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# Design of highly active substrates using molecular docking for microbial transglutaminase detection†

 Longhao Zou, Xu Geng, Zhengqiang Li  and Tao Li \*

The transglutaminase (TGase) family catalyzes a transamidation reaction between glutamine (Gln) and lysine (Lys) residues on protein substrates. Highly active substrates are important for cross-linking and modifying proteins of TGase. In the present work, high-activity substrates have been designed based on the principles of enzyme–substrate interaction, using microbial transglutaminase (mTGase) as a research model of the TGase family. Substrates with high activity were screened using a combination of molecular docking and traditional experiments. Twenty-four sets of peptide substrates all produced good catalytic activity with mTGase. FFKKAYAV as the acyl acceptor and VLQRAY as the acyl donor group had the best reaction efficiency with highly sensitive detection of 26 nM mTGase. In addition, the substrate grouping, KAYAV and AFQSAY, detected 130 nM mTGase under physiological conditions (37 °C, pH 7.4), producing 20-fold higher activity than the natural substrate, collagen. The experimental results confirmed the potential for design of high-activity substrates by a combination of molecular docking and traditional experiments under physiological conditions.

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## Introduction

Transglutaminases (TGase, EC 2.3.2.13) are a widely distributed group of enzymes that catalyze the acyl transfer between inter- or intramolecular lysine  $\epsilon$ -amino groups and glutamate  $\gamma$ -carboxamido groups to form heteropeptide bonds.<sup>1–5</sup> The acyl donor is glutamine and the acyl acceptor is the  $\epsilon$ -amino group of lysine.<sup>1–8</sup> The accumulation of high molecular cross-linked product is found in a number of tissues, including skin, hair, blood clotting and wound healing.<sup>9–12</sup> Monitoring TGase activity is important for clinical diagnosis because dysregulation of certain TGase activity involves major disruptions of cellular homeostatic mechanisms, which is related to a number of human diseases, including neurodegenerative disease, metabolic disorders, cancers and fibrotic diseases.<sup>9–17</sup> Not surprisingly, high activity substrates of TGase can reduce non-specific binding and substrate flooding affixation, which are significant for the detection of TGase activity, the diagnosis of related diseases and drug discovery.<sup>18–22</sup> Currently, numerous works had been devoted to high activity TGase substrates that can compensate for the lack of specific coupling sites between enzymes and substrates.<sup>23–26</sup> Base on screening commercial peptide libraries is the most commonly used method of substrate optimization.<sup>24–26</sup> However, this traditional screening approach is time consuming and laborious to identify

multitudinous compounds with rich composition, varied properties, and structural diversity. The design of effective catalytic substrates according to the structural characteristic has not been fully investigated, nor has studied the enzyme activity under the human physiological environment.

Molecular docking methodology aims to predict the structure of receptor ligand complexes and study the affinities of small molecules within the binding site of particular receptor targets. It is used as a standard computational tool in drug design for lead compound optimization.<sup>27–29</sup> In recent years, many works have begun to use molecular docking technology to identify the interactions between enzymes and ligand, based on the enzyme structure and active site can be simulated by molecular docking software and optimal substrate-binding identified.<sup>27–31</sup> Compared with traditional experimental techniques, molecular docking is a virtual technique that uses computer simulation to analyze the interaction between receptors and ligands, which is low-cost and labor-saving. In particular, the method of combining computational analysis and experimental assays is a reasonable strategy to achieve effectively evaluation of many protein reactions.

Here, designing high activity substrates have been employed to develop highly sensitive assay for detecting TGase based on molecular docking and experimental studies. Microbial transglutaminase (mTGase) as one of  $\text{Ca}^{2+}$  independent TGase is our research model for designing high activity substrates to improve the reactivity of enzyme. mTGase is thought to have a novel discoidal three-dimensional (3D) structure with a deep cleft at the edge.<sup>20,21</sup> Cys<sup>64</sup> occupies the main catalytic site and is located at the bottom of the cleft, covered by the  $\alpha$ -helix. The left

Key Laboratory for Molecular Enzymology & Engineering, The Ministry of Education, School of Life Sciences, Jilin University, Changchun, China. E-mail: taoli@jlu.edu.cn

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wall of the active site cleft maintains the enzyme's structural stability while the right wall has a flexibility which reduces the spatial site block between the enzyme and the substrate. Thus, the active site Cys<sup>64</sup> is fully exposed to the solvent for rapid reaction with the substrate<sup>20–25</sup>. During catalysis, the mTGase active site has no preference for specific peptide sequence motifs, recognizing glutamine and lysine residues for cross-linking. Both glutamine (acyl donor) and lysine (acyl acceptor) residues are suitable substrates, producing different levels of reactivity. Therefore, mTGase has a higher reaction rate and broad substrate specificity relative to the mammalian TGases.<sup>23–25</sup> The high sensitivity detection due to the highly active substrate is of great significance to the application of mTGase in food safety and emerging biomedical engineering.<sup>20,32–51</sup> The current work used molecular docking and traditional experiments to develop high-sensitivity detection of mTGase assay, as follows: (1) peptides were designed and enzyme–substrate interaction simulated by Autodock-vina molecular docking software to allow selection of 6 highly reactive peptides as acyl donors combined with 4 acyl acceptors to produce 24 pairs of highly reactive mTGase substrate combinations; (2) enzyme activities with the 24 sets of substrates were measured and used to define the sensitivity of mTGase detection and identify the pair of substrate peptides with the best enzymatic reactivity; (3) effects of temperature and pH on the enzyme-catalyzed reaction were assessed and the peptide group with the best reactivity selected compared with the natural substrate under physiological conditions.

