

# Mechanism of $\beta$ -arrestin recruitment by the $\mu$ -opioid G protein-coupled receptor

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**Agonists to the  $\mu$ -opioid G protein-coupled receptor ( $\mu$ OR) can alleviate pain through activation of G protein signaling, but they can also induce  $\beta$ -arrestin activation, leading to such side effects as respiratory depression. Biased ligands to  $\mu$ OR that induce G protein signaling without inducing  $\beta$ -arrestin signaling can alleviate pain while reducing side effects. However, the mechanism for stimulating  $\beta$ -arrestin signaling is not known, making it difficult to design optimum biased ligands. We use extensive molecular dynamics simulations to determine three-dimensional (3D) structures of activated  $\beta$ -arrestin2 stabilized by phosphorylated  $\mu$ OR bound to the morphine and D-Ala<sup>2</sup>, N-MePhe<sup>4</sup>, Gly-ol]-enkephalin (DAMGO) nonbiased agonists and to the TRV130 biased agonist. For nonbiased agonists, we find that the  $\beta$ -arrestin2 couples to the phosphorylated  $\mu$ OR by forming strong polar interactions with intracellular loop 2 (ICL2) and either the ICL3 or cytoplasmic region of transmembrane (TM6). Strikingly, Gi protein makes identical strong bonds with these same ICLs. Thus, the Gi protein and  $\beta$ -arrestin2 compete for the same binding site even though their recruitment leads to much different outcomes. On the other hand, we find that TRV130 has a greater tendency to bind the extracellular portion of TM2 and TM3, which repositions TM6 in the cytoplasmic region of  $\mu$ OR, hindering  $\beta$ -arrestin2 from making polar anchors to the ICL3 or to the cytosolic end of TM6. This dramatically reduces the affinity between  $\mu$ OR and  $\beta$ -arrestin2.**

biased agonists | nonbiased agonists | molecular dynamics

**D**uring the past decade, both G protein-biased and  $\beta$ -arrestin ( $\beta$ arr)-biased ligands have been discovered and developed for ~30 different G protein-coupled receptors (GPCRs). Such biased ligands provide functional selectivity to regulate more precisely biological functions of GPCRs, providing new drugs with superior efficacy but reduced side effects (1). Biased ligands are crucial for treatment of chronic neuropathic pain, a major challenge in clinical practice (2). Opioid analgesics, such as morphine, are prescribed to relieve severe pain by activating pain receptors in the central nervous system that induce G protein-mediated signaling to confer analgesia. However, these opioids are associated with such side effects as sedation, physical dependence, addiction, tolerance, and respiratory depression (3). These side effects, particularly respiratory depression, are thought to be mediated by activation of  $\beta$ arr signaling (3). To avoid such side effects, biased ligands that elicit Gi protein activation with minimal  $\beta$ arr recruitment have shown efficient pain treatment with minimal side effects, to replace traditional narcotic analgesics (2).

The  $\mu$ -opioid GPCR ( $\mu$ OR) stimulates signaling via the adenylyl cyclase-inhibitory family of G proteins (Gi/o), leading to analgesic activity (4). Therefore, the detailed interplay between  $\mu$ OR, Gi protein, and ligands that induce Gi protein activation is crucial in the design of the active analgesics. The agonist modulates G protein signaling by triggering exchange of guanosine diphosphate (GDP) with guanosine triphosphate (GTP) bound to G $\alpha$ i and decoupling of G $\beta\gamma$  from the GPCR to induce signaling (5). Afterward, the G $\beta\gamma$  helps recruit the G protein-coupled receptor kinase (6–8) that phosphorylates the activated GPCR (9, 10). In particular for  $\mu$ OR, phosphorylation takes place mainly at the serine and threonine residues in the long C-terminal tail,

forming the phosphorylated-C (pp-C) tail (11–13). For nonbiased ligands the pp-C tail of the final agonist-GPCR complex reaches out to recruit  $\beta$ arr (11–13). Indeed, mutation of all serines and threonines to alanine on the  $\mu$ OR C tail cancels recruitment of  $\beta$ arr, thereby greatly diminishing such side effects as desensitization and internalization (11–13). In fact, a recent X-ray crystal structure of phosphorylated rhodopsin (pp-rhod)-arrestin-1 supports the significant role of the pp-C tail in recruiting arrestin since both phosphorylated residues on the C terminus form strong salt bridges with arrestin-1 (14). Therefore, the detailed interplay between  $\mu$ OR,  $\beta$ arr, and a nonbiased ligand orchestrates the critical steps toward recruiting and activating the  $\beta$ arr. Understanding these interactions should be useful for in silico design of biased ligands that might prevent a critical step of  $\beta$ arr activation.

Unfortunately, neither crystal nor cryo-electron microscopy (EM) structures are available for the  $\mu$ OR- $\beta$ arr complex, making it difficult to carry out structure-based design and development of new biased agonists. To this end, we report here three-dimensional (3D) structures of the final activated state of  $\beta$ arr2 coupled to the active state of  $\mu$ OR bound to a full agonist D-Ala<sup>2</sup>, N-MePhe<sup>4</sup>, Gly-ol]-enkephalin (DAMGO), a partial agonist morphine, and a biased agonist TRV130. These 3D structures provide the basis for obtaining a deep understanding of  $\beta$ arr2 interaction with both biased and nonbiased ligands. This should enable in silico design of biased agonists with low activity for  $\beta$ arr2 activation.

