algorithm.	[104]
Rosetta Design	Rosetta 3.13 software	Design of thermally stable proteins based on iterative sidechain optimization and backbone relaxation through optimizing packing and idealizing backbone conformation.	[100]
FRESCO		Combined with MD simulations to predict flexible regions of proteins that can incorporate stable disulfide bonds.	[108]
HINGEprot	http://bioinfo3d.cs.tau.ac.il/ HingeProt/, accessed on 23 April 2023	Predicts the hinge region of a protein.	[104]
PROSS	http://pross.weizmann.ac.il, accessed on 23 April 2023	Calculation of $\Delta\Delta G$ and thus analysis of potential stable mutation locations using Rosetta combination sequences.	[109]
FireProtDB	https://loschmidt.chemi.muni.cz/ fireprotdb/, accessed on 23 April 2023	Numerical data, structural information for mutation experiments with a variety of proteins.	[110]

After the flexible regions are identified, two main strategies are used to rigidize the flexible region to improve thermostability. One strategy is to enhance the stability of the enzyme by reducing the conformational entropy in the unfolded state [100], and common methods include introducing disulfide bonds in the flexible region or replacing glycine with the most rigid proline. It has been proposed that truncating the flexible loops of the protein can also reduce the conformational entropy of BGL [104]. Another strategy is to stabilize the folded state by increasing favorable interactions (including hydrophobic interactions and hydrogen bonds, etc.) or removing negative interactions. There are also studies focused on increasing the densification of the BGL structure (by truncating the carbohydrate-binding domain) [111].

The most crucial thing is to assess the thermostability of mutants at high temperatures. A common strategy is to perform melting temperature ( $T_m$ ) analysis by differential scanning fluorescence or differential scanning calorimetry. In addition, the unfolded Gibbs free energy ( $\Delta G$ ) can also measure stability.  $T_m$  and  $\Delta G$  can be predicted by computational tools based on force fields and ML, such as FoldX, Rosetta Design, etc. [107]. However, studies also stress the need for new computational tools that can not only more accurately predict significant changes in thermal stability, but also extend to more refined moderate changes [112].

In brief, the factors affecting enzyme thermal stability suggest a series of methods and strategies for identifying flexible regions and protein rigidity, as well as computational methods for assessing thermal stability properties of mutants. Table 6 summarizes the

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instances on BGL thermal stability engineering in recent years. We hope this summary will benefit the development of computational predictors for engineering the thermostability of enzymes including BGLs.

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Table 6.	Protein	engine	erino toi	r enhancino	the therma	ıl stability	tot BC-L
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Organism	Strategy	Mutations	Molecular Effects	Improved Characteristics	References
Penicillium funiculosum (PfBgl3A)	Rational design SDM				[113]
A. tumefaciens 5A (H0HC94)	Rational design SDM OEP	W127F, V176A, L178A, L178E	Enhancement of hydrophobic interactions	$\uparrow$ T <sub>1/2</sub> ~2 or 3-fold.	[87]
Metagenomic library of Turpan Depression (Bgl6)	Directed evolution Quikchange	V174C/A404V/ L441F	Enhancement of hydrophobic interactions within the enzyme		[85]
Thermomicrobium roseum (B9L147)	Rational design SDM OEP	V169C		$\uparrow$ T <sub>1/2</sub> ~2-fold.	[114]
H. orenii	Rational design SDM	V169C/E173L/ I246A	Increase in hydrophobic interactions	$T_{1/2} > 7 \text{ h at } 70 ^{\circ}\text{C}.$	[84]
GenBank MK490918 (Bg115)	Directed evolution Error-prone PCR Petri-dish-based double-layer high-throughput screening	S39T/L42N/ V167C/W178L/ A251L/E319A/ E326P/A396V/ L433F	Increasing hydrophobic interactions and formation of more additional hydrogen bonds	T <sub>1/2</sub> from 0.8 h to 180 h at 50 °C.	[21]
P. piceum H16	Rational design Proline theory Computer-assisted virtual saturation mutation	S507F/Q512W/ S514W	Mutation of glycine by proline reducing conformational entropy Increased hydrophobic interactions	↑ By 46.3%.	[32]
C. thermocellum (BglA)	Directed evolution Error-prone PCR	A17S/K268N	Increasing hydrophobic interactions	$\uparrow$ T <sub>i</sub> by 6.4 °C.	[18]
GenBank FJ686869 (Bgl1D)	Directed evolution DNA shuffling	S28T/Y37H/ D44E/R91G/ L115N	Enhancing interaction with protein structure around water molecules and introduction of more hydrogen bonds	$\uparrow$ T <sub>1/2</sub> ~10-fold.	[24]
GenBank HV348683 (Ks5A7)	Directed evolution Error-prone PCR	T167I/V181F/ K186T/A187E/ A298G	Increasing hydrophobic interactions with the protein core	↑ T <sub>1/2</sub> ~8640-fold.	[115]
Coniophora puteana (CpBgl)	Semi-rational design (HotSpot, Alanine scanning technique) SDM	Q20C, A240S	A combination of structural changes in the active pocket and protein-ligand interactions	$\uparrow$ T <sub>1/2</sub> ~5-fold.	[73]
MeBglD2	Rational design Directed evolution	His8/Asn59/ Gly295	Increasing hydrophobic interactions with the protein core	↑T <sub>m</sub> by 9°C.	[116]

# 3.5. Improving Catalytic Performance in Unconventional Phase

Maintaining high activity in unconventional phase (e.g., ionic liquid (IL), saline concentrated seawater, or organic solvents) is critical for applications of BGLs in lignocellulosic biocatalysis, saline land improvement, and marine cellulose biomass utilization [15,117]. Therefore, it is important to understand the mechanisms that BGLs can tolerate in the unconventional environment during catalysis and use these mechanisms to guide the discovery of BGLs with higher activity/stability.

