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# Simultaneous improvement of the thermostability and activity of lactic dehydrogenase from *Lactobacillus rossiae* through rational design

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D-Phenyllactic acid, is a versatile organic acid with wide application prospects in the food, pharmaceutical and material industries. Wild-type lactate dehydrogenase LrLDH from *Lactobacillus rossiae* exhibits a high catalytic performance in the production of D-phenyllactic acid from phenylpyruvic acid or sodium phenylpyruvate, but its industrial application is hampered by poor thermostability. Here, computer aided rational design was applied to improve the thermostability of LrLDH. By using HotSpot Wizard 3.0, five hotspot residues (N218, L237, T247, D249 and S301) were identified, after which site-saturation mutagenesis and combined mutagenesis were performed. The double mutant D249A/T247I was screened out as the best variant, with optimum temperature,  $t_{1/2}$ , and  $T_{50}^0$  that were 12 °C, 17.96 min and 19 °C higher than that of wild-type LrLDH, respectively. At the same time, the  $k_{cat}/K_m$  of D249A/T247I was 1.47  $s^{-1} mM^{-1}$ , which was 3.4 times higher than that of the wild-type enzyme. Thus rational design was successfully applied to simultaneously improve the thermostability and catalytic activity of LrLDH to a significant extent. The results of molecular dynamics simulations and molecular structure analysis could explain the mechanisms for the improved performance of the double mutant. This study shows that computer-aided rational design can greatly improve the thermostability of D-lactate dehydrogenase, offering a reference for the modification of other enzymes.

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## Introduction

Currently, chemical preservatives like sodium benzoate and potassium sorbate are widely used in the food industry. They play important roles in preventing the proliferation of spoilage microorganisms and food-borne pathogens, as well as reducing the generation of harmful microbial secondary metabolites. However, excessive or improper use of these preservatives may cause metabolic imbalances and lead to certain diseases.<sup>1</sup> With increasing awareness of food safety issues, there is an urgent need to find safer alternatives. Phenyllactic acid (PLA), a natural organic acid with remarkable antimicrobial properties, is found in honey and some foods fermented by lactic acid bacteria (LAB).<sup>2,3</sup> Due to the well-known safety of LAB in the food industry, the use of their metabolites, including PLA, is generally regarded as safe. By decreasing the rigidity of the cell wall and damaging the membrane integrity, PLA has antibacterial effects against a variety of bacteria and fungi, resulting in a broad antimicrobial spectrum.<sup>4-6</sup> Moreover, PLA has

prominent water solubility and excellent thermal stability while having no objectionable odor.<sup>7,8</sup> Due to these advantages, PLA has great potential for use as a preservative in the food industry. Due to the presence of a chiral carbon atom, chemical synthesis results in the production of a mixture of D-PLA and L-PLA, whereby the former has a better antibacterial effect.<sup>9</sup> In addition, D-PLA can be used as a building block in the synthesis of pharmaceuticals, including the hypoglycemic agent englitazone, the coronary heart disease treatment drug danshensu and the anthelmintic agent PF1022A.<sup>10-12</sup> In addition, D-PLA can act as a monomer to produce poly-PLA, a biodegradable material with excellent thermostability and ultraviolet absorption properties.<sup>13</sup> Hence, D-PLA has broad application potential in the food, pharmaceutical and material industries, which has attracted considerable interest in its manufacturing.

A variety of microorganisms can be used for PLA fermentation, especially LAB.<sup>14</sup> However, although many effort including metabolic engineering and process optimization have been made, both the output and optical purity were unsatisfactory.<sup>15,16</sup> Moreover, the excessive by-products drive up the cost, due to the complex process of product separation. PLA is the by-product of phenylalanine metabolism in the cells of LABs, and phenylpyruvate (PPA) is the direct precursor of PLA. D-PLA is generated by PPA reduction catalyzed by D-lactate dehydrogenase (D-LDH).<sup>17</sup> Owing to its excellent catalytic activity and

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stereoselectivity, fewer by-products and eco-friendly reaction conditions, biocatalytic conversion is considered a more efficient and straightforward strategy for D-PLA production than fermentation. Zhou *et al.*,<sup>18</sup> cloned a D-LDH gene from *Lactobacillus* sp. ZX1 and expressed it in *Escherichia coli*. Subsequently, a fed-batch conversion using whole cells was conducted, and 18.21 g l<sup>-1</sup> D-PLA was generated from PPA within 8 h. To improve NADH regeneration and the yield of D-PLA, Qin *et al.* fusion expressed D-LDH and glycerol dehydrogenase in *E. coli*. Catalyzed by this strain, a productivity of 5.83 g l<sup>-1</sup> h<sup>-1</sup> was achieved in a 5 l reactor.<sup>19</sup> In our previous work, a gene encodes D-LDH was cloned and heterologous expressed in *E. coli*. The obtained recombinant protein LrLDH has the ability to asymmetrically reduce PPA to D-PLA with high activity, but the half-life of LrLDH at 50 °C is only 3.70 min, indicating poor thermostability.<sup>20</sup> Thermostability is an important process parameter, which reflects the ability of enzyme maintain the integrity of its structure and function at a certain temperature. Moreover, high temperature can improve the reaction rate and reduce the viscosity of the feed liquid.<sup>21</sup> Therefore, the poor thermostability of D-LDH is a serious obstacle for its application in the production of D-PLA.

