

## Article

# Computational insights into the subtype selectivity and “message-address-efficacy” mechanisms of opioid receptors through JD<sub>Tic</sub> binding and unbinding

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### Abstract

In drug design and discovery, binding affinity and selectivity are two basic properties of a drug candidate. Opioid receptors (ORs) are the main targets of strong analgesics. Like some other class A members of G-protein-coupled receptors (GPCRs), ORs exhibit complex selectivity on their ligands. The diversity of binding activity and selectivity among opioids has deeply attracted researchers for a long time. To investigate the subtype selectivity of  $\mu$ ,  $\delta$  and  $\kappa$  ORs in detail, using the  $\kappa$ -selective antagonist JD<sub>Tic</sub> as a probe, we performed a series of computational simulations, including molecular dynamics and metadynamics, on JD<sub>Tic</sub>- $\mu/\delta/\kappa$ -OR complexes. From the simulations, we found that the decisive factor of JD<sub>Tic</sub> selectivity on the  $\mu$ -subtype was the 2.63 position, which affected the efficacy of JD<sub>Tic</sub> through changing the dynamics of the Q<sup>2.60</sup> residue. In addition to the 2.63-position residue, the 7.35 position was the other crucial aspect of JD<sub>Tic</sub> selectivity for the  $\delta$ -subtype. Based on the results, we suggest a new concept, the “message-address-efficacy” hypothesis, to explain the relationships among the affinity, selectivity and function between ORs and opioids. Thus, all the detailed dynamics of JD<sub>Tic</sub>-bound ORs might be helpful to deeply understand the subtype selectivity and binding mechanisms of other GPCRs.

**Keywords:** G-protein-coupled receptors; opioid receptors; subtype selectivity; molecular dynamics; “message-address-efficacy” hypothesis; JD<sub>Tic</sub>

Acta Pharmacologica Sinica (2018) 39: 482–491; doi: 10.1038/aps.2017.132; published online 19 Oct 2017

### Introduction

G protein-coupled receptors (GPCRs) are the largest superfamily of drug targets<sup>[1]</sup>. For their ligands, the selectivity may be divided into two types, subtype<sup>[2]</sup> and functional selectivities<sup>[3]</sup>. The two types of selectivity are very common in GPCR ligands. For instance, 5-serotonin receptors, dopamine receptors and adrenergic receptors contain multiple subtypes, and most ligands on each subtype show different affinity or activity. In signal transduction, different ligands exhibit various subtype selectivity on G-protein-biased pathway or  $\beta$ -arrestin pathway, and even the same ligand shows different functional selectivity in different species or in different organs of the same species<sup>[4]</sup>. In general, an antagonist only displays subtype selectivity, while an agonist exhibits both subtype and functional selectivities.

Members of class A subfamily of GPCRs<sup>[5]</sup> share a similar ligand binding pocket, which is located in the upper half of the receptor helix area near the extracellular loops<sup>[6]</sup>. Comparing these crystal structures, it is easy to find that the ligand binding sites of different receptors vary, leading to binding affinity and selectivity issues. As two basic elements of drug discovery, both affinity and selectivity should be considered for a druggable candidate, further indicating that a more reasonable mode of action is necessary for new ligands<sup>[7]</sup>.

The opioid receptors (ORs), members of the class A subfamily of GPCRs<sup>[6]</sup>, are the targets of analgesics. Researchers began to pay attention to the affinity and selectivity of opiate problems in 1970s and put forward the “message-address” hypothesis<sup>[8–10]</sup> to explain the interaction mechanism of opioids. In the hypothesis, the “message” and “address” are two sub-sites for the receptor to recognize peptide ligand. The message component is involved in receptor recognition and related signal transduction, while the address could provide additional binding affinity and receptor subtype selectivity. The endog-

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Received 2017-05-03 Accepted 2017-06-21

enous opioid peptides are hence recognized according to the message-address concept, in which a constant tetrapeptide sequence (Tyr-Gly-Gly-Phe) is contained<sup>[11]</sup>. The residue Tyr constitutes the message component, and the sequence starting with Phe comprises the address, whereas Gly-Gly functions as a spacer. This hypothesis is identical with the well-known structure-activity relationships of nonpeptide opioid ligands that comprise one aromatic ring to presumably mimic the Tyr residue. The "message-address" hypothesis has been used to design many OR ligands, such as the first non-peptide  $\delta$ -OR antagonist Naltrindole (NTI)<sup>[12]</sup> and its corresponding derivatives<sup>[11, 13]</sup>.

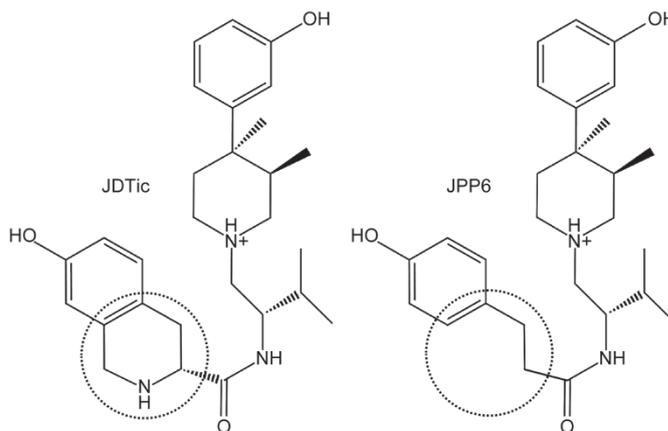
According to the critical groups of opioids, the functions of some crucial residues<sup>[14-16]</sup> were inferred, that were also validated by site-directed mutagenesis experiments<sup>[17]</sup>. Residues D<sup>3.32</sup> (Ballesteros/Weinstein numbering<sup>[18]</sup>) and H<sup>6.52</sup>, as well as their surrounding areas, are basic residues of opioid recognition, and play "message" roles, while "address" residues are responsible for subtype selectivity on the upper part of the binding pocket and second extracellular loop (ECL2) area.