## Materials and methods

### Materials and reagents

mTGase was donated by Jiangsu Yiming Biological Products Co., Ltd. (Jiangsu, China) and purified using AKTA purifier (GE Healthcare, UK), see additional experimental section and Fig. S1 in ESI† for details. Twenty-two peptides, including one control peptide CP (CALNN) and twenty-one mTGase substrates (as shown in Table 1), were commercial synthesized by China-Peptides Ltd. (Shanghai, China). Collagen was purchased from Gentihold Science & Technology Co., Ltd (Beijing, China). BCA protein Assay kit and PageRuler Plus Prestained ladder were purchased from Thermo Fisher scientific Co., Ltd (Shanghai, China). Other chemicals were analytical grade. Milli-Q water (18.2 MΩ cm) was used in all experiments.

### Peptide substrate design

Acyl acceptors were based on literature reports and hydrophobicity modified to better suit the donor substrate.<sup>52–54</sup> Acyl donors, tetrapeptides and pentapeptides mostly use excellent substrates reported in the literature.<sup>52,54</sup> The hexapeptide was designed by taking Gln (Q) as the central residue, a peptide with a negative N-terminus and a positive C-terminus, which is according to the characteristics of amino acids near Gln (Q) from literature reports.<sup>55</sup> Amino acids appearing at each position are shown in Table S1 in the ESI.† Acyl donor sequences were designed by permuting and combining amino acids at

Table 1 Sequence of designed substrates

Acyl acceptor	Sequence	Hydrophobicity	Isoelectric point	Steric energy (kcal mol <sup>-1</sup> )
PA1	KAYA	−0.400	9.72	2711.120
PA2	KAYAV	0.520	8.50	2766.581
PA3	FMKHKFV	0.100	10.00	7118.663
PA4	FFKKAYAV	0.537	9.70	191.764
Acyl donor	Sequence	Hydrophobicity	Isoelectric point	Steric energy (kcal mol <sup>-1</sup> )
PD1	LQSP	0.53	7	959.866
PD2	FLQG	0.68	7	83.266
PD3	LLQG	0.93	7	29.177
PD4	LLQGA	1.10	5.52	32.441
PD5	LLQGP	0.42	5.52	3496.919
PD6	LGQAAY	0.483	5.52	65.780
PD7	PLQAVY	0.567	5.95	1186.156
PD8	AFQAAY	0.567	5.57	98.292
PD9	LVQRAY	0.083	8.75	126.364
PD10	VLQRAY	0.083	8.72	127.006
PD11	IGQSAY	0.05	5.52	86.862
PD12	FYQAAY	0.05	5.52	158.846
PD13	FWQAAY	0.117	5.52	223.324
PD14	AFQSAY	0.133	5.57	100.015
PD15	ILQRAY	0.133	8.75	121.629
PD16	FMQSAY	0.150	5.52	119.250
PD17	LPQAAY	0.167	5.52	2203.871
Acyl donor	Sequence	Hydrophobicity	Isoelectric point	Steric energy (kcal mol <sup>-1</sup> )
Control peptide (CP)	CALNN	0.22	5.25	533.6

different positions. Hydrophobicities, isoelectric points and steric energy of peptides were tested on the ExPASy site (<https://www.expasy.org/>).

### Molecular docking

Peptides were verified by AutoDock Vina,<sup>56</sup> an open-source program available from the Centre of Computational Structural Biology at The Scripps Research Institute. The structure of mTGase used for docking is from Protein Data Bank (PDB), and the PDB ID of mTGase is 1iU4. The acyl donor with the strongest binding to mTGase, according to binding energy score, was selected. In the docking experiment, the number of modes used in the molecular docking is 20. The docking grid box spacing was set to 0.375 Å, the box was a cube of side length 40 grid points, which can cover all residue positions on the mTGase active sites, and is big enough for substrate docking. The active site center was set to −2.718, 22.138, −4.549 (*x*, *y*, *z*). Cys<sup>64</sup>, Asp<sup>255</sup> and His<sup>274</sup> were set as flexible fragments and docking within the active pocket evaluated using AutoDock Vina.<sup>56</sup> Binding energies were accessed from the outputpdbqt file in the working directory. Pymol (an open-source molecular visualization system) was used to visualize the results of molecular docking.

### Enzymatic reaction

Assessment of mTGase catalytic activity subjected to various substrates was completed by measuring changes in turbidity (optical density (OD) values at 600 nm) at 25 °C by TECAN Infinite200 PRO multifunctional enzyme standard (Tecan Trading AG, Switzerland). Various concentrations (0.0001, 0.001, 0.01, 0.1, 1 and 10  $\mu\text{M}$ ) of peptides PA1–PA4 were used as acyl acceptors and of PD6, PD8, PD10, PD12, PD14, PD15 as acyl donors. Acceptors and donors were paired one by one to form 24 pairs of reaction groups in 50 mM MES buffer, pH 6. Substrates were incubated with 26  $\mu\text{M}$  mTGase at 40 °C for 30 min. Rates of gelation of 24 pairs of acceptor and donor peptides were measured by changes in OD<sub>600</sub> values during various reaction times (0–60 min) when incubated with 26  $\mu\text{M}$  mTGase at 40 °C. Activation of mTGase was assessed by using peptide pair PA4 + PD10 incubating with a range of mTGase concentrations (0.0026, 0.026, 0.26, 2.6, 26 and 260  $\mu\text{M}$ ) at 40 °C for 30 min. All these experiments were use CP (1  $\mu\text{M}$ ) as the negative control.