Surface charge engineering is a promising approach from the perspective of IL tolerance. Mutants with increased negative surface charge showed higher catalytic efficiency in IL due to the electrostatic repulsion between IL and the salt-bridge network of BGL [15]. The salt tolerance of mutants is improved by increasing the acidic amino acids on the protein surface and near the entrance of the active site to hinder the entry of high concentrations of salt ions into the active site [13,78]. Additionally, the increased electrostatic interactions may be responsible for organic solvent tolerance [118]. In addition, semi-rational design would be a promising approach to further explore the molecular basis of the BGL activity and stability in unconventional phase catalysis.

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#### 3.6. Improving pH Stability

The pH stability of BGLs is crucial for industrial applications including brewing, feed making, and paper making [119]. However, most natural BGLs are limited to a relatively narrow pH range (4.5–5) with optimal activity. It is necessary to engineer BGLs with altered or broadened pH performance. The optimal pH value of BGLs is widely attributed to the pKa of catalytic residues. Although the PROPKA software makes it simple to estimate the pKa's of ionizable residues [120], the estimation may not be sufficiently accurate for practical use because pKa is regulated by a few complex factors and the active-site microenvironment. Therefore, it is still challenging to alter the pH performance of an enzyme by merely changing the pKa value of the catalytic residue [14]. The high pH tolerance of BGLs may be related to the presence of a large number of surface-accessible negatively charged residues that keep the protein hydrated and protect the protein core from hydroxyl ion attack [114]. SDM of charged amino acids near the catalytic residues has broadened the pH activity distribution of BGLs [121]. With more detailed molecular mechanisms uncovered, BGL mutants with better pH properties can be designed in the future.

#### 4. Conclusions

In conclusion, we provide a brief review of recent advances in approaches and functionality studies for engineering BGLs with better properties for biotechnological and industrial applications. Directed evolution continues to be a valuable solution for BGL engineering, but it is of note that a sensitive and efficient method must be developed for high-throughput screening of large mutant libraries. Advances in screening strategies will further strengthen the application of directed evolution for BGL optimization. With the rapid advancement of structural and computational biology, the experimental structures as well as the high-quality structural models (e.g., AlphaFold2 models) for BGL enzymes are now available, making computer-aided rational design a more preferred choice for BGL engineering by biochemists. With more and more functional assay data accumulating, it is also desirable to develop data-driven approaches such as ML algorithms to fuel BGL engineering.

Indeed, more and more targeted glycoproteomic studies are emerging to gain insight into the effects of glycosylation modifications on the enzymatic properties of BGL. This has not only provided a novel perspective on efforts to improve the activity and stability of BGL but has also inspired and encouraged other researchers to explore the field of glycoengineering of BGL. In addition, with the accumulation of more and more protein data and the huge screening workload, it is believed that artificial intelligence tools such as deep learning that can leverage more big data will be the mainstay to power the engineering of BGLs and even open up the possibility of de novo design of BGL in the future.

**Author Contributions:** Conceptualization, X.Z., B.O. and G.W.; methodology, X.Z., B.O. and G.W.; validation, X.Z., B.O. and G.W.; formal analysis, B.O. and G.W.; investigation, N.Z., B.O. and G.W.; resources, B.O. and G.W.; data curation, B.O. and G.W.; writing—original draft preparation, B.O. and G.W.; writing—review and editing, X.Z., Y.H. and J.Z.; visualization, B.O. and G.W.; supervision, X.Z.; project administration, X.Z.; funding acquisition, X.Z. All authors have read and agreed to the published version of the manuscript.

**Funding:** This research was funded by the National Natural Science Foundation of China (22068014, 21666010), and the Doctoral Starting up Foundation of Jiangxi Normal University (5451).

**Institutional Review Board Statement:** Not applicable.

Informed Consent Statement: Not applicable.

Data Availability Statement: Not applicable.

**Acknowledgments:** We thank Xiaoqiang Huang at the University of Michigan, Ann Arbor for the invitation of this article.

**Conflicts of Interest:** The authors declare no conflict of interest.

Sample Availability: Not available.

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#### References

 Sharma, J.; Kumar, V.; Prasad, R.; Gaur, N.A. Engineering of Saccharomyces cerevisiae as a consolidated bioprocessing host to produce cellulosic ethanol: Recent advancements and current challenges. *Biotechnol. Adv.* 2022, 56, 107925. [CrossRef] [PubMed]