However, the selectivity mechanism of address residues is intriguing, such as that for NTI<sup>[19, 20]</sup>. Observed from the crystal structure, the crux of ligand efficacy is W<sup>6.58</sup> at the upper part of the binding pocket. However, the molecular superposition<sup>[19]</sup> and mutation results<sup>[21]</sup> showed that the 7.35-position is the critical factor for NTI subtype selectivity. Moreover, the "message-address" hypothesis was not suitable for all opioids<sup>[20, 22]</sup>. For instance, the  $\kappa$ -subtype selective ligand Salvinorin A is a special type of ligand, and its mode of action is different from that of morphinan compounds.

Residue mutation experiments identified the selective site of ligands 5'-GNTI and 6'-GNTI at the 6.58 position<sup>[23-25]</sup> and NTI at the 7.35 position<sup>[21, 25]</sup>; the chimera method<sup>[26]</sup> demonstrated that the ECL2 region is the crucial aspect for the subtype selectivity of ligand U50488. These experimental methods are efficient in the study of ligand selectivity, but consume many reagents and raw materials, while the simulated mutation study could save these resources.

Among the selective ligands of ORs, JDITic<sup>[27]</sup> and its analogs<sup>[28, 29]</sup> are a class of highly selective  $\kappa$ -OR antagonists (Figure 1). It was difficult to explain their mechanisms of high selectivity in the absence of OR crystal structures<sup>[30]</sup>. After the crystal structures were determined, Wu *et al*<sup>[20]</sup> and Granier *et al*<sup>[19]</sup> tried explaining related selectivity mechanisms of opioid ligands through molecular superposition and homology modeling methods. They focused on the key roles of the 7.35- and 2.63-position residues on the selectivity of JDITic. However, this was still static cognition and limits our understanding of the selectivity mechanism.

There are many ligands that exhibit high selectivity for each subtype of ORs. Elucidation of the related selective mechanism would deepen our understanding of their interactions and help to design new selective ligands. Moreover, the selectivity mechanism of many reported compounds is not clear, suggesting that much work should be performed on ligand selectivity.



**Figure 1.** Two-dimensional structures of the antagonists JDITic and JPP6. The key parts were labeled with a dotted circle.

Stevens *et al* resolved the crystal structure of the human  $\kappa$ -OR in complex with its selective antagonist JDITic<sup>[20]</sup>, and the crystal structures of  $\mu/\delta$ -OR were also reported recently<sup>[19, 31, 32]</sup>. These structures provide atomic structural information on ORs<sup>[14, 15]</sup> and a new opportunity to study JDITic selectivity on ORs from the dynamics level.

Here, we selected JDITic as a probe and performed unbiased molecular dynamics (MD) and metadynamics (MT) simulations to elucidate the ligand selectivity on  $\mu/\delta/\kappa$ -OR subtypes (Table 1). Combined with the simulated mutation method, we found some key residues to subtype selectivity of JDITic. Furthermore, to interpret the relationships among the affinity, selectivity and function between opioid receptors and ligands, we proposed the "message-address-efficacy" hypothesis mainly based on the receptor interaction mechanisms. Thus, our study provided a useful method and a new idea for the subtype selectivity and binding mechanism of ORs.

## Materials and methods

### Protein preparation

The crystal structures of inactive  $\mu/\delta/\kappa$ -OR were obtained from the Protein Data Bank (PDB, entry codes: 4DKL<sup>[31]</sup>, 4N6H<sup>[32]</sup> and 4DJH<sup>[20]</sup>), which were engineered proteins with T4 lysozyme (T4L)<sup>[20]</sup> or nano antibody. To perform MD simulations on the wild-type receptor, T4L and other unnecessary parts were removed from the crystal structures, and the loop was reconstructed by adding the missing residues with the

**Table 1.** Systems prepared for the MD simulations.

System ID	Protein	POPC	Na <sup>+</sup>	Cl <sup>-</sup>	Water
A	$\mu$ -OR	104	52	66	11029
B	$\delta$ -OR	101	52	68	11008
C	$\kappa$ -OR	107	52	58	10975
D	$\mu$ -OR N2.63V	104	52	66	11030
E	$\delta$ -OR K2.63V	101	52	68	11009

loop refinement protocol in Discovery Studio 3.5, such as S262 and T302–S303–H304–S305–T306 in  $\kappa$ -OR. The generated 10 loop models were clustered as a dendrogram based on the pairwise main-chain root-mean-square deviation (RMSD) of the loop region<sup>[33]</sup>, and the one with the lowest RMSD value was chosen for loop reconstruction. The Na<sup>+</sup> ion located at the allosteric pocket position<sup>[32]</sup> was exactly positioned according to the crystal structure of NTI-complexed  $\delta$ -OR (PDB entry code: 4N6H).

The Protein Preparation Tool (ProPrep) module in the Schrödinger 2012 suite software package was then used to prepare the above integrated three-dimensional structures of  $\mu/\kappa/\delta$ -OR. Residues Asn, Gln, and His were checked for the protonated state automatically in ProPrep. The PROPKA tool in Maestro was utilized to add the hydrogen atoms into the three structures at physiological pH with an optimized hydrogen bond network.