### Optimal substrates under physiological conditions

The impact of pH and temperature change on enzyme activity with different substrates was investigated across the temperature range, 25–60 °C and the pH range, 5–9. In this assay, PBS was used instead of MES buffer to dissolve substrates because PBS can provide wider buffering range. Five peptide pairs, PA2 + PD14; PA3 + PD14; PA4 + PD10, PA4 + PD14, PA1 + PD14 and the natural substrate, collagen, were dissolved in 20 mM PBS to make 1  $\mu\text{M}$  and 5  $\mu\text{M}$  substrate concentrations and incubated with 26  $\mu\text{M}$  mTGase. CP (1  $\mu\text{M}$ ) was used as the control. OD values at 600 nm were read after 60 min of reaction. Activation of mTGase under physiological conditions was assessed by incubating peptide pair, PA2 + PD14, with a range of mTGase concentrations (0.026, 0.13, 0.26, 1.3, 2.6, 13, 26 and 130  $\mu\text{M}$ ) in 20 mM PBS at 37 °C for 60 min. The natural substrate, collagen, was incubated with 0.26, 1.3, 2.6, 13, 26 and 130  $\mu\text{M}$  mTGase in 20 mM PBS at 37 °C for 60 min. All these experiments used CP (1  $\mu\text{M}$ ) as the negative control.

## Results and discussion

### Peptide design and molecular docking

Acyl acceptor and acyl donor substrates were designed based on the structure of mTGase and with reference to enzyme–substrate interactions.<sup>52–55</sup> The hydrophobicities, steric energy and isoelectric points of twenty-one peptides, including four acyl acceptors, PA1–PA4, and seventeen acyl donors, PD1–PD17, are shown in Table 1. Surface hydrophobicities of acceptors and donors were considered because only proteins with similar surface hydrophobicity are able to polymerize and crosslink.<sup>12,48</sup> The smaller the steric energy, the easier it is for the acyl acceptor and acyl donor be in sufficient proximity for reaction and the higher the enzymatic reaction efficiency.<sup>48,52,55</sup> Substrate requirements of mTGase towards acyl acceptors are considerably less strict than acyl donors due to the broad tolerance of the enzymes for the structural differences in acyl acceptors.<sup>12</sup> For acyl acceptors, isoelectric points of acyl acceptors should be

greater than the pH in the human body to ensure a positive charge and allow entry into the posterior part of the active pocket for biomedical engineering applications.<sup>48,50,57</sup> mTGase is more selective for acyl donors, so 17 acyl donors were docked using AutoDock vina.<sup>12,56</sup> The best scores of 17 conformation have been summarized in Table 2. The peptides achieving the best 6 conformational mean scores were PD6, PD8, PD12, PD14 PD10 and PD15. Based on the ranking of the best scores of 17 peptides, PD6, PD8, PD10, PD12, PD14, PD15 were selected as acyl donor substrates. Acyl acceptors, PA1–PA4, were used as acceptor substrates to pair with PD6, PD8, PD10, PD12, PD14, PD15 for enzymatic reactions, respectively. This result shows the ability of molecular docking technology to virtualize the recognition between the enzyme and substrate peptide designed on the basis of the active site and structural characteristics. According to the best score of docking results, the best substrate sequence was screened fast, which sets the foundation for further enzyme reaction experiments.

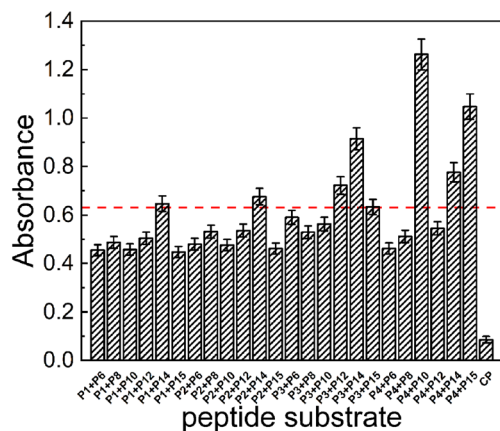
### Enzymatic reactions of synthetic substrates

The four acyl acceptor and six acyl donor peptides showing strong binding to mTGase from molecular docking experiments were assayed for enzyme catalytic activity. Peptides were paired to form twenty-four groups as double substrate peptides for mTGase with CP as a negative control (as shown in Fig. 1). CALNN was used as CP due to there is no glutamine (acyl donor) and lysine (acyl acceptor) residues in the sequence can be recognized by mTGase active site for cross-linking. All peptide pairs reacted efficiently with mTGase, indicating entry into the mTGase reaction pocket and catalysis of the reaction between acyl donor and acyl acceptor producing cross-linking. Eight peptide pairs, PA4 + PD10, PA4 + PD15, PA3 + PD14, PA4 + PD14, PA3 + PD12, PA2 + PD14, PA1 + PD14 and PA3 + PD15, produced signal intensities for the catalyzed reaction which were more than 50% of the strongest signal (as shown in Fig. 1). For acyl receptors, PA4 is more easily recognized by mTGase, because it