Protein engineering approaches, including directed evolution and rational design, are powerful tools for overcoming the shortcomings of natural enzymes such as unsatisfactory thermostability.<sup>22</sup> Compared with directed evolution, rational design based on computer-assisted techniques is more rapid and targeted.<sup>23</sup> This strategy is usually employed to enhance enzyme thermostability and numerous successful examples have been reported. Zhao *et al.* predicted candidate residue pairs suitable for substitution by cysteine using the DbD computational tool, and the additional disulfide bridges were introduced into D-psicose-3-epimerase. After B-factor value analysis and screening, three mutant enzymes were obtained with varying degrees of improvement in optimum catalytic temperature and half-life ( $t_{1/2}$ ).<sup>24</sup> Based on protein surface topography, multiple sequence alignment and calculations of the changes in free energy of folding ( $\Delta\Delta G$ ), hot spots related to thermal stability of endoglucanase II from *Penicillium verrucosum* were predicted and site-specific mutagenesis were conducted. The mutants showed a remarkable improvement in thermostability without changes of specific activity.<sup>25</sup>

Under extreme conditions such as high temperature or extreme pH, enzymatic denaturation begins with partial unfolding of the peripheral protein chains, followed by exposure of the protein interior and aggregation of the hydrophobic regions.<sup>26</sup> Therefore, the rigidity of the structure outside the active center plays an important role in determining the thermostability of enzymes. To improve the thermostability of LrLDH, we engineered the enzyme using computationally assisted rational design. The appropriate substitutions of amino acid residues were selected with the aid of HotSpot Wizard 3.0 (<https://loschmidt.chemi.muni.cz/hotspotwizard/>), followed by site-saturation mutagenesis and combinatorial mutations. The variant D249A/T247I with both enhanced thermostability and improved catalytic activity with PPA was

obtained, and the underlying molecular mechanisms were analyzed.

## Experimental

### Reagents

Sodium phenylpyruvate (PPA),  $\beta$ -nicotinamide adenine dinucleotide disodium salt (NADH), kanamycin and Ni-TED pre-packed gravity column (5 ml) were purchased from Sangon Biotech (Shanghai, China) Co., Ltd. Tryptone and yeast extract were obtained from Oxoid Co., Ltd (United Kingdom). PrimeSTAR<sup>®</sup> HS DNA polymerase, QuickCut<sup>™</sup> restriction enzymes, PCR reagents, loading buffers for nucleic acid electrophoresis and SDS-PAGE, DNA and protein markers, as well as the Bradford protein assay kit were purchased from Takara Biotechnology (Dalian, China) Co., Ltd. The plasmid miniprep kits were purchased from Axygen Biotechnology (Hangzhou, China) Co., Ltd. Oligonucleotide synthesis and DNA sequencing were conducted by Sangon Biotech Co., Ltd (Shanghai, China). Unless specified otherwise, all other reagents and chemicals used in this study were obtained from general commercial suppliers and used without further purification.

*E. coli* BL21 (DE3) and pET-28a (+) were used as the host strain and vector for protein expression. The plasmid pET28a-*lrdh* with the lactic dehydrogenase gene from *Lactobacillus rossiae* was used as the template for the site-saturation mutagenesis.

The engineered *E. coli* strains were grown in Luria-Bertani (LB) medium (0.5% yeast extract, 1.0% tryptone and 1.0% NaCl), supplemented with 50  $\mu\text{g ml}^{-1}$  kanamycin.

### Molecular modelling and docking

The three-dimensional (3D) homology models of LrLDH and its mutants were generated using Rosetta CM based on the crystal structure of lactic dehydrogenase from *Lactobacillus helveticus* in complex with NADH (PDB ID: 2DLD) as the template. A total of 1000 models were generated and the model with the lowest score was used as the input structure for further calculations. Molecular docking was then performed between LrLDH or its variants and PPA according to the program Autodock 4.2. The detailed parameters were set refer to the previous article.<sup>27</sup> And the images were created with PyMOL.

### Construction of the mutant library

The 3D homology model of wild-type LrLDH was submitted to the HotSpot Wizard 3.0 webserver, and the potential thermostability-related residues were predicted as described before.<sup>28</sup> Site-directed mutations were performed *via* polymerase chain reactions (PCR) using pET28a (+) recombinant plasmid with wild-type or mutant *lrdh* genes as the template. The primers used for the saturation mutagenesis at each site are listed in Table 1. The PCR was performed as described previously.<sup>29</sup> To degrade the template, the QuickCut<sup>™</sup> restriction enzyme *DpnI* was added to the PCR reaction mixture and incubated at 37 °C for 10 min. The products were used to transform *E. coli* BL21 (DE3) competent cells and cultivated on



Table 1 Primers used in this study<sup>a</sup>

Primer	Oligonucleotide sequences (5′–3′)
S301-F	GTGTTAGTGNNNCCGCACATCGCGTTCTAC
S301-R	GATGTGCGGNNNCACTAACACGTTTTTCACGTT
T247-F	CTGTTGATNNNGATGATCTGATCAAAGCGC
T247-R	CAGATCATCNNNATCAACCAGATCCCCACG
D249-F	ATACCGATNNNCTGATCAAAGCGCTGGATT
D249-R	TTTGATCAGNNNATCGGTATCAACCAGATC
N218-F	ACCAAAGAANNNATGCACATGCTGAACGCTG
N218-R	CATGTGCATNNNTTCTTTGGTTGCCGGAGC
L237-F	GTTTATATANNNAACCCGGCGCGTGGGG
L237-R	CGCCGGGTTNNNTATATAAACACCATCTTTTCATTTTG
S301M-F	TGTTAGTGTGCCGCACATCGCGTTCTAC
S301M-R	GATGTGCGGCATCACTAACACGTTTTTCACGT
S301R-F	GTGTTAGTGCGCCCGCACATCGCGTTC
S301R-R	TGTGCGGGCGCACTAACACGTTTTTCACGTT
N218V-F	ACCAAAGAAGTTATGCACATGCTGAACGCTG
N218V-R	CATGTGCATAACTTCTTTGGTTGCCGGAGC
N218T-F	CCAAAGAAACCATGCACATGCTGAACGCT
N218T-R	ATGTGCATGGTTTCTTTGGTTGCCGGAGC
L237K-F	GTTTATATAAAAAACCCGGCGCGTGGGG
L237K-R	CGCCGGGTTTTTATATAAACACCATCTTTTCATTTTG
L237C-F	GTTTATATATGTAACCCGGCGCGTGGGG
L237C-R	CGCCGGGTTACATATATAAACACCATCTTTTCATTTTG
D249A-F	ATATTGATGCGCTGATCAAAGCGCTGGATT
D249A-R	TTTGATCAGCGCATCAATATCAACCAGATC