To build the agonist-pp- $\mu$ OR- $\beta$ arr2 complex, we started with the recent ~3.0-Å-resolution crystal structure of pp-rhod-arrestin-1 complex. Although this structure provides the overall shape and

## Significance

**We report high-resolution structures for the  $\mu$ -opioid G protein-coupled receptor ( $\mu$ OR) complexed with  $\beta$ -arrestin2 while bound to either strong nonbiased agonists (morphine and DAMGO) or to biased agonist TRV130. We used these structures to identify a sequence of events leading to  $\beta$ -arrestin2 recruitment. We discovered that for nonbiased agonists,  $\beta$ -arrestin2 and Gi protein make strong anchors to the same intracellular loops of  $\mu$ OR, even though their recruitment leads to different outcomes. However, we find that for the biased ligand,  $\beta$ -arrestin2 binds much more weakly to  $\mu$ OR, possibly explaining the reduction in side effects. These structures provide the basis for structure-based design of biased drugs to mediate pain more effectively while reducing such side effects as respiratory depression.**

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Data deposition: Our optimized structure has been deposited in GitHub, <https://github.com/amafi-gpcr/Beta-arrestin2-mu-opioid-receptor-agonist-complex-PNAS-2020>.

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conformation of the complex, including most hydrophobic interactions, the resolution does not identify the important polar interactions (salt bridges and hydrogen bonds). Therefore, we refined the pp-rhod-arrestin-1 complex to discover several important polar interactions not identified in the crystal structure (*SI Appendix, Fig. S1*). To do this, we first carried out 4 ns of simulated annealing while imposing strong restraints on the backbone atoms to retain the main features of the crystal structure. Here, all side chains were flexible so that they could form new favorable polar interactions. Subsequently, we performed a long (~450-ns) molecular dynamics (MD) simulation to relax the complex while imposing heavy restraints on the backbone atoms to retain the main features of the crystal structure. We then used this refined structure of the pp-rhod-arrestin-1 as the basis for predicting the high-affinity  $\beta$ arr2-pp- $\mu$ OR-DAMGO,  $\beta$ arr2-pp- $\mu$ OR-morphine, and  $\beta$ arr2-pp- $\mu$ OR-*Oliceridine* (known as TRV130) complexes. We discovered that the active conformation of  $\beta$ arr2 couples to the core of pp- $\mu$ OR by forming polar anchors to the intracellular loop 2 (ICL2) and either the ICL3 or the cytosolic end of transmembrane (TM6) domain, which further stabilizes the fully engaged complex of  $\beta$ arr2-pp- $\mu$ OR-agonist. In this regard, the biased ligand differs substantially from the nonbiased ligands by TRV130 showing much lower binding affinity between pp- $\mu$ OR and  $\beta$ arr2 because  $\beta$ arr2 does not form polar anchors with the ICL3 or the cytosolic end of TM6.

For the nonbiased ligands, we find extensive interactions between the  $\mu$ OR pp-C tail and  $\beta$ arr2 that stabilize the active conformation of the  $\beta$ arr2, allowing the  $\beta$ arr2 to fully engage with the core of pp- $\mu$ OR to eventually form the polar anchors. Indeed, we find that the mobility of the finger loop is the main driving force during recruitment, contributing to the full engagement of  $\beta$ arr2 with pp- $\mu$ OR.

Strikingly, we showed (15) that the Gi protein couples to the opioid receptors by forming polar anchors to each of three ICLs of the  $\mu$ OR. Thus, for nonbiased ligands  $\beta$ arr2 binds to  $\mu$ OR in the same fashion as Gi, competing for the same binding sites, while their recruitment leads to very different outcomes.

To understand how a biased agonist, such as TRV130, selectively stimulates Gi protein while disfavoring  $\beta$ arr2 signaling, we followed the same strategy as above, modeling and optimizing

the activated state of the human  $\mu$ OR-Gi-TRV130 complex. The TRV130 binding site to human  $\mu$ OR is distinctly different from the nonbiased agonists, with TRV130 binding more strongly with TM2 and TM3 in the extracellular portion of  $\mu$ OR, which repositions TM6 that dramatically reduces  $\beta$ arr2 binding to pp- $\mu$ OR. However, the Gi protein forms the same polar anchors to ICL2 and the cytosolic end of TM6 as the nonbiased ligands.