Table 2 Molecular docking of acyl donors

Acyl donors	Sequence	Score (kcal mol <sup>-1</sup> )
1	LQSP	-7.00
2	FLQG	-6.29
3	LLQG	-6.54
4	LLQGA	-6.90
5	LLQGP	-7.10
6	LGQAAY	-8.24
7	PLQAVY	-6.80
8	AFQAAY	-8.01
9	LVQRAY	-6.28
10	VLQRAY	-7.32
11	IGQSAY	-7.16
12	FYQAAY	-7.83
13	FWQAAY	-6.67
14	AFQSAY	-7.58
15	ILQRAY	-7.20
16	FMQSAY	-6.66
17	LPQAAY	-6.03



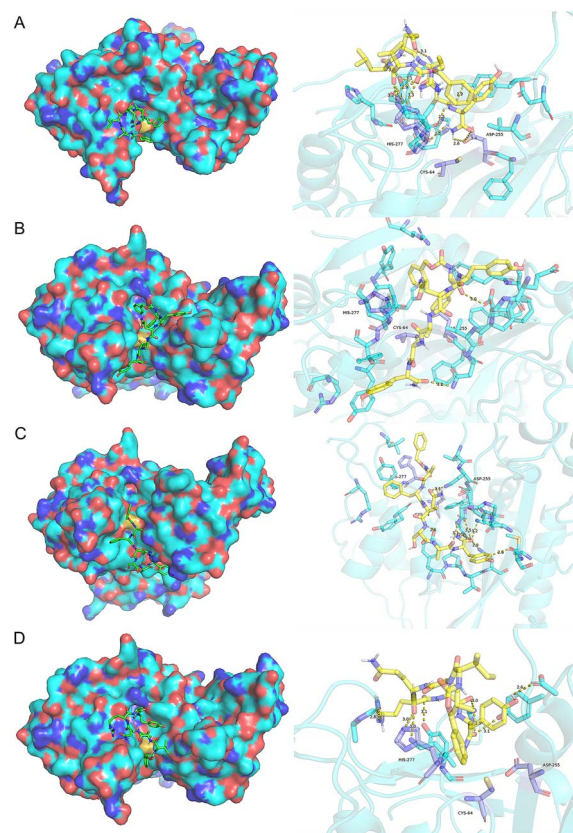


**Fig. 1** Four acyl acceptors and six acyl donors were paired one by one to form 24 pairs of reaction groups as double substrate peptides to react with mTGase in MES (50 mM, pH 6) buffer at 40 °C for 30 min. mTGase was present at a 26  $\mu\text{M}$  concentration and the substrate pair at 1  $\mu\text{M}$ . CALNN (CP) (1  $\mu\text{M}$ ) was used as a negative control. The red dotted line shows the location of 50% of the strongest OD<sub>600</sub> value (PA4 + PD10).

not only has the lowest steric energy but also two adjacent Lys (K) residue in the sequence which significantly increases enzymatic reactivity.<sup>58</sup> For acyl donors, absolute binding energy values for PD10, PD12, PD14 and PD15 were all greater than 7 in molecular docking analyses. Thus, it can be concluded that all these acyl donors bound to the mTGase<sup>59</sup> (as shown in Fig. 2 and Table 2). Enzymatic reactivities were also assessed for these peptide substrates. Pair PA4 + PD10 showed the highest activity. Enzymatic efficiency of acyl donor/acyl acceptor pairs in order of magnitude was: PA4 + PD10 > PA4 + PD15 > PA3 + PD14 > PA4 + PD14 > PA5 + PD12 > PA2 + PD14 > PA1 + PD14 > PA3 + PD15 (as shown in Fig. S2–S9 in the ESI<sup>†</sup>). These results conform to the comprehensive consideration of (1) the steric energy, (2) the distribution of active sites and (3) the principle that the more similar the hydrophobicity between acyl acceptor and acyl donor, the stronger the binding force and the higher the enzymatic reaction efficiency (as shown in Tables 1 and 2). The results of traditional experiments are consistent with the results of molecular docking, which confirms the reliability of molecular docking technology based on computer virtual.

### Use of peptides for quantitative detection of mTGase activity

The development of a highly sensitive mTGase detection assay would be of great value to avoid substrate flooding caused by nonspecific conjugation in biological samples. The cross-linking caused by mTGase catalyses acyl-transfer reactions will produce gels, which will lead to changes in the turbidity of the reaction solution. Therefore, the turbidity of the reaction solution can be used to characterize the efficiency of enzyme reaction.<sup>60</sup> Experiments were designed to determine the detection limit of mTGase by monitoring the increase in gelation solution turbidity resulting from the gel formation using the newly-designed substrates. Enzymatic efficiencies of pairs, PA4 + PD10, PA4 + PD15, PA3 + PD14, PA4 + PD14, PA3 + PD12, PA2 +



**Fig. 2** Molecular docking of acyl donors (A) PD10, (B) PD12, (C) PD14, (D) PD15 were visualized using Pymol. Acyl donors enter the active pocket (shown on the left) and the hydrogen bond interactions of the substrate with the active site residues Cys<sup>64</sup>, Asp<sup>255</sup> and His<sup>274</sup> (shown on the right). The distance (in angstroms) between atoms is shown by the dashed line. Absolute binding energy values for PD10, PD12, PD14 and PD15 were 7.32, 7.83, 7.58 and 7.20 kcal mol<sup>-1</sup>, respectively.