<sup>a</sup> N stands for A, T, G or C. The mutated nucleotides are underlined.

LB agar plates containing 50  $\mu\text{g ml}^{-1}$  kanamycin. The transformants were verified by DNA sequencing.

### Protein expression and purification

*E. coli* cells harboring recombinant plasmids encoding *lrl dh* or its variants were cultured in 50 ml LB medium containing 50  $\mu\text{g ml}^{-1}$  kanamycin at 37 °C and 180 rpm until the optical density at 600 nm ( $\text{OD}_{600}$ ) reached approximately 0.8. Subsequently, lactose was added as an inducer to a final concentration of 10 g  $\text{l}^{-1}$ , and the cultures were cultured at 28 °C and 150 rpm for another 12 h. The cells were harvested by centrifuged at 4 °C and 8000 $\times g$  for 10 min, washed twice with potassium phosphate buffer (20 mM, pH 8.0), resuspended in the same buffer with a wet cell concentration of 50 g  $\text{l}^{-1}$ , and disrupted by ultrasonication (300 W, 10 min) in an ice bath followed by centrifugation (10 000 $\times g$ , 4 °C, 20 min) to remove the cell debris. The supernatants were collected and loaded onto a 5 ml Ni-TED pre-packed gravity column pre-equilibrated with buffer A (20 mM imidazole and 500 mM NaCl in 20 mM potassium phosphate buffer, pH 8.0), and washed with 25 ml buffer A to remove the unbound proteins. The fractions were collected by elution with buffer B (500 mM imidazole and 500 mM NaCl in 20 mM potassium phosphate buffer, pH 8.0) and dialyzed overnight against potassium phosphate buffer (20 mM, pH 8.0). All purification steps were conducted at 0–4 °C. The purity of the target protein was checked by SDS-PAGE with a 12% acrylamide separating gel under denaturing conditions. The concentration of purified enzymes was measured using the Bradford protein

assay kit with bovine serum albumin (BSA) as the protein standard.

### Enzyme activity assay

The enzymatic activity of wild-type *LrLDH* and its mutants was measured at 30 °C by monitoring the decrease in the absorbance of NADH at 340 nm using a microplate reader. The standard assay mixture was composed of potassium phosphate buffer (100 mM, pH 6.5), 0.5 mM NADH, 1 mM PPA, and the appropriate diluted enzyme in a total volume of 200  $\mu\text{l}$ . All reactions were pre-mixed at 30 °C and initiated by adding NADH. One unit of enzyme activity was defined as the amount of enzyme that catalyzes the oxidation of 1  $\mu\text{mol}$  of NADH per minute.

### Optimal temperature and thermostability analysis

The optimal reaction temperature of wild-type *LrLDH* and its mutants was determined by measuring the enzyme activity of each sample at temperatures ranging from 30 and 60 °C using the standard assay conditions.

To assess the thermostability of wild-type *LrLDH* and its mutants, the residual activity of the purified enzyme was measured after 30 min at 50 °C, with non-incubated enzyme as the control. The half-lives ( $t_{1/2}$ ) were calculated according to the first-order deactivation function:  $\ln(\text{residual activity}) = -k_D t$ ,  $t_{1/2} = \ln 2/k_D$ , where  $k_D$  represents the deactivation rate constant.<sup>30</sup>

For measuring the half inactivation temperature ( $T_{50}^{10}$ ) of wild-type *LrLDH* and its mutants, defined as the temperature at which enzymes lose 50% of the initial activity after incubation for 10 min, the purified enzymes were incubated at temperatures ranging from 20 to 60 °C for 10 min, and the residual activity was determined using the standard assay conditions with non-incubated enzyme as the control.

### Determination of kinetic parameters

The kinetic parameters of wild-type *LrLDH* and its mutants were determined by measuring the enzyme activity at varying PPA concentrations (1–5 mM) and a fixed NADH concentration (0.5 mM). The data were fitted to the Michaelis–Menten model using the software Origin 9.0.