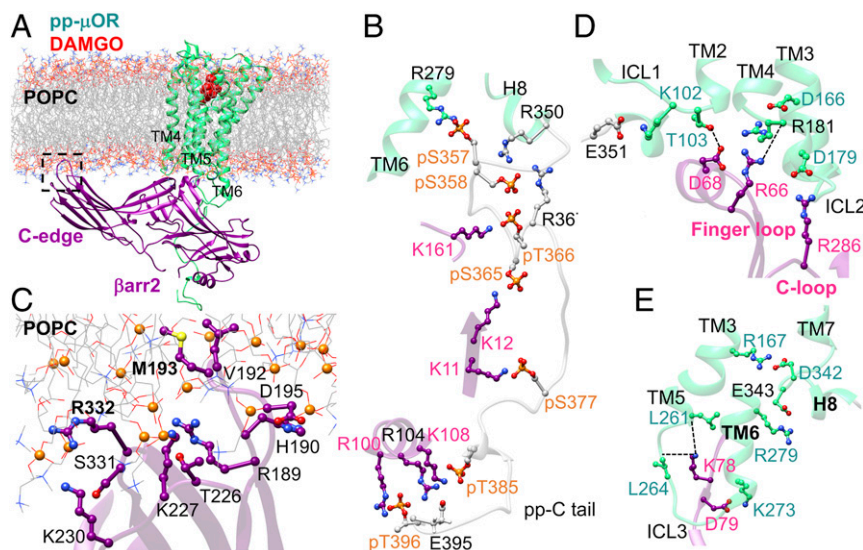
For the active  $\beta$ arr2-pp- $\mu$ OR-TRV130 complex, we find that the active conformation of  $\beta$ arr2 forms a polar anchor with the ICL2 of the pp- $\mu$ OR, just as for nonbiased ligands. However, due to the repositioned TM6, we find that  $\beta$ arr2 is unable to make polar anchors with either ICL3 or the cytosolic end of TM6, in contrast to the nonbiased ligands. This lack of polar anchors prevents the active conformation of  $\beta$ arr2 from binding properly to the pp- $\mu$ OR core, significantly lowering the binding affinity between the  $\beta$ arr2 and  $\mu$ OR.

This insight provides the basis for designing biased ligands acting on the  $\mu$ OR.

## Result and Discussion

**Modeling the  $\beta$ arr2-pp- $\mu$ OR Interface.** To build the  $\beta$ arr2-pp- $\mu$ OR-agonist complex, we first optimized the recent crystal structure of pp-rhod bound to arrestin-1 (Protein Data Bank [PDB] ID code 5W0P) (14) and then used this structure as the template for building our models. Prior to optimization, we removed the artificial *N*-acetylglucosamine and T4 lysozyme protein from the pp-rhod. In addition, we built in residues 324 to 330 missing in the C tail of the 3.0-Å X-ray structure (*SI Appendix, SI Methods*). Then, we immersed the complex in the lipid bilayer including water and salt and performed 450 ns of MD simulation with positional restraints on the protein backbone atoms to ensure that the crystal structure is not disturbed while the residue side chains are refined to find the optimum polar interactions between the arrestin-1 and pp-rhod. Our final structure (*SI Appendix, Fig. S1*) is in perfect agreement with the crystal structure, with rmsd = 0.3 Å.

We used the GENSeMBLE (16) method to predict the active conformation of human- $\mu$ OR starting from the mouse- $\mu$ OR (PDB ID code 5C1M) (17). We then docked morphine into the predicted human- $\mu$ OR structures using DarwinDock (18). Next, we



**Fig. 1.** (A) The high-affinity  $\beta$ arr2-pp- $\mu$ OR-DAMGO complex immersed in the membrane bilayer. (B) The strong polar interactions between the N domain of  $\beta$ arr2 and the pp-C tail of  $\mu$ OR, mostly involving pS and pT residues on the pp-C tail interacting with positively charged residues on the N domain of  $\beta$ arr2. (C) The membrane anchoring from the C edge of  $\beta$ arr2, which is dominated by hydrophobic contacts. Here, P atoms are shown as orange spheres. (D) The polar anchor from  $\beta$ arr2 to ICL2 of the  $\mu$ OR, which creates a polar network of interactions from the finger loop to ICL2 and the cytosolic end of TM2. (E) Polar anchors from the  $\beta$ arr2 to both ICL3 and the bottom end of TM6, fully engaging the body of the  $\beta$ arr2 to the core of the  $\mu$ OR.

separately matched DAMGO and TRV130 into the human morphine binding pocket. Subsequently, we added and modeled all residues in the C terminus of  $\mu$ OR using the MODELER program (19). It has been shown that the main phosphorylation sites on the  $\mu$ OR for recruiting the  $\beta$ arr2 are serine and threonine residues on the C tail (12). However, the degree of phosphorylation can depend on the type of agonist (11, 20, 21). Interestingly, a recent study (12) showed that mutation of all serines and threonines to alanine on the C tail of  $\mu$ OR in the presence of DAMGO and morphine blocks the  $\beta$ arr2 recruitment. Therefore, we used the full degree of phosphorylation for this study. To find the conformation of the pp-C tail that has the maximum number of interactions with  $\beta$ arr2, we started with a complex between the inactive state of  $\beta$ arr2 (22) (PDB ID code 3P2D) and the activated state of  $\mu$ OR (*SI Appendix, SI Methods*). To optimize the interactions between the pp-C tail and the  $\beta$ arr2, we performed several 25- to 90-ns meta-MD simulations to identify the maximum number of salt bridges between the N domain of  $\beta$ arr2 and the pp-C tail of  $\mu$ OR while heavy restraints were placed on the backbone atoms of the protein except for the pp-C tail. Next, to model the final activated state of  $\beta$ arr2- $\mu$ OR-DAMGO,  $\beta$ arr2- $\mu$ OR-morphine, and  $\beta$ arr2- $\mu$ OR-TRV130, we replaced the inactive  $\beta$ arr2 with the active one (23) (PDB ID code 5TV1) by superimposing the refined arrestin-1 and pp-rhod complex on both active  $\beta$ arr2 and  $\mu$ OR. This structure was subjected to several minimization and optimization steps using meta-MD and MD simulations.