#### Preparation of ligand JDtIc and related residues

The ligand JDtIc in the crystal structure of  $\kappa$ -OR was subjected to ProPrep together with  $\kappa$ -OR. Hydrogen atoms were added through the PROPKA tool. The protonated state of nitrogen atoms on JDtIc was determined through the Epik module. The pose of JDtIc in the final complex was extracted and employed as the starting point for subsequent simulations.

The Paramchem webserver<sup>[34–36]</sup> (<https://cgenff.paramchem.org/>), a program coupled with the CHARMM force field, was used to generate the force field parameters of JDtIc. We imported JDtIc with a correct configuration into the webserver and obtained the parameters of the compound through a script.

In  $\mu/\delta$ -OR, the same JDtIc structure was adopted as that in  $\kappa$ -OR. Due to the position collision with JDtIc, the poses of residues Q<sup>2.60</sup> and Y<sup>7.43</sup> located at the binding pocket were adjusted based on those in the crystal structure of  $\kappa$ -OR (Figure 2).

According to the residue Val at the 2.63 position in the crys-

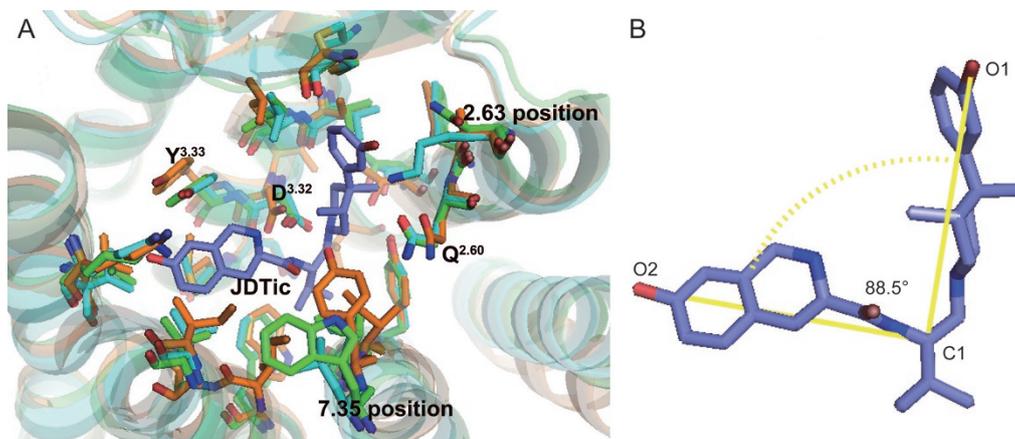
tal structure of  $\kappa$ -OR, related residues Asn and Lys at the 2.63 position in  $\mu/\delta$ -OR were mutated to Val using the Residue Mutation module in DS3.5.

#### MD preparations

Five systems, JDtIc-wild type  $\mu/\delta/\kappa$ -OR and JDtIc-mutated  $\mu/\delta$ -OR complexes, were built for the simulations. A POPC (1-palmitoyl-2-oleoyl-sn-glycero-3-phosphocholine) bilayer with the surface area of 75×75 Å<sup>2</sup> on the X-Y plane was generated under the Charmm36 force field using the VMD program (Version 1.9.1) (Table 1). For each system, our in-house program was first used to embed the receptor into the POPC bilayer pre-aligned in the OPM (Orientations of Proteins in Membranes) database<sup>[37–40]</sup>. Thereafter, pre-equilibrated POPC lipids coupled with TIP3P water molecules in a box ~ 75×75×100 Å<sup>3</sup> were used to solvate the protein (Table 1). Water molecules in the bilayer and lipid molecules within 0.85 Å of the heavy atoms on the protein structure were removed. 51 Na<sup>+</sup> and 66/68/58 Cl<sup>-</sup> ions were added into the JDtIc-bound  $\mu/\delta/\kappa$ -OR systems to neutralize the systems with 0.15 mol/L NaCl in the water phase. The protein was described using the CHARMM36 force field with cmap correction.

#### MD simulations

All the simulations were carried on the high-performance cluster of the State Key Laboratory of Bioreactor Engineering using Gromacs V.4.6.5<sup>[41]</sup> and the CHARMM36 parameters for all compositions. In the first simulation step, a 10000-step energy minimization was implemented with 1000.0 kJ/mol/nm as the force threshold for the systems. Next, a 100-ps initial equilibration was produced to gradually heat the systems from 0 K to 310 K at a constant volume and temperature at 310 K (NVT). The systems were subjected to an additional 1-ns equilibration at constant pressure and temperature (NPT ensemble; 310 K, 1 atm) with three thermostats (stabilizing temperature independently for the protein-ligand system, lipid POPCs and water-ion system) at 2-ps time steps. The cut-off value for vdW and



**Figure 2.** (A) Key interactive residues within 4 Å of JDtIc in the initial JDtIc-OR complexes among MD simulations. (B) The initial angle and measured atoms of JDtIc in the crystal structure. The backbones of residues and JDtIc were colored in green ( $\mu$ -OR), cyan ( $\delta$ -OR), orange ( $\kappa$ -OR) and slate-blue (JDtIc).

short-range electrostatic interactions was set at 12 Å. The Particle Mesh Ewald (PME) summation scheme was used to compute long-range electrostatic interactions. Finally, the production MD simulations of the five systems were performed for 100 ns under NPT conditions using the Nose-Hoover thermostat for temperature coupling and Parrinello-Rahman pressure coupler methods. The integrator leap-frog algorithm was employed, and the time step for MD simulation was 2 fs.