### Molecular dynamics simulations

The molecular dynamics simulations were performed with Gromacs 2018, using “chain A” of wild-type *LrLDH* and its variants. The force field was selected with GROMOS 53a6. The protein was solvated in water. spc216.gro was used as the solvent configuration for simple point charge (SPC) water. To balance the system,  $\text{Na}^+$  or  $\text{Cl}^-$  ions were added to the simulation box to replace the solvent. Then, the structure was relaxed through energy minimization. Furthermore, the NVT equilibration was performed at 343 K for 100 ps and 1 bar in the NPT equilibration for 100 ps. Finally, the MD simulations were carried out for 100 ns. The root mean square deviation (RMSD) and radius of gyration ( $R_g$ ) of wild-type *LrLDH* and its variants were calculated.<sup>31</sup>



## Results and discussion

### Identification of hotspot residues

Our previous study suggested that *LrLDH* from *Lactobacillus rossiae* is a promising biocatalyst for the efficient synthesis of D-phenyllactic acid and other fine chemicals. However, the poor thermostability ( $t_{1/2}$  at 50 °C of only 3.7 min) hampered its practical application.<sup>20</sup> To better meet the requirements of industrial application, we attempted to improve the thermostability of *LrLDH*. HotSpot Wizard is a popular tool for the automated prediction of hotspots for rational enzyme improvement based on structural, functional and evolutionary information obtained from different databases.<sup>28</sup> Many vivid examples have demonstrated its effectiveness not only in tailoring the catalytic activity, but also in improving the thermostability of enzymes.<sup>32–35</sup> To predict residues that might affect the enzyme's thermostability, a 3D homology models of *LrLDH* was constructed (Fig. 1a) and uploaded to the HotSpot Wizard web server. After calculating, 8 stability hot spots (Pro

239, Phe 306, Ser 301, Phe 274, Leu237, Asn 218, Asp 249, T247) were shown in the website. The amino acid residues around the catalytic site, including the residues in catalytic pocket and the tunnels, may appreciable impact the catalytic activity of enzyme.<sup>36</sup> Excluding these residues, 5 amino acid residues located far from the active center were selected (N218, L237, T247, D249 and S301) and chosen as engineering targets for the thermostability mutagenesis (Fig. 1b).

### Construction and screening of mutant libraries

Subsequently, site-saturation mutagenesis was conducted by PCR with the plasmid pET28a-*lrdh* as the template. The generated mutant plasmids were introduced into *E. coli* for expression. According to the gene sequence analysis, all 95 mutants covering each site were obtained, and a single site mutant library was generated.

The strains harboring the wild-type *lrdh* or its mutants were cultivated and induced with lactose. The protein-expressing cells were disrupted and the enzymes were purified by Ni<sup>2+</sup>-chelating

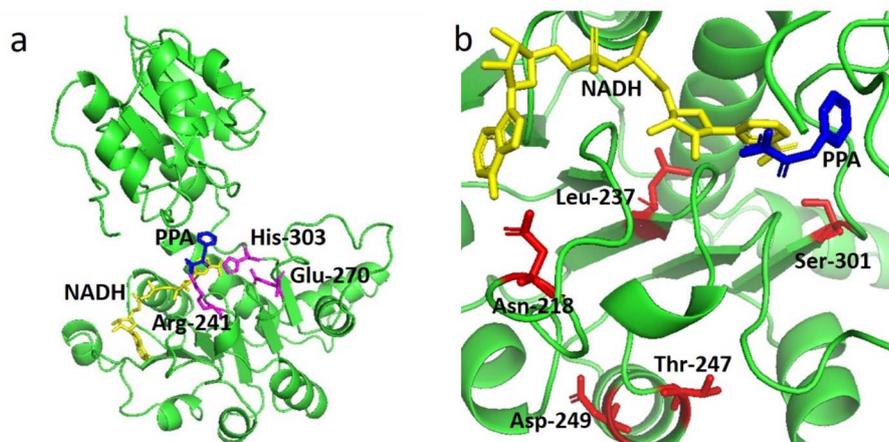


Fig. 1 (a) Three-dimensional structure of *LrLDH* (green cartoon representations). (b) Locations of mutations (red sticks representations) in the structure of *LrLDH*. The catalytic triad (Arg241, Glu270, and His303), PPA and NADH are indicated by magentas, blue and yellow sticks, respectively.

Table 2 *LrLDH* mutants with improved specific activity or thermostability after mutagenesis<sup>c</sup>

Enzyme	Specific activity <sup>a</sup> (U mg <sup>-1</sup> )	Residual activity <sup>b</sup> (%)	Enzyme	Specific activity (U mg <sup>-1</sup> )	Residual activity (%)
WT	0.51 ± 0.08	37.70 ± 2.20	D249A/T247I	1.61 ± 0.08	89.07 ± 3.55
S301M	0.05 ± 0.00	66.85 ± 5.75	T247I/N218V	0.02 ± 0.00	70.00 ± 2.89
S301R	0.01 ± 0.00	73.50 ± 4.83	L237K/T247W	0.15 ± 0.02	62.30 ± 3.68
T247I	0.38 ± 0.06	93.31 ± 1.57	L237K/T247C	0.09 ± 0.00	58.30 ± 1.37
T247C	0.03 ± 0.00	84.57 ± 3.25	D249A/N218T	0.90 ± 0.10	24.70 ± 2.74
T247W	0.01 ± 0.00	84.14 ± 3.86	D249A/T247I/S301M	0.09 ± 0.01	55.36 ± 3.33
D249A	3.10 ± 0.17	62.03 ± 2.75	D249A/T247I/S301R	0.13 ± 0.01	51.65 ± 2.79
N218V	0.21 ± 0.03	56.75 ± 2.59	D249A/T247I/N218V	0.59 ± 0.06	35.38 ± 3.45
N218T	0.35 ± 0.03	56.60 ± 4.69	D249A/T247I/N218T	0.36 ± 0.05	41.27 ± 2.65
L237K	0.25 ± 0.07	52.94 ± 2.92	D249A/T247I/L237K	0.38 ± 0.03	52.58 ± 3.58
L237C	0.13 ± 0.02	44.96 ± 3.20	D249A/T247I/L237C	0.44 ± 0.04	46.95 ± 4.42

<sup>a</sup> The enzyme activity was measured under the standard assay conditions. <sup>b</sup> *LrLDH* and the mutants were incubated in 100 mM, pH 6.5 potassium phosphate at 50 °C for 5 min, the residual activity was detected under the standard assay conditions, untreated enzyme was taken as the control.