PD14, PA1 + PD14 and PA3 + PD15, are shown in Fig. 3(A). The signal intensity of the mixture of substrates and mTGase was increased by increasing reaction time and began to saturate after 30 min, indicating an effective gelation. To obtain a high sensitivity of assay, pair PA4 + PD10 was used as a peptide substrate in the following mTGase detection. As shown in Fig. 3(B), mTGase activity could be detected as low as 26 nM in the mTGase assay buffer. The detection signal was linear with respect to the logarithm of the mTGase concentration between 2.6 nM and 2.6  $\mu\text{M}$ . This mTGase concentration is almost 3 orders of magnitude lower than those of 26  $\mu\text{M}$  used in site specific conjugation in biomedical and bioengineering.<sup>19,60</sup> Such a low concentration of mTGase would prevent non-specific binding, improve the efficiency of the enzymatic reaction, and achieve high-sensitivity detection of mTGase in the field of food safety. In addition, the experiment result confirms that the molecular docking-based assay could be used to design highly active substrates for the TGase family to improve the efficiency of cross-linking and protein modification, achieve high-sensitivity detection and diseases diagnosis, which will bring great benefits for biomedical applications.

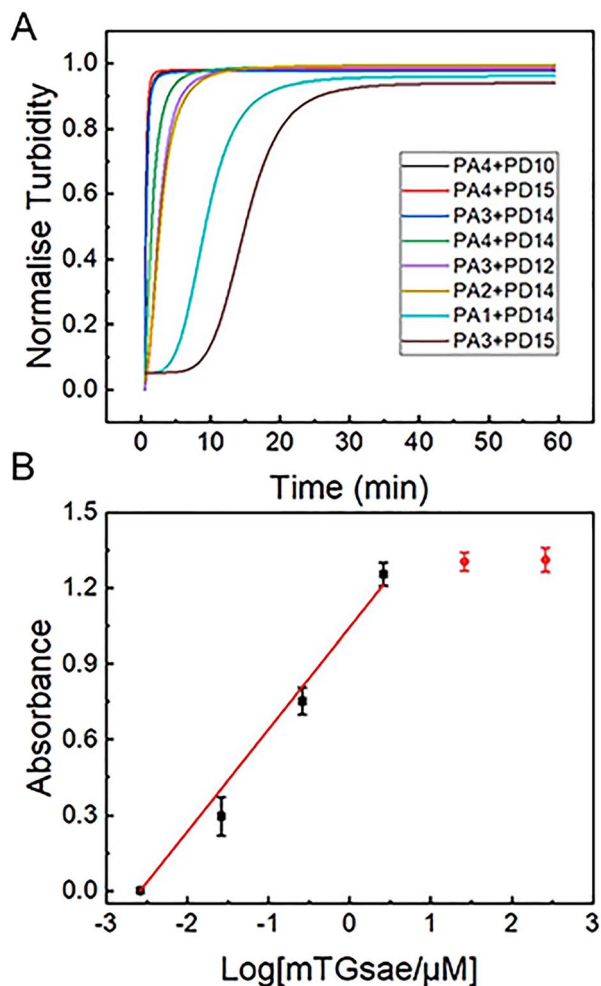


Fig. 3 (A) Rate of gelation of 24 pairs of acceptor and donor peptides catalyzed by mTGase measured by changes in  $\text{OD}_{600}$  values after various reaction times (0–60 min).  $26 \mu\text{M}$  mTGase and  $1 \mu\text{M}$  peptide pair were present. (B) Logarithmic plots of the integrated  $\text{OD}_{600}$  values as a function of the concentration of mTGase (0.0026, 0.026, 0.26, 2.6, 26 and  $260 \mu\text{M}$ ) in MES buffer (50 mM, pH 6). The concentration of peptide pair, PA4 + PD10, was  $1 \mu\text{M}$ . Average  $\text{OD}_{600}$  value of CP has been subtracted from signal value (as shown in Fig. 1).

#### Activity of designed substrates under physiological conditions

The impact of pH and temperature change on enzyme activity with the peptides have also been measured since the activity of substrates and the catalytic efficiency of mTGase is strongly dependent on its environment. In particular,  $37 \text{ }^\circ\text{C}$  and pH 7.4 were emphasized since many diseases detection and the bioengineering applications need to be carried out under physiological conditions. The results of 5 groups of substrate peptides, PA4 + PD10, PA3 + PD14, PA4 + PD14, PA2 + PD14 and PA1 + PD14, and natural substrate collagen, across the pH range, 5–9 and temperature range, 25– $60 \text{ }^\circ\text{C}$  were shown in Fig. 4 (PA3 + PD12, PA4 + PD15 and PA3 + PD15 were not studied, since the acyl donors PD12 and PD15 were unstable with pH change). Enzymatic activity with all pairs of substrates varied with temperature and pH, producing slightly stronger effects for the synthetic peptides than for the natural substrates.