### Metadynamics simulations

*Theory:* In an MT simulation, an additional history-dependent biased potential  $V_G(S,t)$  was introduced into the system,

$$V_G(S,t) = \int_0^t dt' \omega \exp\left(-\sum_{i=1}^d \frac{(S_i(R) - S_i(R(t')))^2}{2\sigma_i^2}\right) \quad (1)$$

where  $S$  represents the collective variables,  $t$  represents time,  $\omega$  is the energy rate and  $\sigma_i$  controls the width of the Gaussian for the  $i$ th collective variable. With the evolution of the system, the wells in the FES (free energy surface) of the collective variables are filled up with the biased potential  $V_G$ . The underlying free energy  $-F(s)$  is assumed to be estimated from the biased potential once all the wells have been filled after a sufficiently long time,

$$\lim_{t \rightarrow \infty} V_G(S,t) \sim -F(S) \quad (2)$$

The correctness of the relationship as shown in formula 2 was proven to be empirical by extensive tests under the assumption that the stochastic dynamics in the collective variable space is memoryless in the absence of the bias. Under the assumption, the error in FES construction was proven to be:

$$\epsilon \propto \sqrt{\frac{\omega}{D(\kappa_B T)^{-1}}} \quad (3)$$

where  $D$  is the intrinsic system diffusion coefficient in the collective variable space,  $\kappa_B$  is the Boltzmann constant, and  $T$  is the temperature of the system<sup>[42]</sup>.

In fact, a "well-tempered" and "smoothly converging" algorithm was introduced by Barducci *et al* to improve the biased potential<sup>[43]</sup>. In the well-tempered MT, the deposition rate for the biased potential is decreased by rescaling the Gaussian height ( $W$ ) over the simulation time:

$$W = \omega \tau_C e^{-\frac{V_G(S,t)}{\kappa_B \Delta T}} \quad (4)$$

where  $V_G(S,t)$  is the biased potential at the current position and current time,  $\Delta T$  is a temperature-like parameter, and  $\tau_C$  is the deposit ion stride. The underlying free energy is a scaled approximation to the  $V_G(S,t)$ , with

$$F(s) = -\frac{\Delta T}{T + \Delta T} V_G(S, t \rightarrow \infty) \quad (5)$$

With respect to the standard MT, the biased potential decreases as  $1/t$  when the simulation proceeds, allowing

smooth converge to an approximation of  $F(s)$ .

*Simulation details:* We carried out approximately 40 ns of well-tempered MT simulations for the systems of JDtic-wild  $\mu/\delta/\kappa$ -OR complexes. The crystal structure of inactive JDtic-bound  $\kappa$ -OR was directly used as a system for MT simulation, while the conformation of JDtic-wild  $\mu/\delta$ -OR complexes used for MT analysis was the frame at the final 100 ns of the unbiased MD simulation. For each system, the MT simulations were carried out one time using plumed 2.02<sup>[44, 45]</sup> implemented in Gromacs 4.6.5. The RMSD evolutions of the heavy atoms in each diffusing ligand were used as the first collective variable. The second collective variables were selected based on the binding experiments and our unbiased MD simulation. The residue D<sup>3.32</sup> was proven to be indispensable for JDtic binding<sup>[20]</sup>, and then the Z-component of the vector connecting the protonated nitrogen of JDtic and two carboxyl oxygen atoms of D<sup>3.32</sup> was thus selected as the second collective variable for JDtic egress. For the MT simulations, the biasing potential was added every 250 steps, with the width and height of the Gaussian hills set to 0.05 and 0.3 kJ/mol, respectively, and  $\Delta T = 2700$ .

### Analysis of MD simulations

RMSD and RMSF (root-mean-square fluctuation) calculations, hydrogen bond and angle analyses, and distance evolutions were produced by the program Gromacs. The interval time of trajectory calculations, including RMSD, RMSF, angle, distance and principal component analysis, was 100 ps in these 100-ns simulations. RMSD values were calculated by comparison with the initial simulation conformations. All the smooth curves in Figures were fitting groups, which were identical to the corresponding Angle/RMSD calculations in color.

## Results

### Initial binding pockets of three OR subtypes with the ligand JDtic

In  $\mu/\delta/\kappa$  subtypes, the initial structure of ligand JDtic, extracted from the crystal structure of JDtic- $\kappa$ -OR complex<sup>[20]</sup>, was stabilized in a V-shaped conformation, and its stretching angle was 88.5° (Figure 2). Although the three subtypes were all in the antagonistic state, residues within 4 Å of JDtic showed some structural differences among them (Figure 2A). For instance, residues at positions 2.63 and 7.35 were different from each other. In the  $\mu/\delta/\kappa$  subtypes, residues at position 2.63 were Asn, Lys and Val, while those at position 7.35 were Trp, Leu and Tyr, respectively. The orientation of some common residues, such as D<sup>3.32</sup> and Y<sup>3.33</sup>, were similar in the  $\mu/\delta$  subtypes but different in the  $\kappa$  subtype. The differences might have resulted from the diverse ligand chemotypes because the original ligands in the crystal structures of the  $\mu/\delta$  subtypes belong to the family morphinans, which contain multiple rigid rings. With JDtic binding to the three OR subtypes, we built JDtic-wild type  $\mu/\delta/\kappa$ -OR systems to be used for the unbiased MD simulations.

