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# A novel chemical biology and computational approach to expedite the discovery of new-generation polymyxins against life-threatening *Acinetobacter baumannii*†

Xukai Jiang,<sup>ab</sup> Nitin A. Patil,<sup>id b</sup> Mohammad A. K. Azad,<sup>b</sup> Hasini Wickremasinghe,<sup>b</sup> Heidi Yu,<sup>b</sup> Jinxin Zhao,<sup>b</sup> Xinru Zhang,<sup>b</sup> Mengyao Li,<sup>b</sup> Bin Gong,<sup>c</sup> Lin Wan,<sup>id c</sup> Wendong Ma,<sup>d</sup> Philip E. Thompson,<sup>id e</sup> Kai Yang,<sup>id d</sup> Bing Yuan,<sup>id d</sup> Falk Schreiber,<sup>fg</sup> Lushan Wang,<sup>h</sup> Tony Velkov,<sup>i</sup> Kade D. Roberts<sup>b</sup> and Jian Li<sup>id \*b</sup>

Multidrug-resistant Gram-negative bacteria represent a major medical challenge worldwide. New antibiotics are desperately required with 'old' polymyxins often being the only available therapeutic option. Here, we systematically investigated the structure–activity relationship (SAR) of polymyxins using a quantitative lipidomics-informed outer membrane (OM) model of *Acinetobacter baumannii* and a series of chemically synthesized polymyxin analogs. By integrating chemical biology and all-atom molecular dynamics simulations, we deciphered how each residue of the polymyxin molecule modulated its conformational folding and specific interactions with the bacterial OM. Importantly, a novel designed polymyxin analog FADDI-287 with predicted stronger OM penetration showed improved *in vitro* antibacterial activity. Collectively, our study provides a novel chemical biology and computational strategy to expedite the discovery of new-generation polymyxins against life-threatening Gram-negative 'superbugs'.

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## 1. Introduction

Antibiotic resistance is an urgent threat to global health.<sup>1</sup> Due to high morbidity and mortality, multidrug-resistant (MDR) Gram-negative *Acinetobacter baumannii*, *Klebsiella pneumoniae* and *Pseudomonas aeruginosa* have been identified by the World Health Organization (WHO) as the top three priority pathogens desperately requiring new therapeutic options.<sup>2</sup> The lack of new antibiotics to treat infections caused by such pathogens has

revived the use of 'old' polymyxins (polymyxin B and colistin) as a last-line therapy to combat infections caused by these MDR 'superbugs'.<sup>3,4</sup> Worryingly, the emergence and spread of polymyxin resistance threatens the utility of these agents and would render life-threatening MDR infections virtually untreatable.<sup>5</sup> Therefore, new-generation polymyxins are urgently needed. To date, >2000 polymyxin analogs have been generated in various medicinal chemistry programs using empirical-based approaches.<sup>6–8</sup> Unfortunately, most analogs are less active than native polymyxins, although a very small number of analogs (*e.g.* CA824, CA900 and CA1049) show slightly improved activity against Gram-negative pathogens.<sup>7</sup> The knowledge gap in our understanding of the structure–activity relationship (SAR) of polymyxins has significantly hindered the discovery of new-generation polymyxins.

Polymyxin antibacterial activity occurs primarily *via* binding to lipopolysaccharides (LPS) and disrupting the bacterial outer membrane (OM).<sup>6,9</sup> Therefore, understanding the interaction between polymyxins and the OM is essential for elucidation of the mechanism and rational drug design. However, examining polymyxin–membrane interactions using current experimental approaches is challenging. Previous attempts to characterize polymyxin SAR focused on polymyxin interactions with a single LPS molecule;<sup>6,8,10,11</sup> this approach identified the hydrophobic segments (*e.g.* fatty acyl group, *D*-Phe<sup>6</sup> and Leu<sup>7</sup> of polymyxin B)

<sup>a</sup>National Glycoengineering Research Center, Shandong University, Qingdao, China

<sup>b</sup>Biomedicine Discovery Institute, Infection & Immunity Program, Monash University, Melbourne, Australia. E-mail: Jian.Li@monash.edu; Fax: +61 3 9905 6450; Tel: +61 3 9903 9702

<sup>c</sup>School of Software, Shandong University, Jinan, China

<sup>d</sup>Centre for Soft Condensed Matter Physics and Interdisciplinary Research, School of Physical Science and Technology, Soochow University, Suzhou, China

<sup>e</sup>Medicinal Chemistry, Monash Institute of Pharmaceutical Science, Faculty of Pharmacy and Pharmaceutical Sciences, Monash University, Melbourne, Australia

<sup>f</sup>Department of Computer and Information Science, University of Konstanz, Konstanz, Germany

<sup>g</sup>Faculty of Information Technology, Monash University, Melbourne, Australia

<sup>h</sup>State Key Laboratory of Microbial Technology, Shandong University, Qingdao, China

<sup>i</sup>Department of Pharmacology & Therapeutics, University of Melbourne, Melbourne, Australia

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and positively-charged L- $\alpha$ - $\gamma$ -diaminobutyric (Dab) acid residues as essential for LPS binding. However, these simplified LPS-based SAR models fail to mimic polymyxin interactions with the bacterial OM, thereby hampering our understanding of their exact mode of action.<sup>12</sup> Here, we employed an experimentally-based bacterial OM model rather than a single LPS molecule to develop a novel polymyxin SAR model through integrating all-atom molecular dynamics (MD) simulations and chemical biology approaches. Our *in vitro* results supported the utility of this SAR model to predict the antimicrobial activity of polymyxin analogs, which will significantly accelerate the discovery of next-generation polymyxins against problematic Gram-negative pathogens.

## 2. Results and discussion

### 2.1. Polymyxin B formed a unique folded conformation upon penetration into the OM

A very small number of MD simulation studies have previously been conducted with polymyxins.<sup>13–16</sup> In these studies only polymyxin B and colistin A were used to examine the interactions with the bacterial OM and limited SAR information of polymyxins could be inferred. Therefore, we firstly developed

a precision bacterial OM model containing lipid A, phosphatidylethanolamine (PE), phosphatidylglycerol (PG) and cardiolipin; the composition and chemotype of each component were determined based upon our quantitative lipidomics data from *A. baumannii* (Fig. S1, ESI†).<sup>17</sup> The asymmetry and heterogeneity of our lipidomics-informed OM model well represents the complexity of the bacterial OM<sup>18,19</sup> and allowed us to precisely determine membrane–polymyxin interactions at the membrane level.<sup>12</sup> Furthermore, we synthesized a series of polymyxin B<sub>3</sub> (PMB<sub>3</sub>) analogs with alanine-substitution at each amino acid position except the bridging Dab<sup>4</sup> (Fig. S2–S12, ESI†). PMB<sub>3</sub> was selected as a representative of polymyxins because it has similar antibacterial activity to polymyxin B<sub>1</sub> and colistin A<sup>14,17</sup> and lacks the chiral methyl group in the N-terminal fatty acyl chain. The combination of experimental and computational approaches enabled us to better understand the OM-based SAR of polymyxins and will assist in the discovery of novel polymyxin lead compounds.