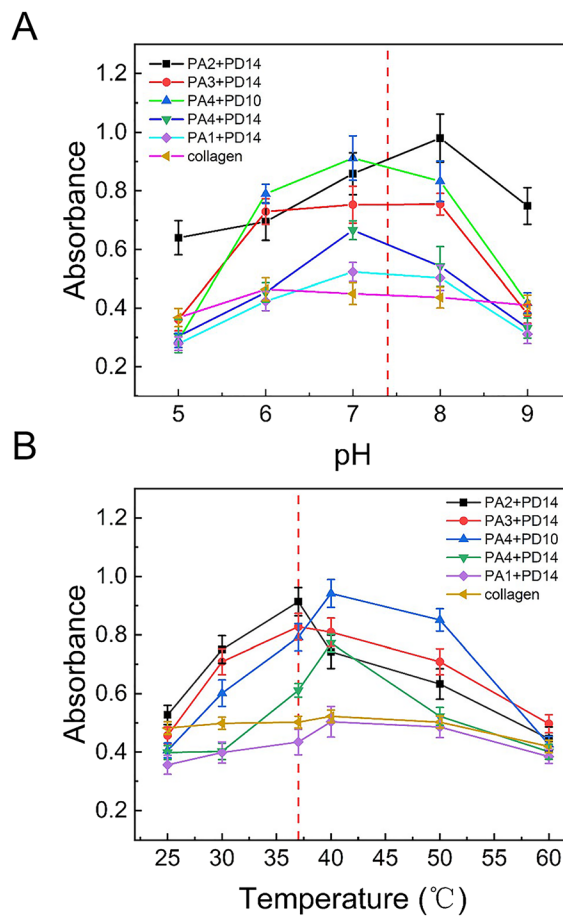


Fig. 4 (A) The activity of mTGase with five peptide pairs, PA2 + PD14; PA3 + PD14; PA4 + PD10, PA4 + PD14, PA1 + PD14 and collagen, across pH 5 to 9. (B) The activity of mTGase with five peptide pairs, PA2 + PD14; PA3 + PD14; PA4 + PD10, PA4 + PD14, PA1 + PD14 and collagen, across temperature  $25 \text{ }^\circ\text{C}$  to  $60 \text{ }^\circ\text{C}$ . The concentration of mTGase was  $26 \mu\text{M}$ . The concentration of PA2 + PD14, PA3 + PD14, PA4 + PD10, PA4 + PD14 and PA1 + PD14 was  $1 \mu\text{M}$  in 20 mM PBS buffer. The concentration of collagen was  $5 \mu\text{M}$ . The red dotted line shows the location of physiological conditions ( $37 \text{ }^\circ\text{C}$  and pH 7.4). Average  $\text{OD}_{600}$  value of CP has been subtracted from signal value (as shown in Fig. 1).

The peptide pair, P2 + P14, produced the highest enzyme activity under physiological conditions ( $37 \text{ }^\circ\text{C}$ , pH 7.4).

The synthetic peptide pair, P2 + P14, which produced the highest enzyme activity under physiological conditions, was compared with collagen, the preferred natural substrate for mTGase<sup>61,62</sup> (as shown in Fig. 5). Under physiological conditions, the P2 + P14 substrate pair allowed detection of mTGase activity at concentrations as low as  $130 \text{ nM}$ . The signal intensity increased linearly with increasing mTGase concentration between  $130 \text{ nM}$  to  $26 \mu\text{M}$  and saturation was observed above  $26 \mu\text{M}$ . The detection limit of mTGase was  $2.6 \mu\text{M}$  with a collagen substrate. Thus, mTGase activity showed a 20-fold enhancement with the synthetic peptide pair compared with collagen. The experiment demonstrates the potential for TGase-related disease diagnosis under physiological conditions. Meanwhile, after considering the unfavourable behaviours of peptides on

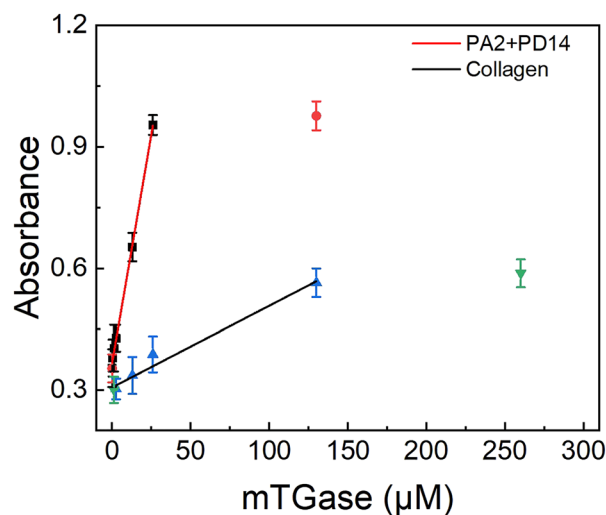


Fig. 5 Plots of integrated OD<sub>600</sub> values as a function of the concentration of mTGase (0.026, 0.13, 0.26, 1.3, 2.6, 13, 26 and 130 μM) incubated with P2 + P14, and mTGase (1.3, 2.6, 13, 26, 130 and 260 μM) incubated with collagen in 20 mM PBS at 37 °C for 60 min. The concentration of peptide pair P2 + P14 was 1 μM and of collagen 5 μM. Average OD<sub>600</sub> value of CP has been subtracted from signal value (as shown in Fig. 1).

pharmacokinetics (e.g. plasma stability and membrane permeability), this method can also provide a new idea for drug discovery. Furthermore, design of synthetic peptides by this method may replace natural protein substrates, excluding adverse effects of non-specific reactions and showing great promise for the field of biomedical engineering.

## Conclusions

We have developed a high activity substrates design method based on molecular docking and experimental assay for sensitive profiling the activity of mTGase. The ability to design high activity substrates under physiological conditions provides a distinct advantage for mTGase assays. We have demonstrated the utility of the combination of molecular docking and traditional experiments in designing highly active enzyme substrates. The proof-of-concept study opens an avenue for further exploring highly sensitive detection method of TGase family, providing more accurate results for the diagnosis of related diseases and drug discovery. This approach will strongly supplement existing enzymatic techniques and provide a potential tool with a high throughput format for screening high activity substrates under physiological conditions.

## Author contributions

Tao Li contributed to conception, design of the study and finalization of manuscript. Longhao Zou did a major part of molecular docking, data analysis, assisted in enzyme experiments and wrote the first draft of the manuscript. Xu Geng developed the major enzyme experiment and wrote sections of the manuscript. Zengqiang Li thoroughly reviewed the

manuscript. All authors contributed to manuscript revision, read and approved the submitted version.