<sup>c</sup> All reactions were performed in triplicate, and activities expressed as means ± standard deviations.



affinity chromatography. We subsequently performed thermostability screening by incubated the purified enzymes at 50 °C for 5 min, followed by immediate cooling in an ice-bath and measurement of the residual activity. An enzyme sample that was not heated was included as a control. As shown in Table 2, 10 single mutants (S301M, S301R, T247I, T247C, T247W, D249A, N218V, N218T, L237K and L237C) presented better thermostability than the wild-type *Lr*LDH (with a residual activity of 37.7%). The T247I variant was the best single mutant, and it retained 93.31% residual activity after heat treatment. Almost all of the mutants (including T247I) suffered a decline of specific activity relative to wild-type *Lr*LDH, as there is a general trade-off between catalytic activity and stability.<sup>30</sup> To our surprise, the variant D249A exhibited a simultaneous improvement of catalytic activity and thermostability, with approximately 6-fold higher specific activity (3.10 U mg<sup>-1</sup>) and nearly 60% higher residual activity (62.03%) than the wild-type *Lr*LDH. To combine the advantages, double and triple mutants were also constructed. After screening, the double-mutant variants T247I/N218V, D249A/T247W, and L237K/T247C, as well as the triple-mutant variants D249A/T247I/S301M, D249A/T247I/S301R, D249A/T247I/N218T, D249A/T247I/L237K, and D249A/T247I/L237C displayed enhanced thermostability but a lower specific activity than the wild-type enzyme. Conversely, the variants D249A/N218T and D249A/T247I/N218V showed a better specific activity but a poor thermal stability. However, we fortunately obtained the double-mutant variant D249A/T247I with a specific activity of 1.61 U mg<sup>-1</sup> and a residual activity of 89.07%. In comparison with the wild-type enzyme, that was an approximately 2-fold improvement of catalytic activity and nearly 40% higher residual activity. Although the mutant D249A/T247I sacrificed a small amount of thermostability, the catalytic activity was significantly improved compared with the mutant T247I (Table 2). This variant therefore strikes a good balance of improved thermostability and catalytic activity. Additionally, The SDS-PAGE results indicated that both the mutant D249A and

D249A/T247I exhibited better soluble expression in *E. coli* (Fig. 2), which is consistent with their improved stability.

### Effects of temperature

The  $T_{50}^{10}$  values were estimated by measuring the residual activity after incubation for 10 min at different temperatures in the

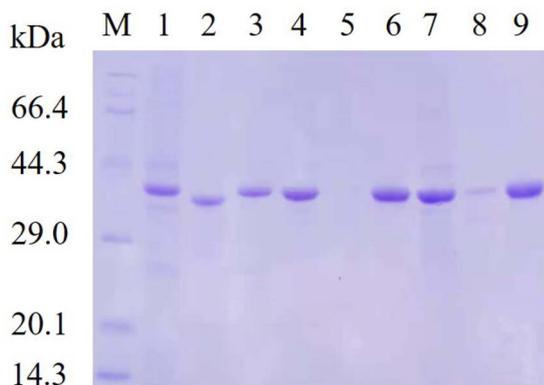


Fig. 2 SDS-PAGE analysis. M: protein molecular weight marker; lane 1, 4 and 7: soluble fractions from lactose induced *E. coli*/pET28a-*lrldh*<sup>WT</sup>, *E. coli*/pET28a-*lrldh*<sup>D249A</sup> and *E. coli*/pET28a-*lrldh*<sup>D249A/T247I</sup>, respectively; lane 2, 5 and 8: precipitates from lactose induced *E. coli*/pET28a-*lrldh*<sup>WT</sup>, *E. coli*/pET28a-*lrldh*<sup>D249A</sup> and *E. coli*/pET28a-*lrldh*<sup>D249A/T247I</sup>, respectively; lane 3, 6 and 9: the purified WT, mutant D249A and mutant D249A/T247I, respectively.