**Active-State Complex of  $\beta$ arr2-pp- $\mu$ OR Bound to DAMGO, a Full Agonist.** DAMGO is a full agonist in the  $\beta$ arr2 assay, with 8.8-fold higher efficacy than morphine for recruiting  $\beta$ arr2 (24). Thus, we first characterized the fully engaged pp- $\mu$ OR- $\beta$ arr2-DAMGO complex by performing a 500-ns MD simulation. An overview of the optimized complex (25) immersed in the lipid bilayer is shown in Fig. 1A. Since mutation of all serine and threonine in the carboxyl-terminal receptor to alanine was shown to inhibit recruitment of  $\beta$ arr2 (12), we optimized the structure with all 10 serine (pS) and threonine (pT) residues on the C tail phosphorylated (Fig. 1B). This allows the pp-C tail to engage tightly the N domain of  $\beta$ arr2, leading finally to emergence of persistent salt bridges between pS365-K12, pS366-K161, pS377-K11, pT385-R108, E395-R108, and pT396-R100. These extensive interactions play a pivotal role in stabilizing the complex.

Our optimized complex shows that the C edge of the  $\beta$ arr2 makes extensive contacts to the lipid bilayer (Fig. 1C), mostly dominated by hydrophobic interactions. Remarkably, one of the C-edge loops, <sup>189</sup>RHFLMSDRS<sup>197</sup>, penetrates into the lipid bilayer, allowing H190, L192, M193, and D195 to establish hydrophobic contacts to the 1-palmitoyl-2-oleoyl-sn-glycero-3-phosphocholine (POPC) membrane, while the R189 involves a polar interaction with a POPC phosphate group. In contrast, the other C-edge loops, <sup>224</sup>NSTKTVKKI<sup>232</sup> and <sup>329</sup>VSRGG<sup>334</sup>, reside on the membrane surface with K227, K230, and R332 making polar contacts to phosphate groups of POPC. A previous computational study showed that lipid interactions with the C edge of arrestin function as a membrane anchor that is essential for stabilizing the high-affinity arrestin-GPCR complex (26). Another recent computational study (27) indicates that the lack of such lipid anchoring transforms the active  $\beta$ arr1 to its inactive conformation, suggesting that such contacts between the arrestin and lipid bilayer stabilize the active conformation of  $\beta$ arr1. Indeed, our MD studies show that  $\beta$ arr2 retains its active conformation with an averaged interdomain twist angle of  $\sim 18^\circ \pm 3^\circ$  (*SI Appendix, Figs. S2 A–C and S3*), similar to the  $17^\circ$  twist reported for the  $\beta$ arr2 crystal structure of  $\beta$ arr2 (23), confirming that lipid anchoring by the C edge of  $\beta$ arr2 is pivotal for the stability of the high-affinity pp- $\mu$ OR- $\beta$ arr2 complex.

We discovered that  $\beta$ arr2 forms strong anchors to ICL2, ICL3, and the cytosolic end of TM6 in our high-affinity pp- $\mu$ OR- $\beta$ arr2-

DAMGO complex. The high affinity between  $\beta$ arr2 and ICL2 creates a network of polar interactions that stabilize the active-state complex (Fig. 1D). In this network, the salt bridge between D179<sup>ICL2</sup> and R286 on the C loop serves as an anchor that aligns the finger loop to establish polar interactions with ICL2 and the cytosolic end of TM2. Here, R181<sup>ICL2</sup> plays a crucial role in regulating  $\beta$ arr2 binding. R181<sup>ICL2</sup> exhibits a charge-charge interaction with D166<sup>3,49</sup> [the superscript is Ballesteros–Weinstein numbering for GPCRs (28) taken from ref. 29], while its carbonyl oxygen forms a hydrogen bond to R66 on the finger loop (Fig. 1D). The coordinated R66 makes a salt bridge with D68<sup>Finger loop</sup>, orienting the D68<sup>Finger loop</sup> to involve a hydrogen bond with T103<sup>2,37</sup>. Moreover, we find that D79 in the N domain of  $\beta$ arr2 makes an ionic contact to the K273<sup>6,26</sup> at the end of TM6 (Fig. 1E). We consider this salt bridge as the second ionic anchor that induces K78 in the N domain to engage two hydrogen bonds with the carbonyl oxygen of L261<sup>5,65</sup> and L264<sup>ICL3</sup>. Our MD simulation indicates that the ionic anchors from the pp- $\mu$ OR to  $\beta$ arr2 play vital roles in  $\beta$ arr2 recruitment.

**Active-State Complex of  $\beta$ arr2-pp- $\mu$ OR Bound to Morphine, a Partial Agonist.** To find if emergence of the ionic anchors is statistically significant, we performed an independent 500-ns MD simulation to characterize the fully engaged  $\beta$ arr2-pp- $\mu$ OR complex using morphine, a clinical drug considered to be a partial agonist (24) for  $\beta$ arr2 recruitment. An overview of the optimized complex immersed in the lipid bilayer is shown in Fig. 2A. Our MD simulation shows that the N domain of  $\beta$ arr2 couples tightly to the phosphorylated C tail with strong electrostatic attractions (Fig. 2B). We find that numerous salt bridges: K161-pS357, R162-pS358, K12-pS365, K11-pT372, K11-pT385, R8-E396, R100-pT396, and R104-pT396 participate in this tight coupling. Of these interactions, pS377 makes a persistent salt bridge with K295, which is known to play an important role in  $\beta$ arr2 recruitment (20). A previous experiment on the human embryo kidney (HEK) cells showed that blocking the residue equivalent to S377 in human- $\mu$ OR from phosphorylation greatly diminishes association of  $\mu$ OR with  $\beta$ arr2 (20).