First, we employed all-atom MD simulations to comprehensively examine polymyxin penetration through the OM outer leaflet, the major permeability barrier of bacterial cells.<sup>18</sup> PMB<sub>3</sub> transitioned from an extended to a folded conformation upon penetration into the OM hydrophobic center (Fig. 1A, Band S13,



Fig. 1 Simulations of polymyxin B<sub>3</sub> with the *A. baumannii* OM. (A and B) Polymyxin B<sub>3</sub> conformations in the headgroup region and hydrophobic center of the OM. (C) Distance distribution of polymyxin geometry in the OM. (D) Interaction of polymyxin B<sub>3</sub> with lipid A molecules in the OM. (E) Interaction energy between polymyxin B<sub>3</sub> and the OM.



ESI<sup>†</sup>). The distance between its fatty acyl chain (using its first carbon atom) and Leu<sup>7</sup> (using its C<sub>α</sub> atom) was 1.89 ± 0.24 nm in the OM headgroup but significantly decreased to 1.14 ± 0.19 nm in the hydrophobic center (Fig. 1C), showing a folding process during penetration. In the folded state, hydrophobic D-Phe<sup>6</sup>, Leu<sup>7</sup> and the fatty acyl chain oriented toward the OM hydrophobic center, while the polar (Thr<sup>2</sup> and Thr<sup>10</sup>) and positively-charged Dab residues bound to the headgroups of four lipid A molecules (Fig. 1D). Specifically, Dab<sup>1</sup> interacted with the 1-phosphate group of #1 lipid A; Dab<sup>3</sup> and Dab<sup>8</sup> bound to the 4'-phosphate group of #2 lipid A; Dab<sup>5</sup> interacted with the 4'-phosphate group of #3 lipid A; Dab<sup>9</sup> interacted with the 4'-phosphate group of #3 lipid A and the 1-phosphate group of #4 lipid A. Our findings reveal that modifications of the lipid A phosphate groups substantially minimize their interaction with polymyxins.<sup>12,13</sup> Additionally, the fatty acyl chain, D-Phe<sup>6</sup> and Leu<sup>7</sup> made hydrophobic contacts with the tails of lipid A. Energy analysis revealed electrostatic interactions from Dab<sup>1</sup> (−51.6 ± 2.9 kcal mol<sup>−1</sup>) and Dab<sup>9</sup> (−96.5 ± 8.1 kcal mol<sup>−1</sup>) made prominent contributions to OM binding, which is ~5–10 fold greater than the hydrophobic interactions from D-Phe<sup>6</sup> (−12.6 ± 0.4 kcal mol<sup>−1</sup>), the fatty acyl group (−10.9 ± 0.5 kcal mol<sup>−1</sup>), and Leu<sup>7</sup> (−10.4 ± 0.2 kcal mol<sup>−1</sup>) (Fig. 1E). These results reveal

that the unique conformational folding is critical for the interaction of polymyxins with the bacterial OM with both polar and hydrophobic interactions involved.

## 2.2. Alanine-substitutions differentially impacted polymyxin folding and penetration in the OM

Following the alanine-substitutions at different PMB<sub>3</sub> positions, the conformational transitions in the OM were impacted differentially (Fig. 2 and S14–S22, ESI<sup>†</sup>). [Ala<sup>10</sup>]-PMB<sub>3</sub>, [Ala<sup>8</sup>]-PMB<sub>3</sub> and [Ala<sup>1</sup>]-PMB<sub>3</sub> retained a similar conformational transition to that of PMB<sub>3</sub> (Fig. 1B). In contrast, [Ala<sup>2</sup>]-PMB<sub>3</sub>, [Ala<sup>3</sup>]-PMB<sub>3</sub>, [Ala<sup>6</sup>]-PMB<sub>3</sub> and [Ala<sup>7</sup>]-PMB<sub>3</sub> adopted extended conformations throughout penetration. Thr<sup>2</sup> and Dab<sup>3</sup> sit on the turn of the folded conformation of PMB<sub>3</sub> and interacted with lipid A headgroups, whereas D-Phe<sup>6</sup> and Leu<sup>7</sup> were deeply inserted into the OM making hydrophobic interactions with the lipid A tails (Fig. 1D). The failure of the conformational folding with these analogs indicates that Thr<sup>2</sup> and Dab<sup>3</sup> might serve as pivot points for rotation of the polymyxin fatty acyl chain and cyclic ring, while D-Phe<sup>6</sup> and Leu<sup>7</sup> drive conformational changes necessary for OM binding.<sup>20</sup> Interestingly, [Ala<sup>5</sup>]-PMB<sub>3</sub> and [Ala<sup>9</sup>]-PMB<sub>3</sub> adopted folded conformations in both the OM headgroup and hydrophobic center, demonstrating a dramatic loss of