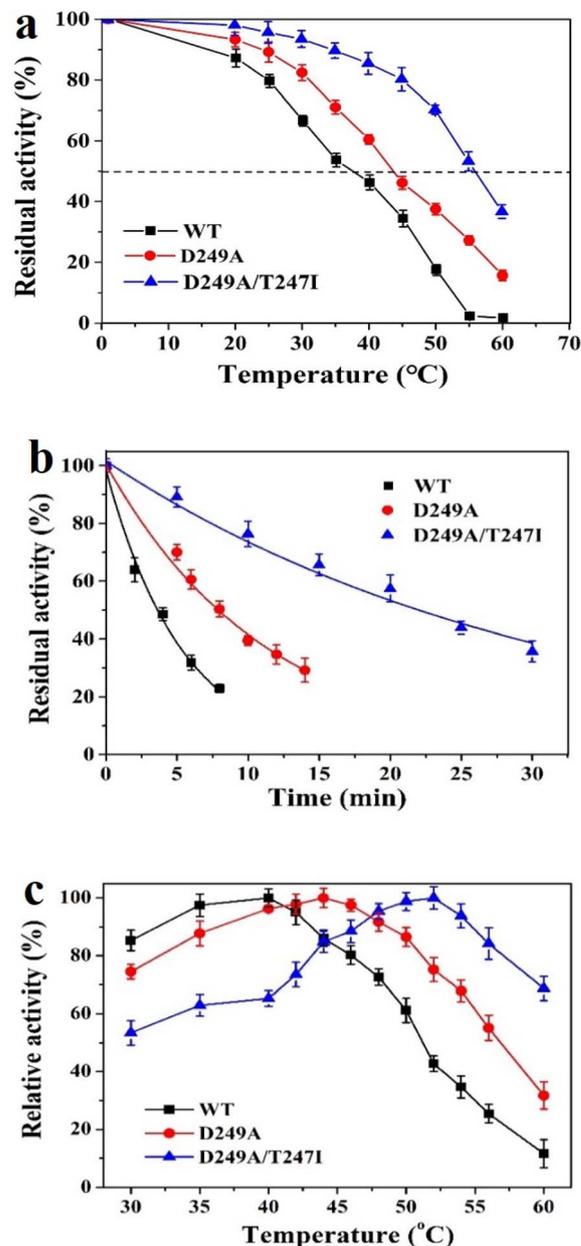


Fig. 3 Influence of temperature on the activity of wild-type *Lr*LDH and the variants. (a)  $T_{50}^{10}$ , the WT and engineered mutants were incubated in 100 mM, pH 6.5 potassium phosphate at 20–60 °C for up to 10 min, the residual activity was detected under the standard assay conditions. (b) Thermostability, WT and the mutants were incubated in 100 mM, pH 6.5 potassium phosphate at 50 °C for up to 30 min, the residual activity was detected under the standard assay conditions, untreated *Lr*LDH or the mutant was taken as the control. (c) Optimal temperature, assays were carried in 100 mM potassium phosphate buffer, pH 6.5, at 30–60 °C for 1 min. All reactions were performed in triplicate, and error bars represent the standard error of mean.



Table 3 Kinetic parameters,  $t_{1/2}$  and  $T_{50}^{10}$  of *Lr*LDH and the mutants toward PPA

Enzyme	$K_m$ (mM)	$V_{max}$ (U mg <sup>-1</sup> )	$k_{cat}$ (s <sup>-1</sup> )	$k_{cat}/K_m$ (s <sup>-1</sup> mM <sup>-1</sup> )	$t_{1/2}$ (min)	$T_{50}^{10}$ (°C)
WT	2.83	1.95	1.23	0.43	3.70	38
D249A	1.67	8.01	5.17	3.10	7.88	44
D249A/T247I	2.32	5.28	3.41	1.47	21.66	57

range of 20–60 °C (Fig. 3a). The thermal inactivation curves were recorded by measuring the time-variance of residual enzyme activity at 50 °C. As illustrated in Fig. 3b, wild-type *Lr*LDH, as well as mutant D249A and D249A/T247I, all suffered a rapid decline of activity. The data were fitted nonlinearly using the software Origin 9.0 to calculate the  $t_{1/2}$ . As shown in Table 3, the  $t_{1/2}$  values of wild-type *Lr*LDH, D249A and D249A/T247I were 3.70, 7.88 and 21.66 min, respectively, while the  $T_{50}^{10}$  values were 38, 44 and 57 °C. This result indicated that the thermostability of *Lr*LDH was significantly enhanced by this rational mutagenesis strategy.

To investigate the optimal temperature of wild-type *Lr*LDH and the mutants, the catalytic activity towards PPA was determined at different temperatures in the range of 30–60 °C. As shown in Fig. 3c, an Asp to Ala substitution at position 249 resulted in a small increase of the optimum temperature from 40 °C (wild-type) to 44 °C. After combination with the T247I mutation, the double-mutant variant D249A/T247I exhibited a further increase of the optimal temperature to 52 °C.

### Determination of kinetic parameters

The specific enzyme activity of wild-type *Lr*LDH, the single mutant D249A and the double mutant D249A/T247I at different substrate concentrations (1–5 mM PPA) was determined at a fixed NADH concentration. The data were subjected to nonlinear fitting to the Michaelis–Menten equation (Fig. 4). As illustrated in Table 3, the maximum reaction velocities ( $V_{max}$ ) of wild-type *Lr*LDH, single mutant D249A and double mutant D249A/T247I were 1.95, 8.01 and 5.28 U mg<sup>-1</sup>, respectively. The corresponding Michaelis constants ( $K_m$ ) were 2.83, 1.67 and 2.32 mM. The mutation of aspartate 249 to alanine resulted in

a more than 3-fold improvement of  $V_{max}$  and an approximately 41% decrease in  $K_m$ . As a result, the D249A mutant exhibited 6.21-fold increase of catalytic efficiency ( $k_{cat}/K_m$ ) toward PPA. The addition of the T247I mutation resulted in a significant reduction in  $k_{cat}/K_m$ , but the value (1.47 s<sup>-1</sup> mM<sup>-1</sup>) was still much higher than that of wild-type *Lr*LDH (0.43 s<sup>-1</sup> mM<sup>-1</sup>). Nakano *et al.*,<sup>37</sup> obtained a double mutant *D-LDH* T75L/A234S by site-directed mutagenesis. Using pyruvate as the substrate, the mutation give a 6.8-fold improvement in  $k_{cat}/K_m$ , which was better than our results. Nevertheless, we got robust enzymes with both enhanced thermostability and higher specific activity, which has a good application value in industry.

### Molecular dynamics simulations

To elucidate the mechanisms responsible for the enhanced thermostability of the best variant, molecular dynamics (MD) simulations were performed at 343 K (70 °C), in which root

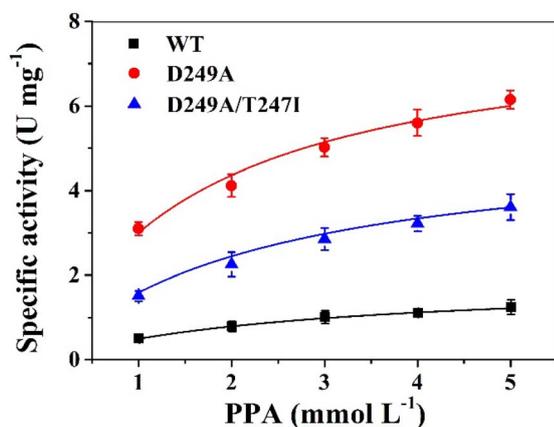


Fig. 4 The kinetic curve of wild-type *Lr*LDH (WT), mutant D249A and mutant D249A/T247I, respectively.