- 2. Gutierrez-Gutierrez, D.A.; Fuentes-Garibay, J.A.; Viader-Salvado, J.M.; Guerrero-Olazaran, M. Biochemical characterization of the beta-glucosidase Glu1B from Coptotermes formosanus produced in Pichia pastoris. *Enzym. Microb. Technol.* **2023**, *163*, 110155. [CrossRef] [PubMed]
- 3. Wang, H.; Lin, X.; Li, S.; Lin, J.; Xie, C.; Liu, D.; Yao, D. Rational molecular design for improving digestive enzyme resistance of beta-glucosidase from Trichoderma viride based on inhibition of bound state formation. *Enzym. Microb. Technol.* **2020**, 133, 109465. [CrossRef] [PubMed]
- 4. Amer Ahmed, F.u.-H.N.; Batool, K.; Bibi, A. *Microbial β-Glucosidase: Sources, Production and Applications*; Science and Education Publishing Co., Ltd.: Newark, DE, USA, 2017.
- 5. Zhang, R.; Cao, C.; Bi, J.; Li, Y. Fungal cellulases: Protein engineering and post-translational modifications. *Appl. Microbiol. Biotechnol.* **2022**, *106*, 1–24. [CrossRef] [PubMed]
- 6. Wang, K.; Huang, Q.; Li, H.; Zhao, X. Co-evolution of beta-glucosidase activity and product tolerance for increasing cellulosic ethanol yield. *Biotechnol. Lett.* **2020**, 42, 2239–2250. [CrossRef] [PubMed]
- 7. Godse, R.; Bawane, H.; Tripathi, J.; Kulkarni, R. Unconventional beta-Glucosidases: A Promising Biocatalyst for Industrial Biotechnology. *Appl. Biochem. Biotechnol.* **2021**, *193*, 2993–3016. [CrossRef]
- 8. Chen, H.; Jin, X.; Zhu, L.; Lu, Y.; Ma, Z.; Liu, S.; Chen, X. Glycosyl hydrolase catalyzed glycosylation in unconventional media. *Appl. Microbiol. Biotechnol.* **2020**, *104*, 9523–9534. [CrossRef] [PubMed]
- 9. Yang, J.; Wang, Q.; Zhou, Y.; Li, J.; Gao, R.; Guo, Z. Engineering *T. naphthophila* β-glucosidase for enhanced synthesis of galactooligosaccharides by site-directed mutagenesis. *Biochem. Eng. J.* **2017**, 127, 1–8. [CrossRef]
- 10. Boudabbous, M.; Ben Hmad, I.; Saibi, W.; Mssawra, M.; Belghith, H.; Gargouri, A. Trans-glycosylation capacity of a highly glycosylated multi-specific beta-glucosidase from Fusarium solani. *Bioprocess. Biosyst. Eng.* **2017**, *40*, 559–571. [CrossRef]
- 11. Rocha, R.E.O.; Mariano, D.C.B.; Almeida, T.S.; CorreaCosta, L.S.; Fischer, P.H.C.; Santos, L.H.; Caffarena, E.R.; da Silveira, C.H.; Lamp, L.M.; Fernandez-Quintero, M.L.; et al. Thermostabilizing mechanisms of canonical single amino acid substitutions at a GH1 beta-glucosidase probed by multiple MD and computational approaches. *Proteins* 2023, 91, 218–236. [CrossRef]
- 12. Gonzalez-Blasco, G.; Sanz-Aparicio, J.; Gonzalez, B.; Hermoso, J.A.; Polaina, J. Directed evolution of beta -glucosidase A from Paenibacillus polymyxa to thermal resistance. *J. Biol. Chem.* **2000**, 275, 13708–13712. [CrossRef]
- 13. Sun, J.; Wang, W.; Ying, Y.; Hao, J. A Novel Glucose-Tolerant GH1 beta-Glucosidase and Improvement of Its Glucose Tolerance Using Site-Directed Mutation. *Appl. Biochem. Biotechnol.* **2020**, *192*, 999–1015. [CrossRef]
- 14. Li, S.F.; Cheng, F.; Wang, Y.J.; Zheng, Y.G. Strategies for tailoring pH performances of glycoside hydrolases. *Crit. Rev. Biotechnol.* **2023**, *43*, 121–141. [CrossRef]
- 15. Mu, Y.; Ju, X.; Fu, J.; Meng, F.; Yan, L.; Li, L. Surface charge engineering of β-glucosidase using rational design improves catalytic capacity and ionic liquid tolerance. *J. Mol. Liq.* **2022**, *367*, 120577. [CrossRef]
- 16. Arnold, F.H. Directed Evolution: Bringing New Chemistry to Life. *Angew. Chem. Int. Ed. Engl.* **2018**, *57*, 4143–4148. [CrossRef] [PubMed]
- 17. Romero, P.A.; Arnold, F.H. Exploring protein fitness landscapes by directed evolution. *Nat. Rev. Mol. Cell. Biol.* **2009**, *10*, 866–876. [CrossRef] [PubMed]
- 18. Yoav, S.; Stern, J.; Salama-Alber, O.; Frolow, F.; Anbar, M.; Karpol, A.; Hadar, Y.; Morag, E.; Bayer, E.A. Directed Evolution of Clostridium thermocellum beta-Glucosidase A Towards Enhanced Thermostability. *Int. J. Mol. Sci.* **2019**, 20, 4701. [CrossRef]
- 19. Liu, X.; Cao, L.; Zeng, J.; Liu, Y.; Xie, W. Improving the cellobiose-hydrolysis activity and glucose-tolerance of a thermostable beta-glucosidase through rational design. *Int. J. Biol. Macromol.* **2019**, *136*, 1052–1059. [CrossRef]
- 20. Huang, Q.; Wang, K.; Li, H.; Yi, S.; Zhao, X. Enhancing cellulosic ethanol production through coevolution of multiple enzymatic characteristics of beta-glucosidase from Penicillium oxalicum 16. *Appl. Microbiol. Biotechnol.* **2020**, 104, 8299–8308. [CrossRef]
- 21. Cao, L.; Chen, R.; Huang, X.; Li, S.; Zhang, S.; Yang, X.; Qin, Z.; Kong, W.; Xie, W.; Liu, Y. Engineering of beta-Glucosidase Bgl15 with Simultaneously Enhanced Glucose Tolerance and Thermostability To Improve Its Performance in High-Solid Cellulose Hydrolysis. *J. Agric. Food Chem.* **2020**, *68*, 5391–5401. [CrossRef]
- 22. Santos, C.A.; Morais, M.A.B.; Terrett, O.M.; Lyczakowski, J.J.; Zanphorlin, L.M.; Ferreira-Filho, J.A.; Tonoli, C.C.C.; Murakami, M.T.; Dupree, P.; Souza, A.P. An engineered GH1 beta-glucosidase displays enhanced glucose tolerance and increased sugar release from lignocellulosic materials. *Sci. Rep.* **2019**, *9*, 4903. [CrossRef] [PubMed]
- 23. Lenz, F.; Zurek, P.; Umlauf, M.; Tozakidis, I.E.P.; Jose, J. Tailor-made β-glucosidase with increased activity at lower temperature without loss of stability and glucose tolerance. *Green Chem.* **2020**, 22, 2234–2243. [CrossRef]
- 24. Yin, B.; Hui, Q.; Kashif, M.; Yu, R.; Chen, S.; Ou, Q.; Wu, B.; Jiang, C. Simultaneous Enhancement of Thermostability and Catalytic Activity of a Metagenome-Derived beta-Glucosidase Using Directed Evolution for the Biosynthesis of Butyl Glucoside. *Int. J. Mol. Sci.* 2019, 20, 6224. [CrossRef]
- 25. Sawant, S.; Adlakha, N.; Odaneth, A.A.; Chandrayan, S.K.; Yazdani, S.S.; Lali, A. Role of N166 residue in β-glucosidase catalysis and glucose tolerance. *Appl. Biotechnol. Bioeng.* **2019**, *6*, 142–148.