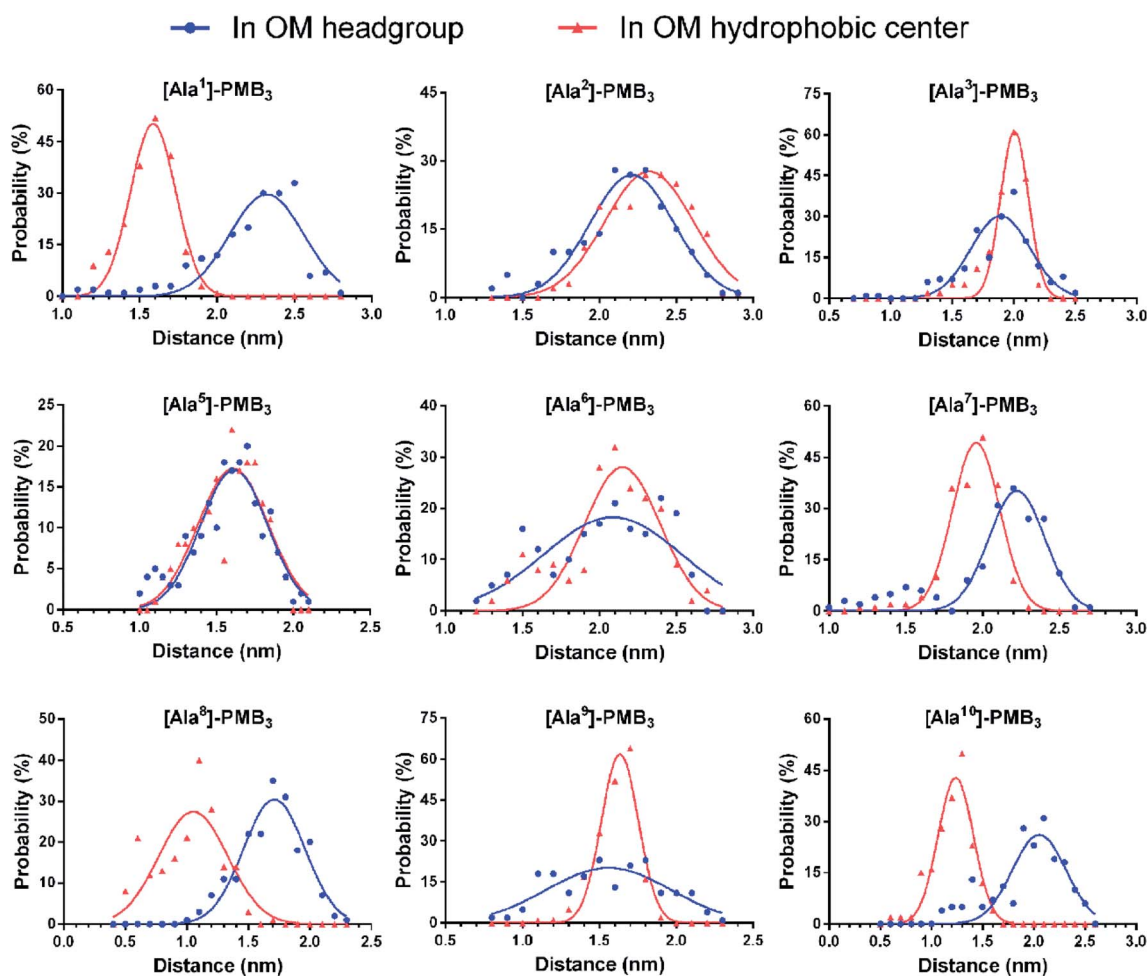


Fig. 2 Conformational distribution of alanine-substituted polymyxin B<sub>3</sub> analogs upon interacting with the *A. baumannii* OM.



conformational flexibility. Dab<sup>5</sup> and Dab<sup>9</sup> were located in the middle of the folded PMB<sub>3</sub> (Fig. 1D) and their positively-charged side chains inevitably generated repulsion with the adjacent hydrophobic fatty acyl chain, D-Phe<sup>6</sup> and Leu<sup>7</sup>. Such hinderance was removed following alanine-substitutions at positions 5 and 9, favouring the folded conformation in the absence of LPS. While previous NMR experiments examined the structural dynamics of polymyxin B in aqueous trifluoroethanol,<sup>21</sup> our novel atomic-scale, OM-level findings revealed the diverse roles of the side chains of residues within the polymyxin cyclic ring in regulating the conformational folding in the bacterial OM, albeit via different mechanisms.

To quantitatively compare OM interactions of these analogs, the free energy of OM penetration was measured through umbrella sampling<sup>22–24</sup> (Fig. 3, S23 and S24, ESI†). Compared to PMB<sub>3</sub>, alanine-substitutions of Dab<sup>1</sup>, Thr<sup>2</sup>, Dab<sup>5</sup>, D-Phe<sup>6</sup> and Dab<sup>9</sup> significantly increased free energy (19.2–31.2 kcal mol<sup>-1</sup>), whereas alanine-substitutions of Dab<sup>3</sup> and Leu<sup>7</sup> caused moderate increases (12.3–13.6 kcal mol<sup>-1</sup>); free energy was only slightly increased (3.1 kcal mol<sup>-1</sup>) by Dab<sup>8</sup> substitution, but decreased (–6.2 kcal mol<sup>-1</sup>) with Thr<sup>10</sup> substitution. Given only one polymyxin molecule was included in the calculations due to technical settings of steered MD,<sup>25,26</sup> potential cooperation of multiple polymyxin molecules was not considered. Overall,

alanine-substitutions at most positions attenuated the penetration of polymyxins into the OM; furthermore, the residues critical to OM penetration were identified, namely Dab<sup>1</sup>, Thr<sup>2</sup>, Dab<sup>5</sup>, D-Phe<sup>6</sup> and Dab<sup>9</sup>.

### 2.3. Alanine-substitutions differentially impacted OM disorganization by polymyxins

Polymyxins caused membrane deformation near the penetration site and increased water permeability therein (Fig. S25, ESI†). Flow cytometry using bis-(1,3-dibutylbarbituric acid) trimethineoxonol (DiBAC<sub>4</sub>(3))<sup>27,28</sup> was employed to quantitatively measure the OM disorganization by different analogs. Compared to vehicle-treated controls, DiBAC<sub>4</sub>(3) cellular fluorescence intensity increased ~36.8-fold after PMB<sub>3</sub> treatment (Fig. 4A), indicating substantially impaired OM integrity. In contrast, fluorescence was not much increased by [Ala<sup>1</sup>]-PMB<sub>3</sub>, [Ala<sup>2</sup>]-PMB<sub>3</sub>, [Ala<sup>5</sup>]-PMB<sub>3</sub>, [Ala<sup>6</sup>]-PMB<sub>3</sub>, [Ala<sup>8</sup>]-PMB<sub>3</sub> and [Ala<sup>9</sup>]-PMB<sub>3</sub>, indicating these alanine-substitutions dramatically attenuated OM disorganization. [Ala<sup>7</sup>]-PMB<sub>3</sub> decreased fluorescence by ~30% compared to PMB<sub>3</sub>, indicating moderately weakened OM disorganization. [Ala<sup>3</sup>]-PMB<sub>3</sub> and [Thr<sup>10</sup>]-PMB<sub>3</sub> showed comparable fluorescence to PMB<sub>3</sub>, revealing these alanine-substitutions minimally impacted OM disorganization by PMB<sub>3</sub>. Interestingly, the *in silico* free energies for OM penetration correlated well with the *in vitro*