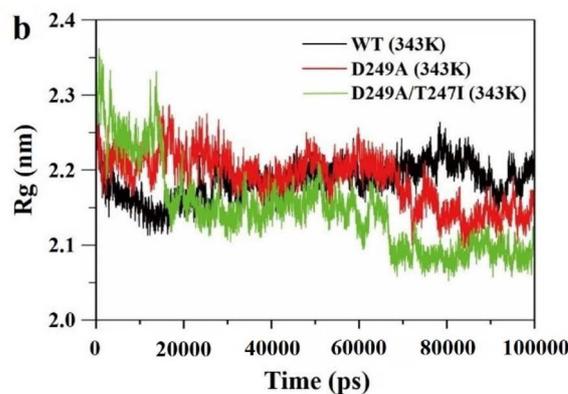
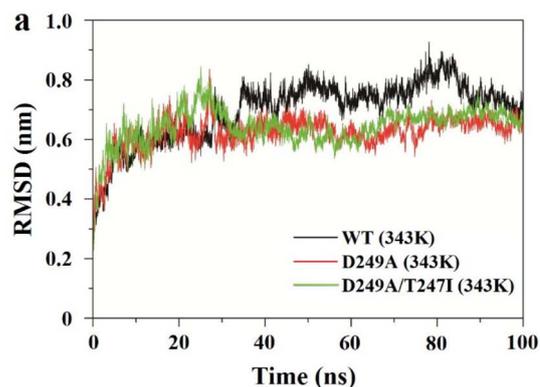


Fig. 5 Molecular dynamics simulations of wild-type *Lr*LDH (WT), mutant D249A and mutant D249A/T247I. (a) RMSD values at 343 K, (b)  $R_g$  values at 343 K.



mean square deviation (RMSD) and radius of loop ( $R_g$ ) values were recorded over 100 ns.

RMSD represents the mean deviation of position between the protein structure and original conformation in 3D space at a specific time, which is an important indicator for evaluating the stability of enzymes. As shown in Fig. 5a, the RMSD value of wild-type *Lr*LDH at 343 K was gradually increased and greatly fluctuated, indicating that the structure of the enzyme was unstable and could be easily inactivated at high temperature. By contrast, the RMSD values of the single mutant D249A and double mutant D249A/T247I were both basically stable at about 30 ns, and much lower than that of wild-type *Lr*LDH. These two mutant enzymes therefore showed good structural stability at high temperature.

Furthermore, compared with the single mutant enzyme D249A, the fluctuation of RMSD value of the double mutant D249A/T247I was smaller after 60 ns, indicating that the thermostability was further improved by combined mutation.

The  $R_g$  value reflects the compactness of the enzyme structure. As shown in Fig. 5b, The  $R_g$  value of wild-type *Lr*LDH displayed an increasing trend over 100 ns, indicating that the enzyme expanded at high temperature due to poor thermostability. The  $R_g$  value of mutant D249A gradually decreased and stabilized at about 70 ns, indicating that the structure of the enzyme tends to contract. The average value was about 2.15, much lower than that of wild-type *Lr*LDH, indicating better thermostability. In the double mutant D249A/T247I, the