Molecules **2023**, 28, 4990 15 of 18

 Mendez-Liter, J.A.; Nieto-Dominguez, M.; Fernandez de Toro, B.; Gonzalez Santana, A.; Prieto, A.; Asensio, J.L.; Canada, F.J.; de Eugenio, L.I.; Martinez, M.J. A glucotolerant beta-glucosidase from the fungus Talaromyces amestolkiae and its conversion into a glycosynthase for glycosylation of phenolic compounds. *Microb. Cell. Fact.* 2020, 19, 127. [CrossRef] [PubMed]

- 27. Noguchi, T.; Saito, H.; Nishiyama, R.; Yoshida, N.; Matsubayashi, T.; Teshima, Y.; Yamada, C.; Hiramatsu, S.; Yamada, K.; Kagawa, Y. Isolation of a cellulase hyperproducing mutant strain of Trichoderma reesei. *Bioresour. Technol. Rep.* **2021**, *15*, 100733. [CrossRef]
- 28. Niu, K.; Liu, Z.; Feng, Y.; Gao, T.; Wang, Z.; Zhang, P.; Du, Z.; Gao, D.; Fang, X. A novel strategy for efficient disaccharides synthesis from glucose by β-glucosidase. *Bioresour. Bioprocess.* **2020**, *7*, 45. [CrossRef]
- 29. Deng, P.; Meng, C.; Wu, Y.; Xu, J.; Tang, X.; Zhang, X.; Xiao, Y.; Wang, X.; Fang, Z.; Fang, W. An unusual GH1 beta-glucosidase from marine sediment with beta-galactosidase and transglycosidation activities for superior galacto-oligosaccharide synthesis. *Appl. Microbiol. Biotechnol.* **2020**, *104*, 4927–4943. [CrossRef]
- 30. Fang, W.; Yang, Y.; Zhang, X.; Yin, Q.; Zhang, X.; Wang, X.; Fang, Z.; Yazhong, X. Improve ethanol tolerance of beta-glucosidase Bgl1A by semi-rational engineering for the hydrolysis of soybean isoflavone glycosides. *J. Biotechnol.* **2016**, 227, 64–71. [CrossRef]
- 31. Chen, J.J.; Liang, X.; Chen, T.J.; Yang, J.L.; Zhu, P. Site-Directed Mutagenesis of a beta-Glycoside Hydrolase from Lentinula Edodes. *Molecules* **2018**, 24, 59. [CrossRef]
- 32. Zong, Z.; Gao, L.; Cai, W.; Yu, L.; Cui, C.; Chen, S.; Zhang, D. Computer-Assisted Rational Modifications to Improve the Thermostability of β-Glucosidase from Penicillium piceum H16. *BioEnergy Res.* **2015**, *8*, 1384–1390. [CrossRef]
- 33. Lundemo, P.; Adlercreutz, P.; Karlsson, E.N. Improved transferase/hydrolase ratio through rational design of a family 1 beta-glucosidase from Thermotoga neapolitana. *Appl. Environ. Microbiol.* **2013**, *79*, 3400–3405. [CrossRef]
- 34. Shanmugam, R.; Kim, I.W.; Tiwari, M.K.; Gao, H.; Mardina, P.; Das, D.; Kumar, A.; Jeya, M.; Kim, S.Y.; Kim, Y.S.; et al. Tyr320 is a molecular determinant of the catalytic activity of beta-glucosidase from Neosartorya fischeri. *Int. J. Biol. Macromol.* **2020**, *151*, 609–617. [CrossRef] [PubMed]
- 35. Ehrenreich, C.L. Site-Directed Mutagenesis Studies on a Novel Dual Domain β-galactosidase/β-glucosidase Open Reading Frame Identified from a Dairy Run-Off Metagenome. Master's Thesis, Stellenbosch University, Stellenbosch, South Africa, 2021.
- Li, S.; Cao, L.; Yang, X.; Wu, X.; Xu, S.; Liu, Y. Simultaneously optimizing multiple properties of beta-glucosidase Bgl6 using combined (semi-)rational design strategies and investigation of the underlying mechanisms. *Bioresour. Technol.* 2023, 374, 128792.
  [CrossRef]
- 37. Bansal, S.; Kundu, B. Protein engineering: Methods and applications. In *Advances in Protein Molecular and Structural Biology Methods*; Academic Press: Cambridge, MA, USA, 2022; pp. 641–668.
- 38. McCullum, E.O.; Williams, B.A.; Zhang, J.; Chaput, J.C. Random mutagenesis by error-prone PCR. *Methods Mol. Biol.* **2010**, *634*, 103–109. [PubMed]
- 39. Wells, J.A.; Vasser, M.; Powers, D.B. Cassette mutagenesis: An efficient method for generation of multiple mutations at defined sites. *Gene* 1985, 34, 315–323. [CrossRef] [PubMed]
- 40. Lebbink, J.H.; Kaper, T.; Bron, P.; van der Oost, J.; de Vos, W.M. Improving Low-Temperature Catalysis in the Hyperthermostable Pyrococcus furiosus β-Glucosidase CelB by Directed Evolution. *Biochemistry* **2000**, *39*, 3656–3665. [CrossRef]
- 41. Zhao, H.; Giver, L.; Shao, Z.; Affholter, J.A.; Arnold, F.H. Molecular evolution by staggered extension process (StEP) in vitro recombination. *Nat. Biotechnol.* **1998**, *16*, 258–261. [CrossRef]
- 42. Shao, Z.; Zhao, H.; Giver, L.; Arnold, F.H. Random-priming in vitro recombination: An effective tool for directed evolution. *Nucleic Acids Res.* **1998**, *26*, 681–683. [CrossRef]
- 43. Packer, M.S.; Rees, H.A.; Liu, D.R. Phage-assisted continuous evolution of proteases with altered substrate specificity. *Nat. Commun.* **2017**, *8*, 956. [CrossRef]
- 44. Madhavan, A.; Sindhu, R.; Binod, P.; Sukumaran, R.K.; Pandey, A. Strategies for design of improved biocatalysts for industrial applications. *Bioresour. Technol.* **2017**, 245, 1304–1313. [CrossRef]
- 45. Yi, D.; Bayer, T.; Badenhorst, C.P.S.; Wu, S.; Doerr, M.; Hohne, M.; Bornscheuer, U.T. Recent trends in biocatalysis. *Chem. Soc. Rev.* **2021**, *50*, 8003–8049. [CrossRef] [PubMed]
- 46. Madhavan, A.; Arun, K.B.; Binod, P.; Sirohi, R.; Tarafdar, A.; Reshmy, R.; Kumar Awasthi, M.; Sindhu, R. Design of novel enzyme biocatalysts for industrial bioprocess: Harnessing the power of protein engineering, high throughput screening and synthetic biology. *Bioresour. Technol.* 2021, 325, 124617. [CrossRef] [PubMed]
- 47. Hardiman, E.; Gibbs, M.; Reeves, R.; Bergquist, P. Directed evolution of a thermophilic beta-glucosidase for cellulosic bioethanol production. *Appl. Biochem. Biotechnol.* **2010**, *161*, 301–312. [CrossRef] [PubMed]
- 48. Zeng, W.; Guo, L.; Xu, S.; Chen, J.; Zhou, J. High-Throughput Screening Technology in Industrial Biotechnology. *Trends Biotechnol.* **2020**, *38*, 888–906. [CrossRef]
- 49. Yao, B.; Zhao, J.; Ding, S.; Giel, M.C.; Zhang, G.; Ding, D.; Tang, Y.; Weng, Z.H.; Hong, Y. A novel red-emitting aggregation-induced emission probe for determination of beta-glucosidase activity. *Biomaterials* **2023**, 295, 122046. [CrossRef]
- 50. Yang, K.K.; Wu, Z.; Arnold, F.H. Machine-learning-guided directed evolution for protein engineering. *Nat. Methods* **2019**, *16*, 687–694. [CrossRef]
- 51. Lovelock, S.L.; Crawshaw, R.; Basler, S.; Levy, C.; Baker, D.; Hilvert, D.; Green, A.P. The road to fully programmable protein catalysis. *Nature* **2022**, *606*, 49–58. [CrossRef]