### Unbiased MD simulations on the three wild-type OR systems

In our MD simulations, the three complex systems reached

equilibrium at approximately 30 ns as indicated by the protein RMSD values (Supplementary Figure S1A). Compared with the  $\delta/\kappa$  subtypes after stabilization, the  $\mu$ -OR subtype exhibited higher RMSD values, varying between 2.7 and 3.5 Å with respect to its initial structure. The  $\delta$ -OR subtype showed the lowest RMSD changes, ranging from 2.0 to 2.7 Å. All the RMSDs could generally reflect the structural diversities among these subtypes, and the protein flexibility of  $\mu$ -OR might be larger than the other two subtypes.

The ligand in the  $\kappa$ -OR system exhibited excellent stability, and ligand RMSD essentially fluctuated only by 0.4 Å, occasionally up to approximately 0.8 Å (Supplementary Figure S1B). In the  $\mu/\delta$  subtypes, the performance of the ligand was much unstable, with RMSD values even up to 2 Å. From the sampling of the final 100-ns complexes (Figure 3), we could see that the V-shaped conformation of the ligand was largely distorted in both the  $\mu$  and  $\delta$  subtypes. Comparing JDITic reverse trends and key residues within 4 Å of the ligand in these complexes, we could find that residue Q<sup>2.60</sup> in the  $\mu/\delta$  subtypes adopted different orientations from that in the  $\kappa$  subtype. Because the Q<sup>2.60</sup> residue is common among the three subtypes, we speculated that this conformational variety was more likely to be caused by residues Asn and Lys at the 2.63 positions, which were particularly close to Q<sup>2.60</sup>. To verify the abovementioned conjecture, we mutated 2.63-position residues to Val in the  $\mu/\delta$  subtypes according to the  $\kappa$  subtype, and then constructed JDITic-bound-mutated  $\mu/\delta$ -OR systems for additional MD simulations.

#### Interaction modes of JDITic with the 2.63-position-mutated $\mu/\delta$ -subtype

The average RMSD values of the receptors and ligands were lower in the mutant systems than in the corresponding wild-type ones (Figure 4A and 4B). The average RMSD value of the  $\mu$ -mutant showed a great decrease, varying from an average of approximately 3.3 Å to 2.8 Å, while the RMSD change of the  $\delta$ -mutant was not notable. Compared with the receptor change, the RMSD values of JDITic in the mutant systems decreased significantly. The average RMSD of JDITic in the  $\mu$ -mutant was reduced to 0.45 Å from 1.6 Å, while that in the  $\delta$ -subtype decreased from 1 Å to 0.5 Å, both of which were close to JDITic in the  $\kappa$ -subtype, especially that in the  $\mu$ -mutant.

The number of hydrogen bonds (HBs) between JDITic

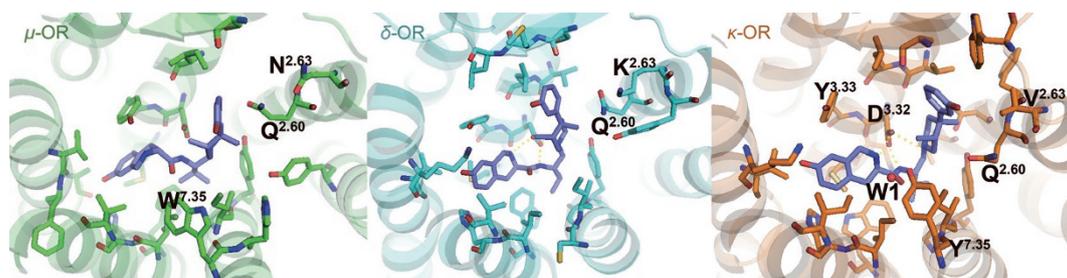
and D<sup>3.32</sup> in the mutant increased from 2 in the wild type to 3, accounting for 59.3% of the simulations, close to 63.1% in the  $\kappa$ -subtype (Table 2). However, the performance of the  $\delta$ -mutant was relatively poor, and the hydrogen bonds changed from 3 to 2. From the samples at 100 ns (Figure 3, 4C and 4D) and the initial structure of  $\kappa$ -subtype (Figure 2), we could see that the 7.35-position residues of the  $\mu$ -mutant and  $\kappa$ -subtype formed HBs with the carbonyl group on JDITic through water molecules, and the carbonyl group maintained a certain orientation. However, we did not find similar residues in this position of the  $\delta$ -mutant or around to keep the carbonyl group under the same orientation (Figure 4D), and then the isoquinoline ring in the  $\delta$ -mutant occurred in some tilt and away from D<sup>3.32</sup>. Therefore, in the case of JDITic remaining at a similar bending angle, it was very difficult for the ligand to form 3 hydrogen bonds with D<sup>3.32</sup>.

The bending angle of JDITic also attracted our attention. The stability of the ligand in the two mutants was better than that in the wild type, with an average angle of approximately 92°, which was close to that of the  $\kappa$ -subtype, approximately 88.5° (Figure 5A). However, the average angle of the  $\mu$ -mutant, accounting for approximately 43%, close to that of the  $\kappa$ -subtype, 50%, was significantly higher than that of the  $\delta$ -mutant, 25%. It was found that the Q<sup>2.60</sup> residue was not stable in the  $\delta$ -mutant (Figure 5B and Supplementary Table S1), especially at 10–65 ns. From the sampling of the two mutant systems at 100 ns and conformation of the Q<sup>2.60</sup> residue in the  $\kappa$ -subtype, the residue was located at the position close to TM7. However, there was no suitable residue to form a stable water environment and then make the Q<sup>2.60</sup> residue less steady in the  $\delta$ -mutant, which should be the main factor leading to the large change in the ligand bending angle.