We find that the C edge of  $\beta$ arr2 anchors to the membrane bilayer (Fig. 2C), allowing the  $\beta$ arr2 to maintain its active conformation with an averaged interdomain twist angle of  $\sim 20^\circ \pm 4^\circ$  (*SI Appendix, Figs. S2 D–F and J and S4*). However, when we eliminate the lipid anchors (*SI Appendix, Fig. S5*),  $\beta$ arr2 shifts from the active conformation to an inactive conformation with an averaged interdomain twist angle of  $\sim 5^\circ$ . This is consistent with a recent computational study (27) showing that without a lipid anchor, the  $\beta$ arr1 is not able to remain its active conformation, with the interdomain twist angle changing from  $\sim 17^\circ$  to between  $\sim 0^\circ$  and  $7^\circ$ . This indicates that interactions of the membrane bilayer with the C edge of  $\beta$ arr2 are essential to stabilize the active conformation of  $\beta$ arr2.

For morphine, the C-edge loop, <sup>189</sup>RHFLMSDRS<sup>197</sup>, also penetrates the lipid bilayer, with L192 and M193 forming hydrophobic anchors to the membrane. However, the other C-edge loops, <sup>223</sup>NSTKTVKKI<sup>232</sup> and <sup>329</sup>VSRGG<sup>334</sup>, stay on the membrane surface, coordinating K227 and R332 to form polar interactions with the phosphate groups of POPC. Indeed, this second independent simulation confirms that lipid anchors are essential for stimulating the  $\beta$ arr2 signaling, aligning the  $\beta$ arr2 to bind effectively to the cytoplasmic part of the pp- $\mu$ OR.

We find that the high-affinity complex of  $\beta$ arr2-pp- $\mu$ OR-morphine features polar anchors from the  $\beta$ arr2 to the ICL2 and ICL3 of the pp- $\mu$ OR, similar to DAMGO. In this structure, R286 on the C loop forms a hydrogen bond with D179<sup>ICL2</sup> (Fig. 2D). This anchor coordinates the ICL2 to tightly engage the finger loop. Here, R181<sup>ICL2</sup> establishes persistent salt bridges with D166<sup>3,49</sup> and D68<sup>Finger loop</sup>. This induces D68<sup>Finger loop</sup> to form a hydrogen bond with carbonyl oxygen of A104<sup>2,38</sup> at the cytosolic



end of TM2. Indeed, this network of polar interactions is similar to the one created by DAMGO. In addition,  $\beta$ arr2 forms a second anchor from D241 to R265 on ICL3 (Fig. 2E). Also, our analysis shows that E272<sup>6,25</sup> at the bottom of TM6 frequently forms a weak salt bridge with K78. To eliminate the possibility that emergence of these ionic anchors is not statistically significant, we repeated the 500-ns MD simulation with the velocities reassigned (SI Appendix, Fig. S6). Importantly, our second optimized structure identifies similar anchors between D179<sup>ICL2</sup>-R286<sup>C-loop</sup> and R265<sup>ICL3</sup>-E314<sup>Back loop</sup>. Overall, the emergence of polar anchors between  $\beta$ arr2 and pp- $\mu$ OR in the presence of both the full and partial agonists indicates that these anchors effectively coordinate the  $\beta$ arr2 to have strong interactions with the core of the receptor.

**Activated State of Mouse  $\mu$ OR-DAMGO-Gi Complex.** Strikingly, we found recently that ionic anchors are also essential for activation of Gi protein mediated by opioid receptors (15). Thus, in the presence of nonbiased agonists, we find a similar pattern in binding of Gi protein and  $\beta$ arr2 to the  $\mu$ OR.