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52. Varadi, M.; Anyango, S.; Deshpande, M.; Nair, S.; Natassia, C.; Yordanova, G.; Yuan, D.; Stroe, O.; Wood, G.; Laydon, A.; et al. AlphaFold Protein Structure Database: Massively expanding the structural coverage of protein-sequence space with high-accuracy models. *Nucleic Acids Res.* **2022**, *50*, D439–D444. [CrossRef]

- 53. Arnold, K.; Bordoli, L.; Kopp, J.; Schwede, T. The SWISS-MODEL workspace: A web-based environment for protein structure homology modelling. *Bioinformatics* **2006**, 22, 195–201. [CrossRef]
- 54. Das, R.; Baker, D. Macromolecular modeling with rosetta. Annu. Rev. Biochem. 2008, 77, 363–382. [CrossRef] [PubMed]
- 55. Morris, G.M.; Huey, R.; Lindstrom, W.; Sanner, M.F.; Belew, R.K.; Goodsell, D.S.; Olson, A.J. AutoDock4 and AutoDockTools4: Automated docking with selective receptor flexibility. *J. Comput. Chem.* **2009**, *30*, 2785–2791. [CrossRef] [PubMed]
- 56. Trott, O.; Olson, A.J. AutoDock Vina: Improving the speed and accuracy of docking with a new scoring function, efficient optimization, and multithreading. *J. Comput. Chem.* **2010**, *31*, 455–461. [CrossRef] [PubMed]
- 57. Richard, A.; Banks, J.L.; Murphy, R.B.; Halgren, T.A.; Klicic, J.J.; Mainz, D.T.; Repasky, M.P.; Knoll, E.H.; Shelley, M.; Perry, J.K.; et al. A New Approach for Rapid, Accurate Docking and Scoring. 1. Method and Assessment of Docking Accuracy. *J. Med. Chem.* **2004**, *47*, 1739–1749.
- 58. Verdonk, M.L.; Cole, J.C.; Hartshorn, M.J.; Murray, C.W.; Taylor, R.D. Improved Protein–Ligand Docking Using GOLD. *Proteins-Struct. Funct. Bioinform.* **2003**, 52, 609–623. [CrossRef]
- 59. Amorim, A.R.; Zafalon, G.F.D.; Contessoto, A.G.; Valencio, C.R.; Sato, L.M. Metaheuristics for multiple sequence alignment: A systematic review. *Comput. Biol. Chem.* **2021**, *94*, 107563. [CrossRef]
- 60. Daugelaite, J.; O'Driscoll, A.; Sleator, R.D. An Overview of Multiple Sequence Alignments and Cloud Computing in Bioinformatics. *ISRN Biomath.* **2013**, 2013, 615630. [CrossRef]
- 61. Hospital, A.; Goni, J.R.; Orozco, M.; Gelpi, J.L. Molecular dynamics simulations: Advances and applications. *Adv. Appl. Bioinform. Chem.* **2015**, *8*, 37–47. [PubMed]
- 62. Ye, L.; Yang, C.; Yu, H. From molecular engineering to process engineering: Development of high-throughput screening methods in enzyme directed evolution. *Appl. Microbiol. Biotechnol.* **2017**, *102*, 559–567. [CrossRef]
- 63. Jumper, J.; Evans, R.; Pritzel, A.; Green, T.; Figurnov, M. Highly accurate protein structure prediction with AlphaFold. *Nature* **2021**, *596*, 583–589. [CrossRef]
- 64. Leman, J.K.; Weitzner, B.D.; Lewis, S.M.; Adolf-Bryfogle, J.; Alam, N.; Alford, R.F.; Aprahamian, M.; Baker, D. Macromolecular modeling and design in Rosetta: Recent methods and frameworks. *Nat. Methods* **2020**, *17*, 665–680. [CrossRef]
- Chowdhury, R.; Maranas, C.D. From directed evolution to computational enzyme engineering—A review. AIChE J. 2019, 66, e16847. [CrossRef]
- 66. Greenhalgh, J.; Saraogee, A.; Romero, P.A. Data-Driven Protein Engineering; John Wiley & Sons, Ltd.: Hoboken, NJ, USA, 2021.
- 67. Schaller, K.S.; Kari, J.; Borch, K.; Peters, G.H. Binding prediction of multi-domain cellulases with a dual-CNN. *arXiv* **2022**, arXiv:2207.02698.