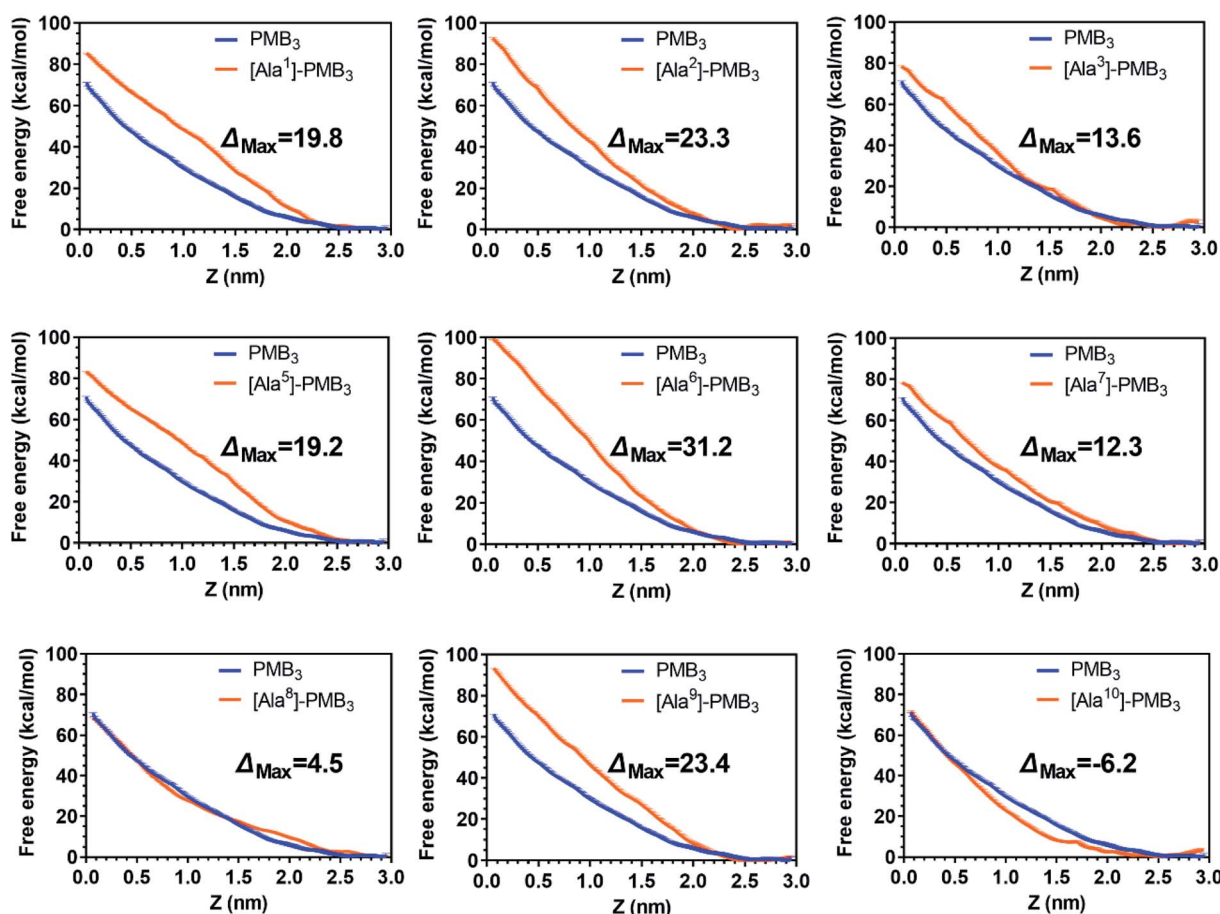


Fig. 3 Free energy profiles of polymyxin B<sub>3</sub> and analogs upon penetration into the *A. baumannii* OM. Z = 0 and 2.5 nm indicate the OM hydrophobic center and headgroup region, respectively. Error bars are determined using bootstrapping.