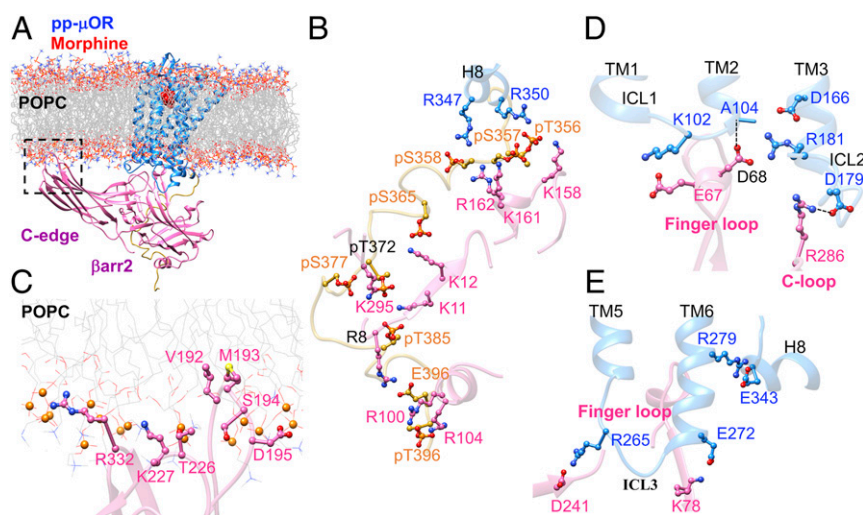
Optimizing the cryo-EM structure (Fig. 3) of the active state of mouse- $\mu$ OR bound to DAMGO stabilized by Gi protein (15, 30) shows that ICL2 of  $\mu$ OR also involves extensive polar interactions with the Gi protein in which the salt bridge from D177<sup>ICL2</sup> (equivalent to the human D179<sup>ICL2</sup>) to R32 on the G $\alpha$ i subunit (Fig. 3B) serves as an ionic anchor that engages Gi protein recruitment. Moreover, we find that R179<sup>ICL2</sup> (equivalent to the human R181<sup>ICL2</sup>) forms a charge-charge interaction with D350 in the G $\alpha$ i- $\alpha$ 5 helix (Fig. 3B), which allows D350 to establish a hydrogen bond with T103<sup>2,39</sup> at the cytosolic end of TM2. Indeed, this complex network of polar interactions induced by the Gi protein is analogous to that created by the  $\beta$ arr2. Here, the D177<sup>ICL2</sup> and R179<sup>ICL2</sup> play similar crucial roles to coordinate this network. The similar recruitment of Gi protein and  $\beta$ arr2 by  $\mu$ OR indicates that these two effectors compete for the same binding site even though their recruitment leads to opposite outcomes.

We also found that ICL3 of opioid receptors serves an important role in recruiting the Gi protein (15). Our optimized  $\mu$ OR-Gi protein shows that both R263 and K271<sup>6,26</sup> in mouse  $\mu$ OR (equivalent to R265<sup>ICL3</sup> and K273<sup>6,26</sup>, respectively, in the human  $\mu$ OR) form salt bridges with E318 in the RAS-like

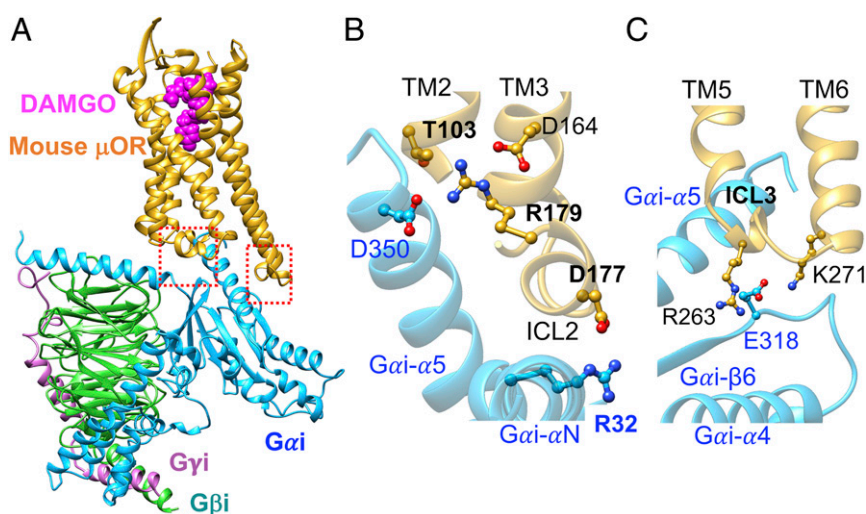
domain of G $\alpha$ i (Fig. 3C). As we showed above, these positively charged residues also play crucial roles in recruiting the  $\beta$ arr2. Indeed, this finding confirms that both the Gi protein and  $\beta$ arr2 compete to bind to the same sites in  $\mu$ OR.

**Recruitment of Activated  $\beta$ arr2 by pp- $\mu$ OR-Morphine.** The primary role of the phosphorylated carboxyl terminus of  $\mu$ OR is to recruit and subsequently to activate arrestin, which displaces the C-terminal tail of arrestin (31–34). Upon activation, arrestin undergoes a remarkable  $\sim 20^\circ$  twist of the C domain relative to the N domain, which is widely considered as a primary metric to assess arrestin activation (14, 23, 35, 36). Recent structures of arrestins bound to phosphorylated GPCRs (14, 27, 37) indicate that the activated arrestins bind tightly to the pp-C tail of receptors while also interacting strongly with the 7TM core of the GPCR. In fact, a computational study showed that the 7TM core and phosphorylated C tail independently stimulate the arrestin activation but both together take part in formation of high-affinity GPCR-arrestin complex (36).