- 68. Song, H.; Bremer, B.J.; Hinds, E.C.; Raskutti, G.; Romero, P.A. Inferring Protein Sequence-Function Relationships with Large-Scale Positive-Unlabeled Learning. *Cell Syst.* **2021**, *12*, 92–101.e8. [CrossRef]
- 69. Horton, R.M.; Hunt, H.D.; Ho, S.N.; Pullen, J.K.; Pease, L.R. Engineering hybrid genes without the use of restriction enzymes: Gene splicing by overlap extension. *Gene* 1989, 77, 61–68. [CrossRef]
- 70. Guo, W.; Xie, B.; Jiang, M.; Zhu, X.J.; Qiu, M.; Dai, Z.M. An improved overlap extension PCR for simultaneous multiple sites large fragments insertion, deletion and substitution. *Sci. Rep.* **2019**, *9*, 15637. [CrossRef]
- 71. Dadwal, A.; Sharma, S.; Satyanarayana, T. Progress in Ameliorating Beneficial Characteristics of Microbial Cellulases by Genetic Engineering Approaches for Cellulose Saccharification. *Front. Microbiol.* **2020**, *11*, 1387. [CrossRef]
- 72. Ali, M.; Ishqi, H.M.; Husain, Q. Enzyme engineering: Reshaping the biocatalytic functions. *Biotechnol. Bioeng.* **2020**, 117, 1877–1894. [CrossRef]
- 73. Zhou, H.Y.; Chen, Q.; Zhang, Y.F.; Chen, D.D.; Yi, X.N.; Chen, D.S.; Cheng, X.P.; Li, M.; Wang, H.Y.; Chen, K.Q.; et al. Improving the catalytic activity of beta-glucosidase from Coniophora puteana via semi-rational design for efficient biomass cellulose degradation. *Enzyme Microb. Technol.* **2023**, *164*, 110188. [CrossRef]
- 74. Jones, B.J.; Kan, C.N.E.; Luo, C.; Kazlauskas, R.J. Consensus Finder web tool to predict stabilizing substitutions in proteins. *Methods Enzymol.* **2020**, *643*, 129–148.
- 75. Reetz, M.T.; Bocola, M.; Carballeira, J.D.; Zha, D.; Vogel, A. Expanding the range of substrate acceptance of enzymes: Combinatorial active-site saturation test. *Angew. Chem. Int. Ed. Engl.* **2005**, *44*, 4192–4196. [CrossRef]
- 76. Li, D.; Wu, Q.; Reetz, M.T. Focused rational iterative site-specific mutagenesis (FRISM). Methods Enzymol. 2020, 643, 225–242.
- 77. Qu, G.; Li, A.; Acevedo-Rocha, C.G.; Sun, Z.; Reetz, M.T. The Crucial Role of Methodology Development in Directed Evolution of Selective Enzymes. *Angew. Chem. Int. Ed. Engl.* **2020**, *59*, 13204–13231. [CrossRef]
- 78. Contreras, F.; Pramanik, S.; Rozhkova, A.M.; Zorov, I.N.; Korotkova, O.; Sinitsyn, A.P.; Schwaneberg, U.; Davari, M.D. Engineering Robust Cellulases for Tailored Lignocellulosic Degradation Cocktails. *Int. J. Mol. Sci.* **2020**, *21*, 1589. [CrossRef]
- 79. Kao, M.R.; Kuo, H.W.; Lee, C.C.; Huang, K.Y.; Huang, T.Y.; Li, C.W.; Chen, C.W.; Wang, A.H.; Yu, S.M.; Ho, T.D. Chaetomella raphigera beta-glucosidase D2-BGL has intriguing structural features and a high substrate affinity that renders it an efficient cellulase supplement for lignocellulosic biomass hydrolysis. *Biotechnol. Biofuels* **2019**, *12*, 258. [CrossRef]

Molecules **2023**, 28, 4990 17 of 18

80. Sousa, A.S.; Melo, R.R.; Miyamoto, R.Y.; Morais, M.A.B.; Andrade, L.P.; Milan, N.; Avila, M.C.; Souza, C.M.; Adão, R.C.; Scarpassa, J.A.; et al. A rationally identified marine GH1 β-glucosidase has distinguishing functional features for simultaneous saccharification and fermentation. *Biofuels Bioprod. Biorefining* **2020**, *14*, 1163–1179. [CrossRef]