## Conflicts of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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## References

- 1 D. D. Clarke, M. J. Mycek, A. Neidle and H. Waelsch, *Arch. Biochem. Biophys.*, 1959, **79**, 338–354.
- 2 J. J. Pisano, J. S. Finlayson and M. P. Peyton, *Science*, 1968, **160**, 892–893.
- 3 T. Kanaji, H. Ozaki, T. Takao, H. Kawajiri, H. Ide, M. Motoki and Y. Shimonishi, *J. Biol. Chem.*, 1993, **268**, 11565–11572.
- 4 S. Del Duca, S. Beninati and D. Serafini-Fracassini, *Biochem. J.*, 1995, **305**(Pt 1), 233–237.
- 5 R. N. Singh and K. Mehta, *Eur. J. Biochem.*, 1994, **225**, 625–634.
- 6 J. Zhang and Y. Masui, *Mol. Reprod. Dev.*, 1997, **47**, 302–311.
- 7 H. Yasueda, Y. Kumazawa and M. Motoki, *Biosci., Biotechnol., Biochem.*, 1994, **58**, 2041–2045.
- 8 E. G. Puszkin and V. Raghuraman, *J. Biol. Chem.*, 1985, **260**, 16012–16020.
- 9 L. Fesus, A. Madi, Z. Balajthy, Z. Nemes and Z. Szondy, *Experientia*, 1996, **52**, 942–949.
- 10 V. Gentile, V. Thomazy, M. Piacentini, L. Fesus and P. J. Davies, *J. Cell Biol.*, 1992, **119**, 463–474.
- 11 R. A. Jones, B. Nicholas, S. Mian, P. J. Davies and M. Griffin, *J. Cell Sci.*, 1997, **110**(Pt 19), 2461–2472.
- 12 C. S. Greenberg, P. J. Birckbichler and R. H. Rice, *FASEB J.*, 1991, **5**, 3071–3077.
- 13 M. Lesort, J. Tucholski, M. L. Miller and G. V. W. Johnson, *Prog. Neurobiol.*, 2000, **61**, 439–463.
- 14 W. Dieterich, T. Ehnis, M. Bauer, P. Donner, U. Volta, E. O. Riecken and D. Schuppan, *Nat. Med.*, 1997, **3**, 797–801.
- 15 P. J. Birckbichler, G. R. Orr, E. Conway and M. K. Patterson, Jr., *Cancer Res.*, 1977, **37**, 1340–1344.
- 16 R. N. Barnes, P. J. Bungay, B. M. Elliott, P. L. Walton and M. Griffin, *Carcinogenesis*, 1985, **6**, 459–463.
- 17 M. Griffin, L. L. Smith and J. Wynne, *Br. J. Exp. Pathol.*, 1979, **60**, 653–661.
- 18 N. M. Rachel and J. N. Pelletier, *Biomolecules*, 2013, **3**, 870–888.
- 19 S. E. Farias, P. Strop, K. Delaria, M. G. Casas, M. Dorywalska, D. L. Shelton, J. Pons and A. Rajpal, *Bioconjugate Chem.*, 2014, **25**, 240–250.