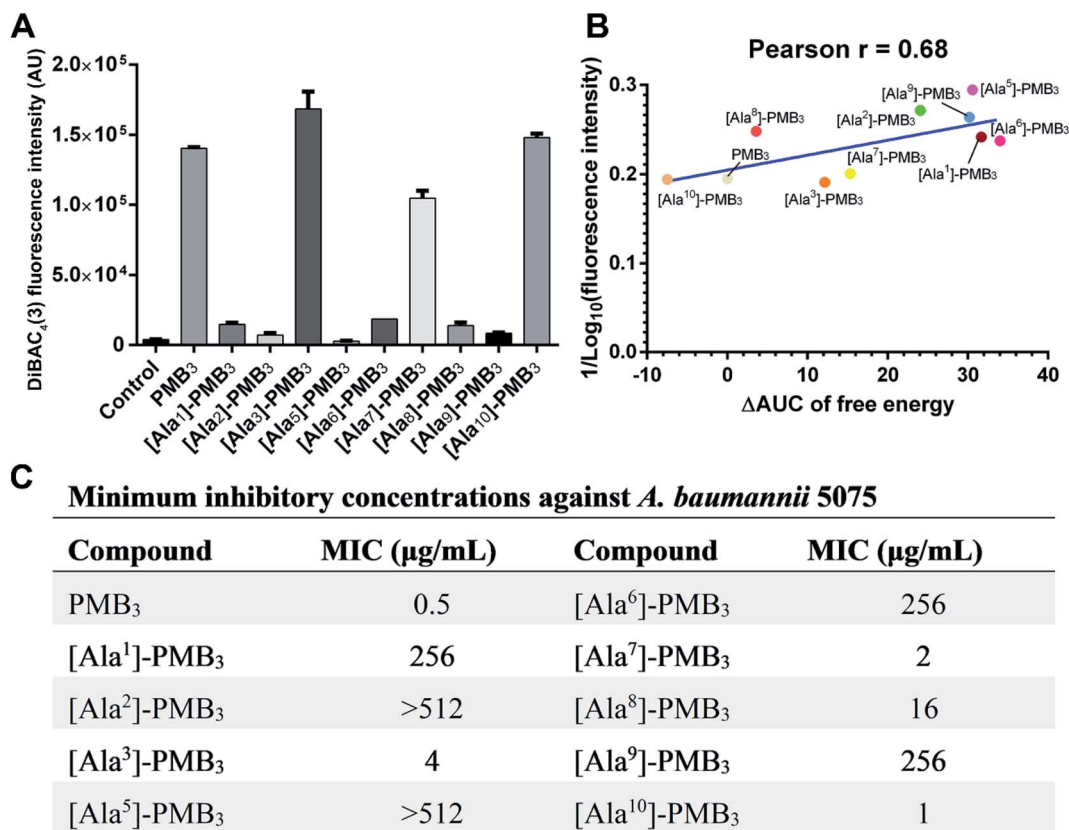


Fig. 4 *In vitro* characterization of polymyxin B<sub>3</sub> (PMB<sub>3</sub>) and analogs. (A) Fluorescence intensity in *A. baumannii* 5075 following 1 h polymyxin treatment ( $n = 3$ ). (B) Correlation between free energy and fluorescence intensity.  $\Delta$ AUC is the difference in free energy between polymyxin B<sub>3</sub> and the analog. (C) Minimum inhibitory concentrations (MICs) of polymyxin B<sub>3</sub> and analogs.

measurements of OM disorganization (indicated by fluorescence intensity [Pearson coefficient = 0.68]) (Fig. 4B). These findings reveal that polymyxin OM disruption is mechanistically related to their OM penetration abilities.

#### 2.4. Effect of alanine-substitutions on the antimicrobial activity of polymyxins

The minimum inhibitory concentrations (MICs) of all analogs were measured against MDR *A. baumannii* 5075 (Fig. 4C) and four additional *A. baumannii* strains (Table S1<sup>†</sup>). Alanine-substitutions at Dab<sup>1</sup>, Thr<sup>2</sup>, Dab<sup>3</sup>, D-Phe<sup>6</sup> and Dab<sup>9</sup> led to loss of antibacterial activity compared to unsubstituted PMB<sub>3</sub> (MICs  $\geq 256$   $\mu\text{g mL}^{-1}$ ) which perfectly matched our OM penetration free energy results (Fig. 3). As Dab<sup>1</sup> and Dab<sup>9</sup> in unsubstituted PMB<sub>3</sub> formed intensive electrostatic interactions with lipid A phosphate groups (Fig. 1E), their alanine-substitutions attenuated OM binding and substantially decreased OM disorganization and antibacterial activity (Fig. 4A). Alanine-substitutions of Thr<sup>2</sup> and D-Phe<sup>6</sup> inhibited the conformational transition and OM penetration (Fig. 2 and 3), which explains their decreased activity. The significantly decreased activity and OM disorganization observed for [Ala<sup>5</sup>]-PMB<sub>3</sub> (Fig. 4A and C) supports the hypothesis that loss of conformational flexibility is a major disadvantage for polymyxin antimicrobial activity.<sup>21</sup> Alanine-substitution of Dab<sup>8</sup> increased the MIC to 16  $\mu\text{g}$

$\text{mL}^{-1}$ , whereas alanine-substitutions of Dab<sup>3</sup> and Leu<sup>7</sup> only slightly increased MICs (to 4 and 2  $\mu\text{g mL}^{-1}$ , respectively) despite the negative effect on their conformational transition. Alanine-substitution of Thr<sup>10</sup> minimally increased the MIC (from 0.5 to 1  $\mu\text{g mL}^{-1}$ ), consistent with its minor impact on conformational transition and OM penetration (Fig. 2 and 3).

For an out-of-sample validation, we performed simulations with a novel polymyxin analog (FADDI-287) to examine the thermodynamics of penetration into the OM (Fig. 5A).<sup>29</sup> FADDI-287 folded similarly to PMB<sub>3</sub> during OM penetration and displayed a lower free energy barrier ( $-7.2$   $\text{kcal mol}^{-1}$ ) (Fig. 5B and C), which perfectly matched its superior activity (MICs = 0.125–0.5  $\mu\text{g mL}^{-1}$ ) against *A. baumannii* compared to polymyxin B.<sup>29</sup> These consistent computational and experimental results support the use of our novel all-atom MD system for predicting polymyxin antibacterial activity through examining their interactions with bacterial OMs.

#### 2.5. A novel SAR model of polymyxins based on computational and experimental results

Finally, we developed a new SAR model for the interaction of polymyxins with the OM of *A. baumannii* (Fig. 6) that is representative of Gram-negative pathogens. Our OM-based SAR model represents significant improvements on previous SAR models utilizing a single LPS molecule.<sup>6,8,10,11</sup> Our OM-based