- 81. Sinha, S.K.; Goswami, S.; Das, S.; Datta, S. Exploiting non-conserved residues to improve activity and stability of Halothermothrix orenii beta-glucosidase. *Appl. Microbiol. Biotechnol.* **2017**, *101*, 1455–1463. [CrossRef]
- 82. Kao, M.R.; Yu, S.M.; Ho, T.U.D. Improvements of the productivity and saccharification efficiency of the cellulolytic beta-glucosidase D2-BGL in Pichia pastoris via directed evolution. *Biotechnol. Biofuels* **2021**, *14*, 126. [CrossRef]
- 83. Xia, W.; Bai, Y.; Shi, P. Improving the Substrate Affinity and Catalytic Efficiency of beta-Glucosidase Bgl3A from Talaromyces leycettanus JCM12802 by Rational Design. *Biomolecules* **2021**, *11*, 1882. [CrossRef]
- 84. Sinha, S.K.; Das, S.; Konar, S.; Ghorai, P.K.; Das, R.; Datta, S. Elucidating the regulation of glucose tolerance in a beta-glucosidase from Halothermothrix orenii by active site pocket engineering and computational analysis. *Int. J. Biol. Macromol.* **2020**, *156*, 621–632. [CrossRef]
- 85. Pang, P.; Cao, L.C.; Liu, Y.H.; Xie, W.; Wang, Z. Structures of a glucose-tolerant beta-glucosidase provide insights into its mechanism. *J. Struct. Biol.* **2017**, *198*, 154–162. [CrossRef]
- 86. Jiang, Z.; Long, L.; Liang, M.; Li, H.; Chen, Y.; Zheng, M.; Ni, H.; Li, Q.; Zhu, Y. Characterization of a glucose-stimulated beta-glucosidase from Microbulbifer sp. ALW1. *Microbiol. Res.* **2021**, 251, 126840. [CrossRef]
- 87. Goswami, S.; Das, S.; Datta, S. Understanding the role of residues around the active site tunnel towards generating a glucose-tolerant beta-glucosidase from Agrobacterium tumefaciens 5A. *Protein Eng. Des. Sel.* 2017, 30, 523–530. [CrossRef]
- 88. Guo, B.; Amano, Y.; Nozaki, K. Improvements in Glucose Sensitivity and Stability of Trichoderma reesei beta-Glucosidase Using Site-Directed Mutagenesis. *PLoS ONE* **2016**, *11*, e0147301.
- 89. Meleiro, L.P.; Salgado, J.C.S.; Maldonado, R.F.; Carli, S.; Moraes, L.A.B.; Ward, R.J.; Jorge, J.A.; Furriel, R.P.M. Engineering the GH1 beta-glucosidase from Humicola insolens: Insights on the stimulation of activity by glucose and xylose. *PLoS ONE* **2017**, 12, e0188254. [CrossRef]
- 90. Goswami, S.; Manna, B.; Chattopadhyay, K.; Ghosh, A.; Datta, S. Role of Conformational Change and Glucose Binding Sites in the Enhanced Glucose Tolerance of Agrobacterium tumefaciens 5A GH1 beta-Glucosidase Mutants. *J. Phys. Chem. B* **2021**, 125, 9402–9416. [CrossRef]
- 91. Mariano, D.; Pantuza, N.; Santos, L.H.; Rocha, R.E.O.; de Lima, L.H.F.; Bleicher, L.; de Melo-Minardi, R.C. Glutantbetaase: A database for improving the rational design of glucose-tolerant beta-glucosidases. *BMC Mol. Cell Biol.* **2020**, 21, 50. [CrossRef]
- 92. Kaushal, G.; Rai, A.K.; Singh, S.P. A novel beta-glucosidase from a hot-spring metagenome shows elevated thermal stability and tolerance to glucose and ethanol. *Enzym. Microb. Technol.* **2021**, *145*, 109764. [CrossRef]
- 93. Correa, T.L.R.; Franco Cairo, J.P.L.; Cota, J.; Damasio, A.; Oliveira, L.C.; Squina, F.M. A novel mechanism of beta-glucosidase stimulation through a monosaccharide binding-induced conformational change. *Int. J. Biol. Macromol.* **2021**, *166*, 1188–1196. [CrossRef]
- 94. Kuusk, S.; Valjamae, P. When substrate inhibits and inhibitor activates: Implications of beta-glucosidases. *Biotechnol. Biofuels* **2017**, 10, 7. [CrossRef]
- 95. Lundemo, P.; Karlsson, E.N.; Adlercreutz, P. Eliminating hydrolytic activity without affecting the transglycosylation of a GH1 beta-glucosidase. *Appl. Microbiol. Biotechnol.* **2017**, *101*, 1121–1131. [CrossRef]
- 96. Xue, Y.; Xue, M.; Xie, F.; Zhang, M.; Zhao, H.; Zhou, T. Engineering Thermotoga maritima beta-glucosidase for improved alkyl glycosides synthesis by site-directed mutagenesis. *J. Ind. Microbiol. Biotechnol.* **2021**, *48*, kuab031. [CrossRef]
- 97. Lyu, J.; Zhang, J.; Zhu, J.; Chen, S.; Han, T.; Zhang, Y.; Gao, R.; Xie, G.; Guo, Z. Molecular dynamics simulation guided distal mutation of Thermotoga naphthophila beta-glucosidase for significantly enhanced synthesis of galactooligosaccharides and expanded product scope. *Int. J. Biol. Macromol.* 2022, 210, 21–32. [CrossRef]
- 98. Larue, K.; Melgar, M.; Martin, V.J. Directed evolution of a fungal beta-glucosidase in Saccharomyces cerevisiae. *Biotechnol. Biofuels* **2016**, *9*, 52. [CrossRef] [PubMed]
- 99. Dadwal, A.; Sharma, S.; Satyanarayana, T. Thermostable cellulose saccharifying microbial enzymes: Characteristics, recent advances and biotechnological applications. *Int. J. Biol. Macromol.* **2021**, *188*, 226–244. [CrossRef] [PubMed]
- 100. Rahban, M.; Zolghadri, S.; Salehi, N.; Ahmad, F.; Haertle, T.; Rezaei-Ghaleh, N.; Sawyer, L.; Saboury, A.A. Thermal stability enhancement: Fundamental concepts of protein engineering strategies to manipulate the flexible structure. *Int. J. Biol. Macromol.* **2022**, *214*, 642–654. [CrossRef]
- 101. Watanabe, M.; Matsuzawa, T.; Yaoi, K. Rational protein design for thermostabilization of glycoside hydrolases based on structural analysis. *Appl. Microbiol. Biotechnol.* **2018**, 102, 8677–8684. [CrossRef]
- 102. Sharma, S.; Vaid, S.; Bhat, B.; Singh, S.; Bajaj, B.K. Thermostable Enzymes for Industrial Biotechnology. In *Advances in Enzyme Technology*; Elsevier: Amsterdam, The Netherlands, 2019; pp. 469–495.
- 103. Ahmed, A.; Sumreen, A.; Bibi, A.; Nasim, F.U.H.; Batool, K. In silico Approach to Elucidate Factors Associated with GH1 β-Glucosidase Thermostability. *J. Pure Appl. Microbiol.* **2019**, *13*, 1953–1968. [CrossRef]
- 104. Hu, Y.; Kang, G.; Wang, L.; Gao, M.; Wang, P.; Yang, D.; Huang, H. Current Status of Mining, Modification, and Application of Cellulases in Bioactive Substance Extraction. *Curr. Issues Mol. Biol.* **2021**, *43*, 50. [CrossRef] [PubMed]
- 105. Rathi, P.C.; Mulnaes, D.; Gohlke, H. VisualCNA: A GUI for interactive constraint network analysis and protein engineering for improving thermostability. *Bioinformatics* **2015**, *31*, 2394–2396. [CrossRef]