To understand how  $\beta$ arr2 bound to the pp-C tail migrates from water to interact strongly with the core of the pp- $\mu$ OR, we performed a free energy calculation using umbrella sampling (38–41). In this calculation, we gradually disengage the  $\beta$ arr2 from the high-affinity complex to form a partially engaged  $\beta$ arr2-pp- $\mu$ OR structure, where the  $\beta$ arr2 binds solely to the pp-C tail (Fig. 4A). Importantly,  $\beta$ arr2 remains in its active conformation with an averaged interdomain twist angle of  $\sim 18^\circ \pm 5^\circ$ , showing that the pp-C tail alone is sufficient to activate  $\beta$ arr2. Indeed, this finding is consistent with multiple studies revealing that just the pp-C tail is sufficient to stimulate arrestin activation and signaling (35, 41–45). On the other hand,  $\beta$ arr2 is characterized to have an averaged interdomain twist angle of  $\sim 20^\circ \pm 5^\circ$  in the high-affinity complex (denoted as fully engaged complex) (Figs. 24 and 44), where the  $\beta$ arr2 is fully engaged in the 7TM core of  $\mu$ OR. This finding confirms that a strong coupling between  $\beta$ arr2 and pp- $\mu$ OR stabilizes the active conformation of  $\beta$ arr2, showing the significant role of the 7TM core in  $\beta$ arr2 recruitment. Our findings are in excellent agreement with a recent study on pp-rhod-arrestin-1, indicating that both the pp-C tail and the core of receptor together further stabilize the active conformation of arrestin 1 (36).



**Fig. 2.** (A) The high-affinity  $\beta$ arr2-pp- $\mu$ OR-morphine complex immersed in the membrane bilayer. (B) Strong interactions between the N-terminal domain of  $\beta$ arr2 and the pp-C tail of the  $\mu$ OR, mostly involving pS and pT residues on the pp-C tail interacting with positively charged residues on the N-terminal domain of  $\beta$ arr2. (C) The membrane anchoring from the C edge of  $\beta$ arr2, which is dominated by hydrophobic contacts. Here, the P atoms are shown by orange spheres. (D) The polar anchor from  $\beta$ arr2 to ICL2 of the  $\mu$ OR, which creates a polar network of interactions from the finger loop to ICL2 and the cytosolic end of TM2. (E) Polar anchors from the  $\beta$ arr2 to both ICL3 and the bottom end of TM6, fully engaging the body of the  $\beta$ arr2 to the core of the  $\mu$ OR.



**Fig. 3.** Activated Gi protein binds to activated mouse  $\mu$ OR in the same fashion as  $\beta$ arr2 couples to pp- $\mu$ OR. (A) Well-optimized Gi-mouse- $\mu$ OR-DAMGO complex obtained from MD simulation (15), starting from the recent cryo-EM (30). (B) The polar anchor from R32<sup>Gai</sup> to D177<sup>ICL2</sup> (equivalent to D179 in the human  $\mu$ OR). This salt bridge creates a network of polar interactions from the Gai- $\alpha$ 5 helix to the ICL2 and the cytosolic end of TM2, which is similar to the network that emerges from  $\beta$ arr2 coupling to the pp- $\mu$ OR. (C) The polar anchors between Gi protein and  $\mu$ OR: from E318 to R263<sup>ICL3</sup> (equivalent to R265 in the human  $\mu$ OR) and K271<sup>Gai- $\alpha$ 5</sup> (equivalent to K273 in the human  $\mu$ OR). These anchors show that Gi protein and  $\beta$ arr2 compete for the same binding site in the  $\mu$ OR, even though their recruitment results to totally opposite outcomes.

We find that after  $\beta$ arr2 is activated by the pp-C tail, it spontaneously couples to the 7TM core of pp- $\mu$ OR (Movie S1). Our free energy calculation shows high affinity between the activated  $\beta$ arr2 and pp- $\mu$ OR (a partially engaged  $\beta$ arr2 with the pp- $\mu$ OR, denoted as S-I), leading to forming the fully engaged complex, while reducing the energy substantially, by  $\sim -65$  kcal/mol (Fig. 4A). This high binding affinity between pp- $\mu$ OR and  $\beta$ arr2 is expected since the pp- $\mu$ OR carries negative net charges, while the  $\beta$ arr2 has positive net charges, facilitating spontaneous electrostatic attraction. During the free energy calculation, we identified a sequence of important events that lead to recruitment of  $\beta$ arr2 by the pp-C tail and the 7TM core (Fig. 4B).

The  $\beta$ arr2 recruitment is triggered by strong interactions from the negatively charged residues on the pp-C tail, mostly from pS and pT residues, to positively charged amino acids on the N domain of  $\beta$ arr2 (S-I in Fig. 4B). The N domain binds the pp-C tail with its  $\alpha$ -helix I and  $\beta$ -strand I. Interestingly, we find that the pp-C tail primarily forms a salt bridge from the pS377 to K295 <sup>$\beta$ arr2</sup>, indicating that S377 is crucial for recruiting the  $\beta$ arr2. Indeed, it is well known from experiments on HEK293 cells that morphine is a full agonist (24) for phosphorylation at S375 (equivalent to S377 in human  $\mu$ OR), whereas inhibiting this serine from phosphorylation greatly reduces  $\beta$ arr2 recruitment (12).