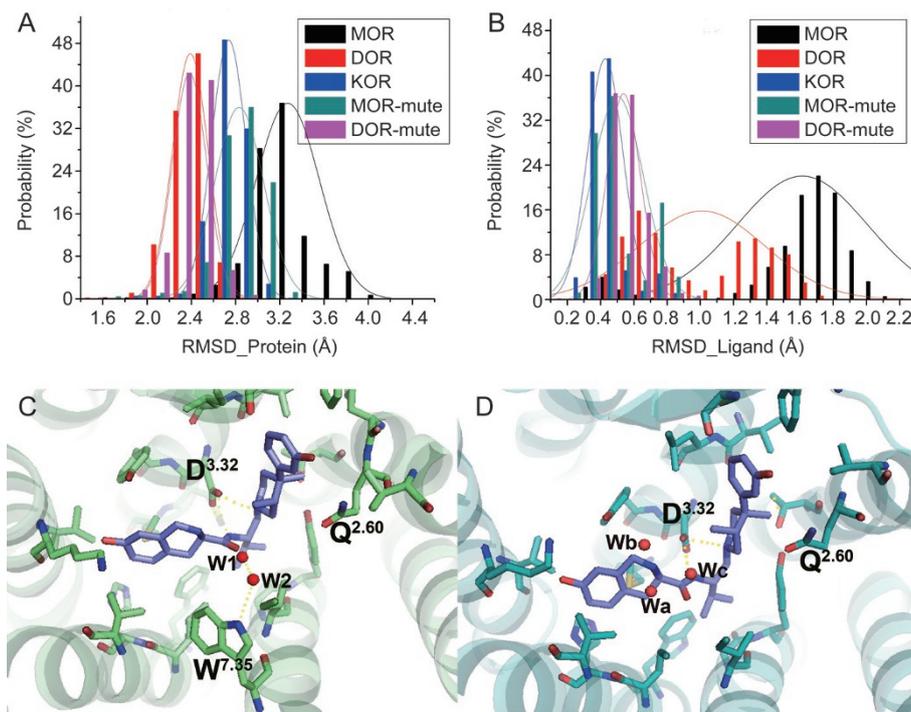
#### Unbinding pathways of JDITic in the three wild-type OR subtypes

To further understand the interaction diversities between JDITic and the three subtypes, we performed well-tempered metadynamics analysis on ligand dissociation channels of the  $\kappa$ -subtype crystal structure and  $\mu/\delta$ -wild type at 100 ns among unbiased MD simulations.

In our MT simulations, JDITic left the antagonist binding pocket in the three OR subtypes and explored the binding pathways to exit the receptors through a series of conformational changes.



**Figure 3.** Key interactions within 4 Å of JDITic in JDITic-OR complexes at final 100 ns. The backbones of residues and JDITic were colored in the same way as mentioned in Figure 2.



**Figure 4.** RMSD calculations of receptors (A) and JDITic (B) in unbiased JDITic-mutated OR systems. (C) The key interactions of JDITic-mutated OR complexes at the final 100 ns. The backbones of residues and JDITic were colored in forest green (mute- $\mu$ -OR), deep teal-cyan (mute- $\delta$ -OR) and slate-blue (JDITic). Hydrogen bond interactions are shown in the yellow dotted lines.

**Table 2.** Hydrogen bond analyses of D<sup>3.32</sup> with JDITic in five OR systems during the whole simulations. All data were produced using the program Gromacs 4.6.5.

Number of hydrogen bonds	D <sup>3.32</sup> (occupancy %)				
	$\mu$ -OR system	$\delta$ -OR system	$\kappa$ -OR system	$\mu$ -OR N2.63V	$\delta$ -OR K2.63V
1	8.2	8.4	3.4	5.5	11.9
2	68.3	38.0	33.5	35.0	71.1
3	23.3	52.7	63.1	59.3	16.9
4	– <sup>a</sup>	0.7	–	–	–

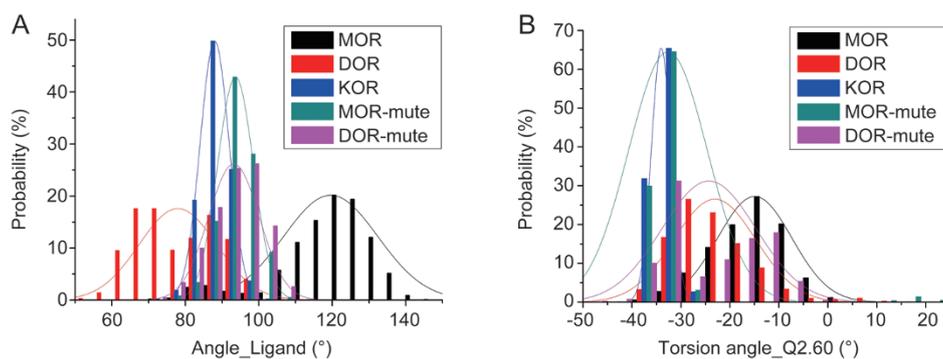
<sup>a</sup>: the symbol “–” represents no related hydrogen bond interaction.

Representative conformations (Figure 6) obtained from the dissociation of each system showed that JDITic adopted different unbinding pathways in the three subtypes. In the  $\mu$ -subtype, JDITic left the receptor from the TM2 region near the TM1 position. In the  $\delta$ -subtype, JDITic realized the dissociation from the area between TM5 and TM6. In the  $\kappa$ -subtype, JDITic left the receptor from the TM7 region near the TM1 direction. In each unbinding pathway of the  $\mu/\delta/\kappa$ -subtype, the gating residue varied, namely, Y<sup>2.64</sup>, W<sup>6.58</sup> and Y<sup>7.35</sup>, respectively. The 6.58 and 7.35 positions were “address” sites of ORs. Although Y<sup>2.64</sup> is common for the three subtypes, the adjacent residue at position 2.63 was different and had a significant impact on the selectivity of JDITic as discussed above. Therefore, the differences in the gating residues could also reflect the ligand selectivity varieties of ORs.