Molecules **2023**, 28, 4990 18 of 18

106. Mamonova, T.B.; Glyakina, A.V.; Kurnikova, M.G.; Galzitskaya, O.V. Flexibility and mobility in mesophilic and thermophilic homologous proteins from molecular dynamics and FoldUnfold method. *J. Bioinform. Comput. Biol.* **2010**, *8*, 377–394. [CrossRef] [PubMed]

- 107. Modarres, H.P.; Mofrad, M.R.; Sanati-Nezhad, A. Protein thermostability engineering. *RSC Adv.* **2016**, *6*, 115252–115270. [CrossRef]
- 108. Wijma, H.J.; Floor, R.J.; Jekel, P.A.; Baker, D.; Marrink, S.J.; Janssen, D.B. Computationally designed libraries for rapid enzyme stabilization. *Protein Eng. Des. Sel.* **2014**, 27, 49–58. [CrossRef]
- 109. Goldenzweig, A.; Goldsmith, M.; Hill, S.E.; Gertman, O.; Laurino, P.; Ashani, Y.; Dym, O.; Unger, T.; Albeck, S.; Prilusky, J.; et al. Structure- and Sequence-Based Design of Proteins for High Bacterial Expression and Stability. *Mol. Cell* **2016**, *63*, 337–346. [CrossRef]
- 110. Mazurenko, S. Predicting protein stability and solubility changes upon mutations: Data perspective. *ChemCatChem* **2020**, 12, 5590–5598. [CrossRef]
- 111. Mendez-Liter, J.A.; Gil-Munoz, J.; Nieto-Dominguez, M.; Barriuso, J.; de Eugenio, L.I.; Martinez, M.J. A novel, highly efficient beta-glucosidase with a cellulose-binding domain: Characterization and properties of native and recombinant proteins. *Biotechnol. Biofuels* 2017, 10, 256. [CrossRef]
- 112. Huang, P.; Chu, S.K.S.; Frizzo, H.N.; Connolly, M.P.; Caster, R.W.; Siegel, J.B. Evaluating Protein Engineering Thermostability Prediction Tools Using an Independently Generated Dataset. *ACS Omega* **2020**, *5*, 6487–6493. [CrossRef]
- 113. Okereke, O.E.; Gupta, M.; Ogunyewo, O.A.; Sharma, K.; Yazdani, S.S. Profiling of the β-glucosidases identified in the genome of Penicillium funiculosum: Insights from genomics, transcriptomics, proteomics and homology modelling studies. *bioRxiv* 2022. [CrossRef]
- 114. Sinha, S.K.; Datta, M.; Datta, S. A glucose tolerant β-glucosidase from Thermomicrobium roseum that can hydrolyze biomass in seawater. *Green Chem.* **2021**, 23, 7299–7311. [CrossRef]
- 115. Cao, L.; Li, S.; Huang, X.; Qin, Z.; Kong, W.; Xie, W.; Liu, Y. Enhancing the Thermostability of Highly Active and Glucose-Tolerant beta-Glucosidase Ks5A7 by Directed Evolution for Good Performance of Three Properties. *J. Agric. Food Chem.* **2018**, *66*, 13228–13235. [CrossRef]
- 116. Matsuzawa, T.; Watanabe, M.; Yaoi, K. Improved thermostability of a metagenomic glucose-tolerant beta-glycosidase based on its X-ray crystal structure. *Appl. Microbiol. Biotechnol.* **2017**, *101*, 8353–8363. [CrossRef] [PubMed]
- 117. Campen, A.S.; Lynn, J.; Sibert, S.J.; Srikrishnan, S.; Phatale, P.; Feldman, T.; Guenther, J.M.; Hiras, J.; Tran, Y.T.A.; Singer, S.W.; et al. Expression of naturally ionic liquid-tolerant thermophilic cellulases in Aspergillus niger. *PLoS ONE* **2017**, *12*, e0189604.
- 118. Batra, J.; Mishra, S. Organic solvent tolerance and thermostability of a β-glucosidase co-engineered by random mutagenesis. *J. Mol. Catal. B Enzym.* **2013**, *96*, 61–66. [CrossRef]
- 119. Li, Y.; Hu, X.; Sang, J.; Zhang, Y.; Zhang, H.; Lu, F.; Liu, F. An acid-stable beta-glucosidase from Aspergillus aculeatus: Gene expression, biochemical characterization and molecular dynamics simulation. *Int. J. Biol. Macromol.* **2018**, *119*, 462–469. [CrossRef] [PubMed]
- 120. Rostkowski, M.O.M.; Søndergaard, C.R.; Jensen, J.H. Graphical analysis of pH-dependent properties of proteins predicted using PROPKA. *BMC Struct. Biol.* **2011**, *11*, 1–6. [CrossRef] [PubMed]
- 121. Solhtalab, M.; Flannelly, D.F.; Aristilde, L. Substrate binding versus escape dynamics in a pH-affected fungal beta-glucosidase revealed by molecular dynamics simulations. *Carbohydr. Res.* **2019**, 472, 127–131. [CrossRef] [PubMed]

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