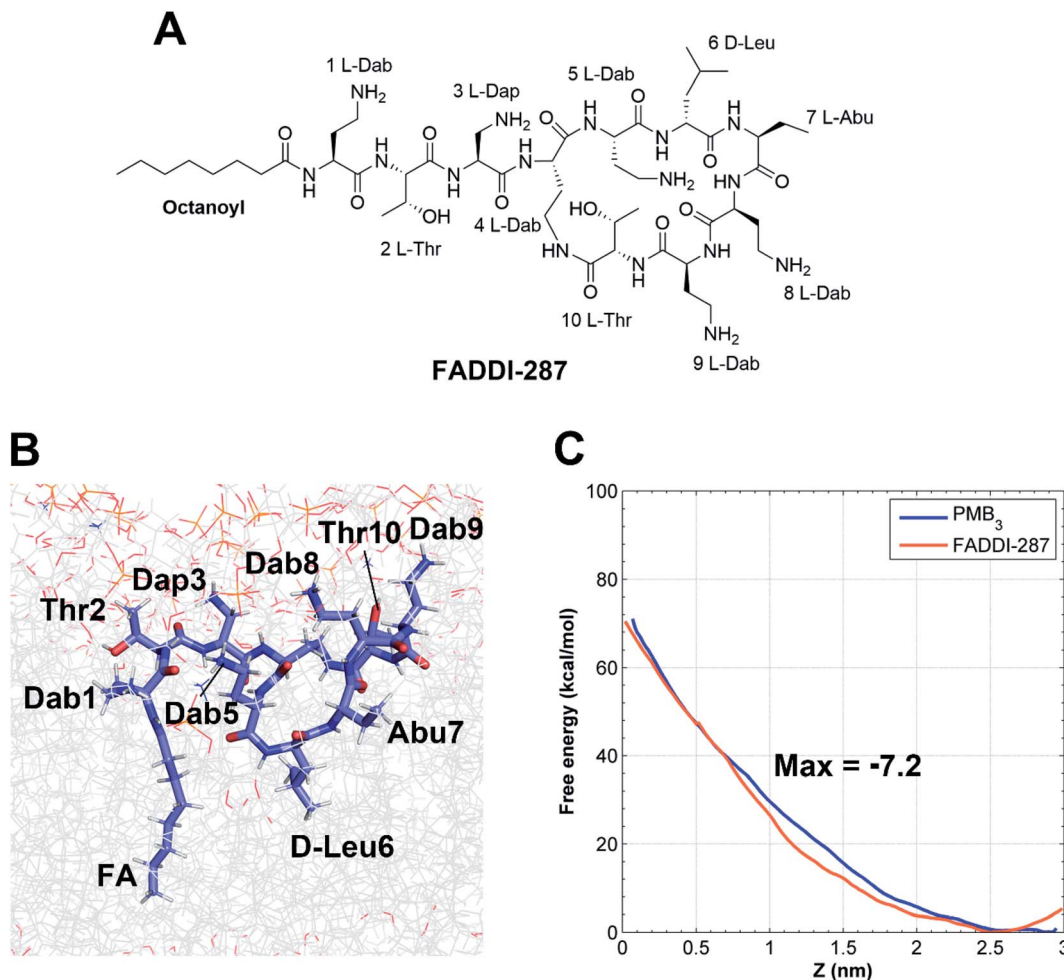


Fig. 5 Penetration of FADDI-287 into the *A. baumannii* OM. (A) Chemical structure of FADDI-287. (B) The folded conformation of FADDI-287 in the hydrophobic center of the OM. (C) Free energy profiles of the penetration of PMB<sub>3</sub> and FADDI-287 through the outer leaflet of the OM.

SAR model revealed for the first time the specific role of each residue in facilitating polymyxin folding and interactions with LPS and the various bacterial phospholipids in the OM. This is a significant advancement from our previous SAR model,<sup>6</sup> which only focused on the interaction of one polymyxin molecule with a single LPS. The importance of the hydrophobic groups at the N-terminus and positions 6 and 7 of the polymyxin ring was highlighted by their interaction with the lipid A hydrocarbon tails. Alanine-substitutions of Thr<sup>2</sup> and Dab<sup>3</sup> significantly perturbed conformational folding because both residues modulate rotation of the polymyxin fatty acyl chain and cyclic ring. Alanine-substitution at Dab<sup>3</sup> decreased activity 8-fold (Fig. 4C). Given the residue at position 3 is variable in natural polymyxins (*e.g.* D-Ser in polymyxin D), it seems that the positively-charged residue at position 3 is not essential for antibacterial activity against *A. baumannii*. In contrast, the positive charges from Dab<sup>1</sup>, Dab<sup>5</sup> and Dab<sup>9</sup> are necessary due to their key roles in regulating the structural flexibility of polymyxins. Alanine-substitution of Dab<sup>8</sup> minimally impacted the conformational transition and OM penetration but dramatically attenuated OM disorganization and activity, likely due to Dab<sup>8</sup> forming stronger hydrophobic interactions with the OM *via* side

chain carbon atoms than electrostatic interactions (Fig. 1E). This discrepancy suggests that mechanism(s) other than OM penetration contribute to OM disorganization and polymyxin antimicrobial activity.<sup>30</sup>

Our multiscale results provide an integrative picture of how polymyxins act on the Gram-negative OM. In solution, Dab<sup>5</sup> and Dab<sup>9</sup> enable polymyxins to maintain extended conformations, maximizing the OM binding surface. Subsequently, the hydrophobic segments (*i.e.*, fatty acyl chain, D-Phe<sup>6</sup> and Leu<sup>7</sup>) reorientate towards the OM hydrophobic center with Thr<sup>2</sup> and Dab<sup>3</sup> acting as pivot points, forming a unique folded conformation. Importantly, this folded conformation divides the polymyxin molecule into hydrophilic and hydrophobic domains, enabling optimal interactions with the headgroup and hydrocarbon tails of lipid A, respectively. These interactions disorganize the OM and increase its permeability, which may lead to the leakage of intracellular contents and eventually bacterial death.<sup>9</sup>

### 3. Conclusion

Collectively, we systematically investigated the interactions of alanine-substituted polymyxin analogs with the OM of *A.*



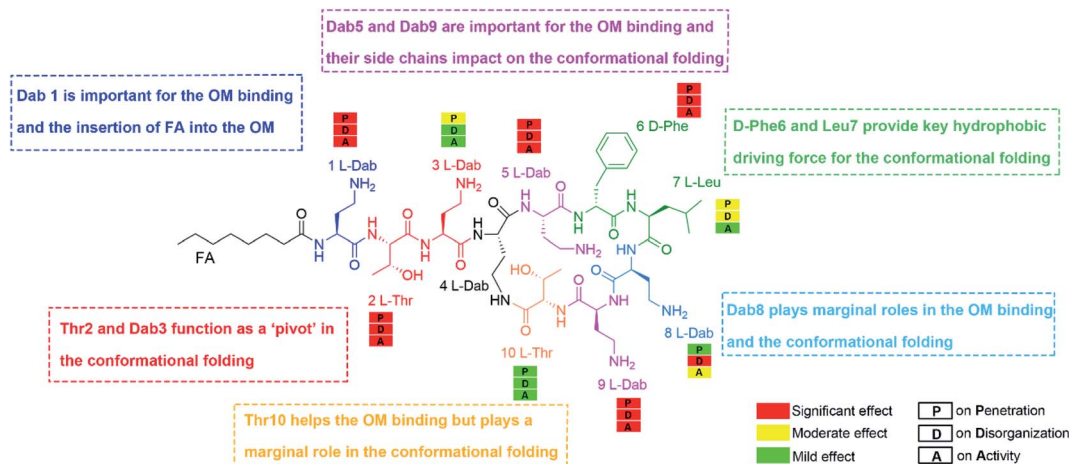


Fig. 6 An outer membrane based structure–activity relationship model of polymyxins.

*baumannii* at the atomic level, and a novel OM-based SAR model was developed for polymyxins. For the first time, the role of each amino acid residue in polymyxin antimicrobial activity was elucidated. Importantly, the well-matched *in silico* and experimental results demonstrated the capability of our OM-based SAR model for predicting the activity of novel polymyxin analogs. Our integrated computational and chemical biology approaches will significantly accelerate the discovery of new-generation polymyxins against Gram-negative ‘superbugs’.