## Discussion

In this study, we performed a series of MD simulations around the selectivity of JDITic on the three OR subtypes. The simulations showed that the 2.63 position was the key factor of the selective ligand JDITic on the  $\mu$ -subtype. For the  $\delta$ -subtype, the 7.35 position was the other crucial aspect of the JDITic subtype selectivity in addition to the 2.63-position residue. Binding affinity assays<sup>[46]</sup> displayed that the binding affinity ratio of JDITic was 339 for the subtype  $\kappa/\mu$  and 4935 for the subtype  $\kappa/\delta$ . From these affinities, we could see the influence factors for the  $\delta$ -subtype activity of JDITic were more complex than that in the  $\mu$ -subtype. In addition, those JDITic analogs<sup>[28,30]</sup> generally had high selectivity on the  $\mu/\delta$ -subtype, in particular  $\delta$ -OR, and our results could also reveal this phenomenon well.

From the existing structural modification on JDITic ana-



**Figure 5.** (A) Ligand angle calculations and distributions in all the five systems. The measured method is the same as that in Figure 2B. (B) The torsion angle values and distributions of  $Q^{2.60}$  in all unbiased JD<sub>Tic</sub>-wild type/mutated OR systems.

logs, we could find that the amino group of the isoquinoline ring was the key aspect for the activity of these analogs. For instance, the binding affinity of compound JPP-6 (Figure 1B) was decreased to 1/10 of JD<sub>Tic</sub> due to the absence of the amino group<sup>[30]</sup>, which could be explained by the crystal structure, because the nitrogen atom was involved in hydrogen bonding with the D<sup>3.32</sup> residue. At the same time, the loss of the nitrogen atom would increase the selectivity of the JPP-6 compound on the  $\mu/\delta$ -subtype, which should be closely related to the residues at the 2.63 and 7.35 positions of ORs and the stability of JPP-6. The deletion of the nitrogen atoms damaged the rigid structure of the isoquinoline ring, thus increasing the flexibility of JPP-6. The affinity varieties of other JD<sub>Tic</sub> analogs might be related to the mode of action and other residues at different positions<sup>[20]</sup>.

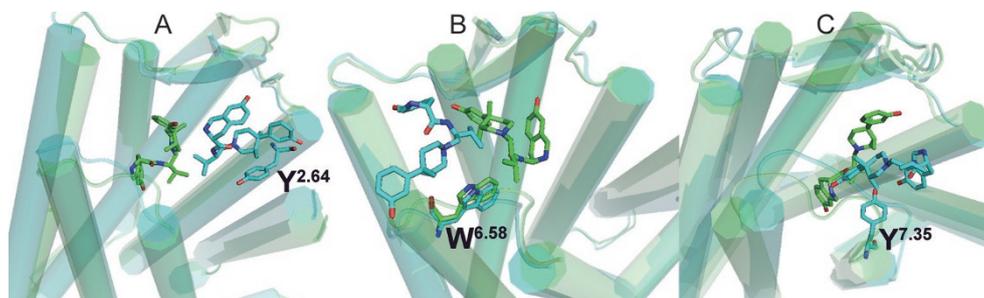
Site-directed mutagenesis experiments<sup>[20]</sup> demonstrated that D<sup>3.32</sup> was the critical residue for the binding affinity of JD<sub>Tic</sub> on the  $\kappa$ -subtype, while the 2.63 position basically did not form direct interaction with the  $\kappa$ -subtype. Mapped to the  $\mu/\delta$ -subtype, the 2.63-position residue became the vital factor influencing the JD<sub>Tic</sub> binding affinity for the two subtypes. This mode of action was similar to that of the  $\delta$ -OR-selective ligand NTI. All the results also reflected the diversity between the activity and selectivity mechanism to a certain extent.

Observed from the unbinding pathway of JD<sub>Tic</sub>, the 2.63- and 7.35-position residues were located in the gating area, and participated in ligand recognition and dissociation activities.

Therefore, it was supposed that “address” residues were not only closely related to the static interaction of ligands but also directly involved in the binding and dissociation process.

The importance of the 7.35- and 2.63-position residues for the selectivity of JD<sub>Tic</sub> was the focus of work by Wu *et al*<sup>[20]</sup> and Granier *et al*<sup>[19]</sup>, but they were consented only with the static perspective through molecular superposition and homology modeling. We started using the molecular dynamics method and carefully investigated the selectivity mechanism of JD<sub>Tic</sub> for the three OR subtypes. In addition to the significance of the 2.63-position residues on JD<sub>Tic</sub> selectivity, we also observed whether the efficacy of JD<sub>Tic</sub> was affected by the dynamics of  $Q^{2.60}$ , which was driven by the 2.63-position residue. These observations not only deepened our understanding of the selective mechanism of JD<sub>Tic</sub> regarding three OR subtypes but also had some reference values for the mechanism elucidation of other selective opioids. At the same time, this virtual mutation method could save on experimental reagents and materials.