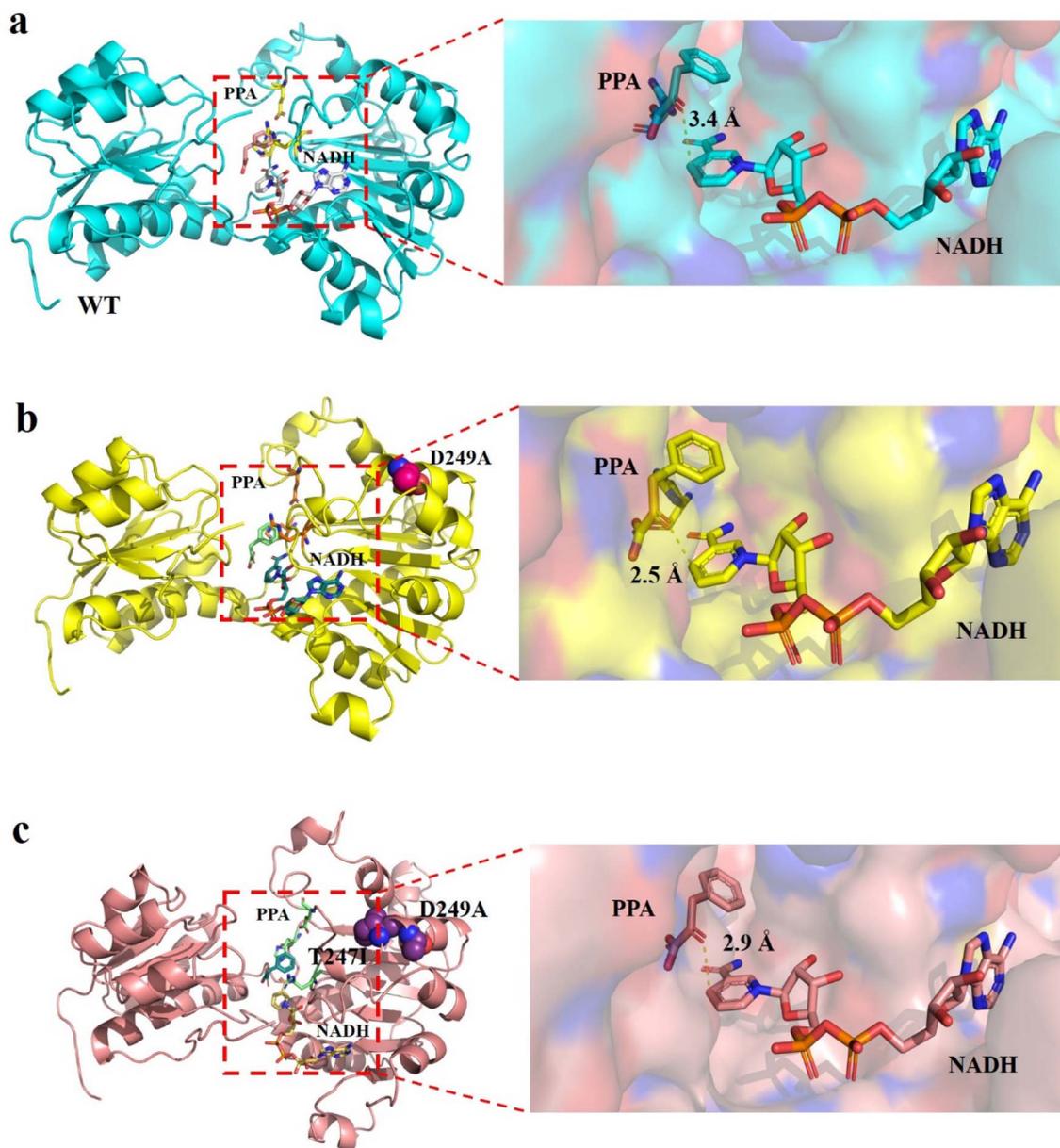


Fig. 6 Structural analysis of WT (a), mutant D249A (b) and mutant D249A/T247I (c). PPA and NADH are shown as sticks, mutated residues are shown as spheres, and dotted lines depict the distances between 4-position carbon atom of NADH nicotinamide ring and the carbonyl carbon of PPA.



stabilization time of the  $R_g$  value shortened to 67 ns, and the average value was reduced to about 2.15 (Fig. 5b). These results indicated that the protein structure was packed tighter than in wild-type *LrLDH* and the single mutant D249A, which slowed down the enzyme's inactivation at high temperatures.

Consequently, the MD simulations suggested that both the single mutant D249A and double mutant D249A/T247I had increased thermostability, which may be due to the enhancement of structural rigidity of the enzyme molecule caused by the change of intramolecular forces in the peripheral structure.<sup>38</sup> The calculated thermostability of mutant D249A/T247I was better than that of mutant D249A, which was consistent with the experimental results.

### Elucidating the mechanism of the enhanced activity

To elucidate the molecular mechanism of the enhanced catalytic activity of the best variant, structural models of wild-type *LrLDH*, the single mutant D249A and the double mutant D249A/T247I were constructed based on the crystal structure of LDH from *Lactobacillus helveticus* (PDB ID: 2DLN). Subsequently, PPA and NADH were docked into the active site (Fig. 6). When the substrate approached, the active center of the enzyme underwent a conformational change and the substrate was bound mainly through hydrophobic interactions, after which the catalytic reaction commenced. As it's stated in the literature of Wang *et al.*,<sup>39</sup> the hydrophobic interactions between the active center and the substrate, as well as the conformation of the active center, especially in terms of steric hindrance, have significant influence on the catalytic activity of the enzyme. However, amino acid residues 247 and 249 are both far from the active center of the enzyme (Fig. 6a), and mutations at these two sites have no significant effect on steric hindrance or hydrophobicity at the active site. However, NADH is the hydride donor in the redox reactions catalyzed by LDHs, whereby the hydrogen on the fourth carbon atom of the nicotinamide ring is transferred to the carbonyl carbon of the substrate, whereby the carbonyl is reduced to a hydroxyl.<sup>27</sup> Therefore, a closer distance between carbon 4 of the NADH nicotinamide ring and the carbonyl carbon of the substrate leads to higher hydride transfer efficiency, resulting in higher overall LDH catalytic activity. As shown in Fig. 6b–d, in the structures of wild-type *LrLDH*, single mutant D249A and double mutant D249A/T247I, the distances between carbon 4 of the NADH nicotinamide ring and the carbonyl carbon were 3.4, 2.5 and 2.9 Å, respectively. As a result, the catalytic activity of mutant D249A toward PPA was much higher than that of D249A/T247I and wild-type *LrLDH*. In addition, the  $K_m$  values were in the order: wild-type *LrLDH* > D249A/T247I > D249A, which can also help explain the observed changes of catalytic activity.

## Conclusions

In this study, the  $\text{D-LDH}$  *LrLDH* was engineered using computationally-assisted rational mutagenesis. The two mutants D249A and D249A/T247I showed significantly enhanced thermostability and catalytic activity compared with

the wild-type enzyme. Furthermore, the double mutant D249A/T247I exhibited a favorable balance between the two catalytic properties. MD simulations indicated that both D249A and D249A/T247I enzyme molecules tend to contract at high temperatures rather than expanding and unfolding, leading to the enhancement of thermostability. According to the kinetic analysis and molecular docking, the mutants exhibited increased affinity for PPA, with a shortened distance between the C4 atom of the nicotinamide ring of NADH and the carbonyl carbon atom of PPA, which also helps explain the observed improvement of catalytic activity toward PPA.

## Conflicts of interest

There are no conflicts to declare.

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