- 20 S. Jeger, K. Zimmermann, A. Blanc, J. Grunberg, M. Honer, P. Hunziker, H. Struthers and R. Schibli, *Angew. Chem., Int. Ed.*, 2010, **49**, 9995–9997.
- 21 P. Dennler, A. Chiotellis, E. Fischer, D. Bregeon, C. Belmant, L. Gauthier, F. Lhospipe, F. Romagne and R. Schibli, *Bioconjugate Chem.*, 2014, **25**, 569–578.
- 22 S. Dickgiesser, M. Rieker, D. Mueller-Pompalla, C. Schroter, J. Tonillo, S. Warszawski, S. Raab-Westphal, S. Kuhn, T. Knehans, D. Konning, J. Dotterweich, U. A. K. Betz, J. Anderl, S. Hecht and N. Rasche, *Bioconjugate Chem.*, 2020, **31**, 1070–1076.
- 23 D. Fiebig, S. Schmelz, S. Zindel, V. Ehret, J. Beck, A. Ebenig, M. Ehret, S. Frols, F. Pfeifer, H. Kolmar, H. L. Fuchsbaauer and A. Scrima, *J. Biol. Chem.*, 2016, **291**, 20417–20426.
- 24 Y. Sugimura, M. Hosono, F. Wada, T. Yoshimura, M. Maki and K. Hitomi, *J. Biol. Chem.*, 2006, **281**, 17699–17706.
- 25 Y. Sugimura, K. Yokoyama, N. Nio, M. Maki and K. Hitomi, *Arch. Biochem. Biophys.*, 2008, **477**, 379–383.
- 26 K. Hitomi, M. Kitamura and Y. Sugimura, *Amino Acids*, 2009, **36**, 619–624.
- 27 X. Zheng, P. Pu, B. T. Ding, W. C. Bo, D. Y. Qin and G. Z. Liang, *Food Chem.*, 2021, **362**, 9.
- 28 E. Bilen, U. O. Ozmen, S. Cete, S. Alyar and A. Yasar, *Chem.-Biol. Interact.*, 2022, **360**, 14.
- 29 M. J. M. Ridhwan, S. I. Abu Bakar, N. Abd Latip, N. Ab Ghani and N. H. Ismail, *J. Comput. Biophys. Chem.*, 2022, **21**, 259–285.
- 30 Y. L. Li, S. Y. Zhang, Z. J. Bao, N. Sun and S. Y. Lin, *Innovative Food Sci. Emerging Technol.*, 2022, **76**, 10.
- 31 S. Taj, M. Ahmad and U. A. Ashfaq, *Int. J. Biol. Macromol.*, 2022, **207**, 507–521.
- 32 A. J. Gerrard, S. E. Fayle, P. A. Brown, K. H. Sutton, L. Simmons and I. Rasiah, *J. Food Sci.*, 2001, **66**, 782–786.
- 33 P. Trespalacios and R. Pla, *Food Chem.*, 2007, **100**, 264–272.
- 34 X. F. Zhou, Y. R. Zheng, Y. Zhong, D. F. Wang and Y. Deng, *Food Chem.*, 2022, **383**, 14.
- 35 M. Kieliszek and A. Misiewicz, *Folia Microbiol.*, 2014, **59**, 241–250.
- 36 J. Cortez, P. L. R. Bonner and M. Griffin, *Enzyme Microb. Technol.*, 2004, **34**, 64–72.
- 37 M. M. Taylor, L. Bumanlag, W. N. Marmer and E. M. Brown, *J. Am. Leather Chem. Assoc.*, 2006, **101**, 169–178.
- 38 G. C. Du, L. Cui, Y. Zhu and J. Chen, *Enzyme Microb. Technol.*, 2007, **40**, 1753–1757.
- 39 M. H. Kamani, J. Semwal and A. M. Khaneghah, *Colloids Surf., B*, 2022, **211**, 15.
- 40 N. Doti, A. Caporale, A. Monti, A. Sandomenico, F. Selis and M. Ruvo, *World J. Microbiol. Biotechnol.*, 2020, **36**, 14.
- 41 M. C. Echave, C. Pimenta-Lopes, J. L. Pedraz, M. Mehrali, A. Dolatshahi-Pirouz, F. Ventura and G. Orive, *Int. J. Pharm.*, 2019, **562**, 151–161.
- 42 C. V. L. Giosafatto, A. Fusco, A. Al-Asmar and L. Mariniello, *Int. J. Mol. Sci.*, 2020, **21**, 17.
- 43 D. Gupta, J. W. Santoso and M. L. McCain, *Bioengineering*, 2021, **8**, 16.
- 44 H. Schneider, L. Deweid, O. Avrutina and H. Kolmar, *Anal. Biochem.*, 2020, **595**, 13.
- 45 X. Li and D. D. Fan, *ACS Biomater. Sci. Eng.*, 2019, **5**, 3523–3536.
- 46 Y. Zhu and J. Tramper, *Trends Biotechnol.*, 2008, **26**, 559–565.
- 47 P. Strop, *Bioconjugate Chem.*, 2014, **25**, 855–862.
- 48 S. K. Chan and T. S. Lim, *Appl. Microbiol. Biotechnol.*, 2019, **103**, 2973–2984.
- 49 C. W. Yung, L. Q. Wu, J. A. Tullman, G. F. Payne, W. E. Bentley and T. A. Barbari, *J. Biomed. Mater. Res., Part A*, 2007, **83**, 1039–1046.
- 50 M. P. Savoca, E. Tonoli, A. G. Atobatele and E. A. M. Verderio, *Micromachines*, 2018, **9**, 23.
- 51 A. N. Zelikin, C. Ehrhardt and A. M. Healy, *Nat. Chem.*, 2016, **8**, 997–1007.
- 52 M. T. Gundersen, J. W. Keillor and J. N. Pelletier, *Appl. Microbiol. Biotechnol.*, 2014, **98**, 219–230.
- 53 A. Caporale, F. Selis, A. Sandomenico, G. S. Jotti, G. Tonon and M. Ruvo, *Biotechnol. J.*, 2015, **10**, 154–161.
- 54 L. Deweid, O. Avrutina and H. Kolmar, *Methods Mol. Biol.*, 2019, **2012**, 151–169.
- 55 J. H. Lee, C. Song, D. H. Kim, I. H. Park, S. G. Lee, Y. S. Lee and B. G. Kim, *Biotechnol. Bioeng.*, 2013, **110**, 353–362.
- 56 O. Troott and A. J. Olson, *J. Comput. Chem.*, 2010, **31**, 455–461.
- 57 U. Tagami, N. Shimba, M. Nakamura, K. Yokoyama, E. Suzuki and T. Hirokawa, *Protein Eng., Des. Sel.*, 2009, **22**, 747–752.
- 58 M. Malesevic, A. Migge, T. C. Hertel and M. Pietzsch, *ChemBioChem*, 2015, **16**, 1169–1174.
- 59 L. L. Yang, D. Y. Li, Y. B. Zhang, M. Y. Zhu, D. Chen and T. D. Xu, *Acta Pharmacol. Sin.*, 2012, **33**, 41–48.
- 60 R. C. Deller, T. Richardson, R. Richardson, L. Bevan, I. Zampetakis, F. Scarpa and A. W. Perriman, *Nat. Commun.*, 2019, **10**, 1887–1897.
- 61 J. G. Fernandez, S. Seetharam, C. Ding, J. Feliz, E. Doherty and D. E. Ingber, *Tissue Eng., Part A*, 2017, **23**, 135–142.
- 62 R. N. Chen, H. O. Ho and M. T. Sheu, *Biomaterials*, 2005, **26**, 4229–4235.