Here, we incidentally summarized the critical sites for OR subtype selectivity, including the 2.63 position (JD<sub>Tic</sub>), ECL2 (U50488<sup>[26]</sup>), the 6.58 position (GNTIs<sup>[23-25]</sup>) and the 7.35 position (NTI<sup>[21, 25]</sup> and JD<sub>Tic</sub>). These sites were indeed located at the upper part of the binding pocket; therefore, these positions were closely related to ligand identification and dissociation. This suggests that the interaction between a ligand and a target might be determined by the time of their encounter. Fur-



**Figure 6.** Alignment of representative poses and gating residues in JD<sub>Tic</sub>- $\mu$ -OR (A)/ $\delta$ -OR (B)/ $\kappa$ -OR (C) complexes for the trajectory analysis of JD<sub>Tic</sub> unbinding.

thermore, the G-protein-biased agonist PZM21<sup>[47]</sup>, discovered in 2016, showed good selectivity on the three OR subtypes. The selectivity site was supposed to be at the 2.63 position from the docking mode, while the PZM21 ligand exhibited an excellent activation efficacy on the  $\mu$ -subtype.

In opioid receptors, the mutation of some key residues could lead to a significant decline in ligand activity; these residues include D<sup>3.32</sup> (JDTic<sup>[20]</sup>), E<sup>6.58</sup> and I<sup>6.55</sup> (5'-GNTI and Nor-BNI<sup>[20]</sup>), W<sup>6.58</sup> (NTI<sup>[21, 25]</sup>), and so on; in the other side, some mutated residues contributed to ligand functional changes. For instance, mutations of D<sup>2.50</sup>, N<sup>7.45</sup> and N<sup>7.49</sup> residues could reverse NTI from an antagonist to a  $\beta$ -arrestin protein-biased agonist<sup>[32]</sup>. The role of these two typical residues cannot be explained by the "message-address" concept<sup>[32]</sup>. Therefore, we suggest a new concept, namely, the "message-address-efficacy" hypothesis, to more appropriately interpret the relationships among the affinity, selectivity and function between ORs and opioids. In the new hypothesis, the "efficacy" site in a receptor is closely related to opioid activity and function similarly to the abovementioned residues, and these sites are both in consistency and diversity with those functioning with "message" and "address". Taking the binding process of JDTic<sup>[20]</sup> as an example, the D<sup>3.32</sup> residue plays the "message" role and acts as an "efficacy" site; additionally, in the 5'-GNTI<sup>[20]</sup> binding activity, the E<sup>6.58</sup> residue is the critical "address" site, but the "efficacy" function is completed through the cooperation of E<sup>6.58</sup> and I<sup>6.55</sup> residues. In addition, the abovementioned residues<sup>[32]</sup>, closely correlated with the functional selectivity of ORs, should also be regarded as "efficacy" residues.

The concept of "message-address-efficacy" can not only promote our comprehensive understanding of residue functions on ORs but also update our recognition of the "message-address" concept proposed based on traditional opiates<sup>[8-10]</sup>, such as the indolyl group of NTI functioning both as "address" and "efficacy" sites<sup>[21, 25, 32]</sup>. Taking JDTic<sup>[20]</sup> as an example again, three nitrogen atoms and areas around are the "efficacy" sites, while the hydroxyphenol position acts an "address" role. Considering the crucial interaction information of the opioid receptor, the thought of "message-address-efficacy" would be more suitable to be applied to obtain highly active and selective ligands. The idea can be used to design new corresponding ligands and modify existing opioids.

Currently, it was difficult to quantitatively identify the specific effect intensity of the 2.63 and 7.35 positions on three OR subtypes. We thought the related difference values would be further computed through combining free energy calculation methods. Certainly, it is necessary to build more systems to study the dissociation of ligands.

## Conclusions

In this work, we studied the JDTic-induced subtype selectivity of  $\mu/\delta/\kappa$ -ORs through a series of computational simulations, including molecular dynamics and metadynamics methods. To clarify the related subtype selectivity mechanism in detail, we combined the simulated mutation method with our simulations.

*Subtype selectivity mechanism of JDTic.* We found the 2.63 position was the decisive factor of JDTic selectivity for the  $\mu$ -subtype. However, for the  $\delta$ -subtype, the 7.35 position was the other crucial aspect of JDTic subtype selectivity in addition to the 2.63-position. The two positions affected the efficacy of JDTic both through changing the dynamics of the Q<sup>2.60</sup> residue. The 2.63- and 7.35-position residues are located in the gating area and participate in ligand recognition and dissociation activities among the unbinding process of JDTic.

*"Message-address-efficacy" hypothesis.* Based on the existing critical interaction mechanism, we proposed the "message-address-efficacy" hypothesis to interpret the relationships among the affinity, selectivity and function between ORs and opioids. Considering the receptor interaction mechanism, the above hypothesis is thought to be more suitable than the "message-address" concept in understanding the functions of opioids and their receptors.

Thus, our studies provide the detailed dynamics mechanism of OR-subtype selectivity, and the "message-address-efficacy" hypothesis might be helpful for deep understanding of the action of ORs and the new ligand design.

## Acknowledgements

All the simulations were performed using the high-performance cluster kindly provided by Prof Bang-ce YE of the State Key Laboratory of Bioreactor Engineering, East China University of Science and Technology. This work was supported by the National Key Research and Development Program of China (Grant 2016YFA0502304), the National Natural Science Foundation of China (Grants 81673356 and U1603122) and the 111 Project (Grant B07023).

## Author contribution

Jian-xin CHENG carried out the molecular dynamics simulations; Jian-xin CHENG and Yun TANG designed the study and analyzed the data; Yun TANG was responsible for the project; Jian-xin CHENG, Tao CHENG, Wei-hua LI, Gui-xia LIU, Wei-liang ZHU and Yun TANG contributed to writing and commenting on the manuscript.

## Supplementary information

Supplementary files are available at the website of Acta Pharmacologica Sinica.

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