## 4. Materials and methods

### 4.1. Molecular dynamics simulations

Chem3D and SwissParam server were employed to construct the structural models and topology parameters of all polymyxin analogs, respectively.<sup>31</sup> An asymmetric OM model was constructed using the CHARMM-GUI membrane builder.<sup>32</sup> The size of the OM model was approximately  $7.6 \times 7.6 \text{ nm}^2$  ( $x$ - $y$  plane). Importantly, previous quantitative lipidomics results attained from *A. baumannii* 5075 were employed to determine the exact lipid composition of the bacterial OM used in the simulations.<sup>17</sup> Initially, the polymyxin molecules were placed above the outer leaflet of the OM by replacing the overlapping water molecules (Fig. S1, ESI†).<sup>33</sup>

To track the penetration of polymyxins into the *A. baumannii* OM, steered simulations with three independent replicates were performed for each polymyxin analog.<sup>34–36</sup> An adaptive force was applied on the centres of mass (COMs) of both the polymyxin molecules and the OM along the  $Z$ -axis. The force constant of the harmonic potential was initially set to  $500 \text{ kJ mol}^{-1} \text{ nm}^{-2}$  and changed adaptively according to the interaction between the polymyxin molecule and the OM. The pulling force profiles from different steered simulations of PMB<sub>3</sub> showed a similar changing trend (Fig. S26†); therefore, we selected the first steered simulation to initiate the umbrella sampling simulations.

Umbrella sampling simulations were performed to characterize the energetics during penetration of polymyxins into the

OM.<sup>34–36</sup> The system configurations from the steered simulation trajectory were used to build the umbrella sampling windows where the polymyxin molecule was harmonically restrained at various fixed positions at the  $Z$ -axis with an interval of 0.2 nm, resulting in approximately 18 simulation windows in each polymyxin simulation system; additionally, several extra windows were supplemented at the positions where sampling was poor (Fig. S23†). Each window was simulated for 50 ns; hence, a total of approximately 1100 ns all-atom simulations were performed to obtain a single free energy profile that quantitatively describes the penetration of the polymyxin from bulk water to the hydrophobic centre of the OM. The WHAM integration method was used to calculate the free energy profile.<sup>37</sup> For the umbrella sampling simulations with PMB<sub>3</sub>, we performed 200 ns simulations for each window. In these simulations, the free energy profiles calculated from different parts of the simulation trajectories of analogs showed almost identical free energy profiles (Fig. S28†). The statistical errors of the free energy profiles were estimated using the bootstrap analysis method as previously described.<sup>37</sup> In the reaction coordinates,  $Z > 0$  indicated the bulk water shell and the outer leaflet of the OM;  $Z = 0$  corresponded to the hydrophobic centre of the OM.

All MD simulations were performed using GROMACS 5.1.2 with the CHARMM36 all-atom force field.<sup>33,38</sup> Energy minimization was performed using the steepest descent method with the maximum force tolerance of  $1000 \text{ kJ mol}^{-1} \text{ nm}^{-1}$ . To fully equilibrate the simulation system, six equilibration cycles were carried out by gradually turning off the position restraints on the lipids. Subsequently, 400 ns nonrestraint simulations were performed to further equilibrate the OM. The area per lipid  $A$  molecule fluctuated around  $1.76 \pm 0.02 \text{ nm}^2$  (Fig. S29†), which is consistent with the literature.<sup>13</sup> Periodic boundary conditions were considered. All production simulations were conducted at constant temperature and pressure (NPT ensemble). The temperature and pressure were maintained at 313 K using the Nose–Hoover algorithm and 1 bar using the semi-isotropic pressure coupling method with Parrinello–Rhaman barostat,



respectively.<sup>39–41</sup> The electrostatic and Van der Waals interactions were calculated using the Particle Mesh Ewald method and Lennard–Jones potential algorithm, respectively.<sup>42</sup> The time step was 2 femtoseconds and the trajectory was recorded every 10 picoseconds in production simulations.

#### 4.2. Materials for peptide synthesis

The general synthetic methodology used for the synthesis of the peptides has been previously described in detail elsewhere by our group.<sup>43</sup> The materials and synthesis protocol used are also presented below.

Piperidine, diisopropylethylamine (DIPEA) and trifluoroacetic acid (TFA) were purchased from Auspep (Melbourne, Australia). Fmoc-Dab(Boc)-OH, was purchased from Try-lead Chem (Hangzhou, China). Fmoc-D-Phe-OH, Fmoc-Dab(ivDde)-OH, 1,1,1,3,3,3-hexafluoro-2-propanol (HFIP) and 1*H*-benzotriazolium-1-[bis(dimethylamino)methylene]-5-chloro hexafluoro phosphate-(1-),3-oxide (HCTU) were purchased from Chem-Impex International (Wood Dale, IL, USA). Fmoc-Ala-OH, Fmoc-Leu-OH and Fmoc-Thr(*t*Bu)-OH were purchased from Mimotopes (Melbourne, Australia). Dimethylformamide (DMF), methanol (MeOH), diethyl ether, dichloromethane (DCM), hydrochloric acid (HCl) and acetonitrile were purchased from Merck (Melbourne, Australia). Fmoc-Thr(*t*Bu)-TCP-Resin was purchased from Intavis Bioanalytical Instruments (Germany). Triisopropylsilane (TIPS), 1,2-ethanedithiol (EDT), diphenylphosphorylazide (DPPA) and hydrazine were obtained from Sigma-Aldrich (Castle Hill, Australia).

#### 4.3. Protocol of peptide synthesis

Synthesis of the protected linear peptide was conducted on a Protein Technologies Prelude automated peptide synthesizer using standard Fmoc solid-phase peptide chemistry. Synthesis was carried out using TCP-Resin pre-loaded with Fmoc-Thr(*t*Bu)-OH (0.1 mmol scale). Coupling of all Fmoc-amino acids was performed using the same standard protocol 3 molar equivalents (relative to resin loading) of the Fmoc amino acid and the coupling reagent HCTU in DMF, with activation *in situ* using 6 molar equivalents of DIPEA. The reaction was left to proceed for 50 min at room temperature which was followed by washing of the resin with DMF. Fmoc deprotection was conducted using the protocol 20% piperidine in DMF (1 × 5 min, 1 × 10 min), followed by washing of the resin with DMF at room temperature. Removal of the ivDde protecting group was achieved with 3% hydrazine in DMF (4 × 15 min), followed by washing of the resin with DMF. The protected linear peptide was then cleaved from the resin by treating the resin with 10% hexafluoroisopropanol (HFIP) in DCM (1 × 30 min, 1 × 5 min). This solution was concentrated *in vacuo* to give the crude protected linear peptide. The protected linear peptide was dissolved in DMF (5 mL) to which DIPEA 0.6 mmol, 104 μL and DPPA, 0.3 mmol, 0.65 μL were added, and the resulting solution stirred for 6 h at room temperature. The cyclisation solution was concentrated under vacuum overnight and the resulting residue taken up in a solution of 2.5% EDT and 5% TIPS in TFA and stirred for 2 h at room temperature. To this solution, 40 mL of

diethyl ether was added to precipitate the crude peptide. The resulting precipitate was collected by centrifugation, washed twice with diethyl ether (40 mL), then dried to give the crude cyclic peptide product as a white solid. The crude peptide was dissolved in Milli-Q water (5 mL), de-salted using a Vari-Pure IPE SAX column, then purified by RP-HPLC on a Waters Prep LC system with a Waters 486 tuneable absorbance detector (214 nm) and a Phenomenex Axia Luna C8(2), 250 × 21.2 mm i.d., 100 Å, 10 μm column. Peptides were eluted from the column with a gradient of 0–60% buffer B over 60 min at a flow rate of 15 mL min<sup>-1</sup>; buffer A was 0.1% TFA/water, and buffer B was 0.1% TFA/acetonitrile.

#### 4.4. LC-MS analysis of peptides

The purity of the fractions collected was determined by LC-MS analysis on a Shimadzu 2020 LC-MS system incorporating a photodiode array detector (214 nm) coupled to an electrospray ionization source and a single quadrupole mass analyser. A Phenomenex column (Luna C8(2), 100 × 2.0 mm ID) was used, eluting with a gradient of 0–60% solvent B over 10 min at a flow rate of 0.2 mL min<sup>-1</sup>. Solvent A was 0.05% TFA in water and Solvent B 0.05% TFA in acetonitrile. Mass spectra were acquired in the positive ion mode with a scan range of 200–2000 *m/z*. Fractions with the desired purity were combined and lyophilised for two days to give the peptide product as its corresponding TFA salt. The yields obtained for each peptide and their corresponding analytical data are shown in ESI Appendix and Fig. S3–S12.†

#### 4.5. Flow cytometric analysis of the OM integrity

The cell membrane potential in depolarised cells was examined using an oxonol dye: bis-(1,3-dibutylbarbituric acid) trimethine oxonol (DiBAC<sub>4</sub>(3)).<sup>44–46</sup> For flow cytometric analysis, bacterial samples (600 μL of bacterial suspension after appropriate dilution to keep the event per s <1000) were stained with the aforementioned stain. The final concentrations of DiBAC<sub>4</sub>(3) in the bacterial suspension was 1.67 μg mL<sup>-1</sup> and stained samples were placed on ice in the dark for 1–2 min after a brief vortex before flow cytometric analysis.

Flow cytometric analysis was performed using an ACEA NovoCyte® high-performance benchtop flow cytometer (ACEA Biosciences, San Diego, CA, USA).<sup>47</sup> The forward scatter (FSC), side scatter (SSC), violet (VL2) and blue (BL1 and BL4) fluorescence of each cell were measured. DiBAC<sub>4</sub>(3) fluorescence emission ( $E_x/E_m$ , 488/660–690 nm) was detected in the BL4 channel.<sup>45,48</sup> All registered signals were logarithmically amplified. A gate was created in the dot plot of FSC vs. SSC and pre-set to distinguish bacterial cells from medium components. A linear plot was made of the FSC-H vs. FSC-A to avoid all the events from doublets. First unstained samples were examined through the flow cytometer to identify the cells labelled with dye combinations following staining.<sup>47</sup> Data acquisition was set to 20 000 events at a low flow rate of <1000 events per s and collected data were analyzed (NovoExpress® software V2.1, ACEA Biosciences, San Diego, CA, USA). The mean fluorescence





response from each treatment was determined and presented as mean  $\pm$  standard deviation (SD).

#### 4.6. Determination of MICs

MICs of polymyxin B<sub>3</sub> and its analogs were determined against five *A. baumannii* strains: *A. baumannii* 5075, *A. baumannii* ATCC 17978, *A. baumannii* ATCC 19606, *A. baumannii* 246-01-C.246, and *A. baumannii* 248-01-C.248 using the Clinical and Laboratory Standards Institute (CLSI) recommended microbroth dilution method. Two-fold dilutions of each antimicrobial agent ranging from 0–512  $\mu\text{g mL}^{-1}$  were prepared in cation-adjusted Mueller-Hinton Broth (CAMHB; Oxoid, Hampshire, UK). Bacterial suspensions were prepared by suspending colonies grown on nutrient agar (School of Biomedical Sciences Media Prep Services, Clayton, Australia) in 0.9% NaCl to match a 0.5 McFarland standard (Densichek, BioMerieux). Bacterial suspensions were further diluted in CAMHB to yield  $\sim 10^6$  CFU  $\text{mL}^{-1}$ , with 100  $\mu\text{L}$  of this diluted suspension then added to 100  $\mu\text{L}$  of antimicrobial solution in 96-well micro-titre plates (Techno Plas, St Marys, Australia). Quality control was assessed using *Pseudomonas aeruginosa* ATCC 27853. Plates were incubated at 37 °C and visually examined after 20 h incubation to determine the MICs.

#### Data availability

Additional information can be found in the ESI.†

#### Author contributions

J. L. conceived and supervised the project. X. J. conducted molecular dynamics simulations and wrote the manuscript. N. A. P. and K. D. R. synthesized the polymyxin analogs. M. A. K. A. and H. W. conducted FACS experiments. H. Y. conducted *in vivo* experiments. J. Z., X. Z., and M. L. analyzed simulation data. B. G., L. W., W. M., K. Y., B. Y., F. S., and L. W. contributed to molecular dynamics simulations. P. E. T. and T. V. contributed to data analysis. All authors contributed to manuscript revision.

#### Conflicts of interest

J. L., T. V., K. D. R., P. E. T. are listed as inventors on the patent WO2015149131 'Polymyxin Derivatives as Antimicrobial Compounds' which covers FADDI-287 and has been licenced to Qpex Biopharma.

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