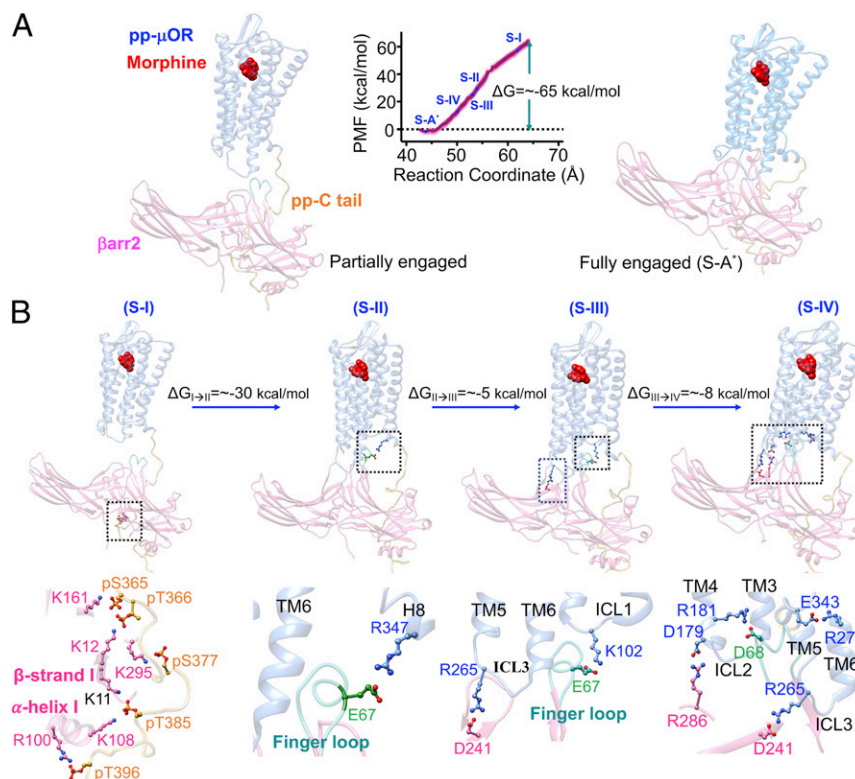
Our MD simulations show that the finger loop penetrates to the core of  $\mu$ OR to eventually promote  $\beta$ arr2 to fully engage with the 7TM core. The finger loop has a flexible conformation when it is not yet engaged in interactions with the pp- $\mu$ OR (Movie S2). This flexibility enables the finger loop to extend from water to the core of the receptor to establish a loose salt bridge from E67 to R347<sup>8,52</sup> in the H8 helix (S-II in Fig. 4B). This loose charge-charge interaction between E67-R347<sup>8,52</sup> is not able to stabilize the finger loop conformation and mobility. Consequently, the finger loop fluctuates inside the receptor to finally make another ionic contact from E67 to K102<sup>ICL1</sup> (S-III in Fig. 4B). This salt bridge serves as an anchor that induces the C domain of the  $\beta$ arr2 to ascend and interact with both the ICL3 and ICL2. Our free energy calculations suggest that the finger loop is a major driver of the  $\beta$ arr2 coupling to the 7TM core pp- $\mu$ OR.

The anchor from the finger loop to the ICL1 induces the tilted C domain of  $\beta$ arr2 to move toward the pp- $\mu$ OR to make an ionic

anchor from D241 to R265<sup>ICL3</sup> (S-III in Fig. 4B; Movie S3), which reduces the energy by  $\sim 8$  kcal/mol compared with S-II. Subsequently, this ionic anchor facilitates pushing up the rest of the C domain of the  $\beta$ arr2, leading to emergence of an ionic anchor between R286 in the C loop and D179 in ICL2 (S-IV in Fig. 4B; Movie S4), which substantially lowers the energy by  $\sim 8$  kcal/mol compared with S-III. Remarkably, emergence of the anchor between ICL2 and  $\beta$ arr2 coincides with breaking the salt bridge between E67 and K102, which displaces the finger loop to its final position, in which D68 establishes a salt bridge with R181<sup>ICL2</sup> (S-IV in Fig. 4B; Movie S4). Eventually, the system energy decreases by  $\sim 18$  kcal/mol to reach the high-affinity complex (S-A\*) described earlier, where  $\beta$ arr2 is fully engaged with the core of pp- $\mu$ OR. Indeed, our free energy calculations indicate that the ICLs of pp- $\mu$ OR play a crucial role in stimulating  $\beta$ arr2 recruitment, with polar anchors to all three ICLs significantly mediating the binding. In fact, a recent computational study revealed that binding of the visual arrestin-1 to the core of rhodopsin is primarily mediated by interactions of ICLs with the body of the arrestin (36). Interestingly, our optimized structure of pp-rhod-arrestin-1 complex (SI Appendix, Fig. S1) features strong ionic anchors, K141<sup>ICL2</sup>-D253<sup>C-loop</sup> and E239<sup>ICL3</sup>-Arg318<sup>Back loop</sup>, confirming that the ionic anchors from ICL2 and ICL3 play key roles in coupling of arrestin-1 to the pp-rhod.

To determine whether the penetration of finger loop into the cytoplasmic region of the pp- $\mu$ OR is the main driver of the  $\beta$ arr2 coupling to the 7TM core of pp- $\mu$ OR, we repeated our free energy calculation to follow the recruitment of  $\beta$ arr2 by the pp- $\mu$ OR in the presence of DAMGO (SI Appendix, Fig. S7). Our free energy calculation reveals that the finger loop penetrates to the 7TM core to make an ionic contact from R66 to D179<sup>ICL2</sup>, which eventually induces the  $\beta$ arr2 to form ionic anchors with ICL2 and the cytosolic end of TM6, leading to formation of a high-affinity complex between the proteins. This calculation indicates the finger loop plays a crucial role in recruitment of the  $\beta$ arr2 by pp- $\mu$ OR.

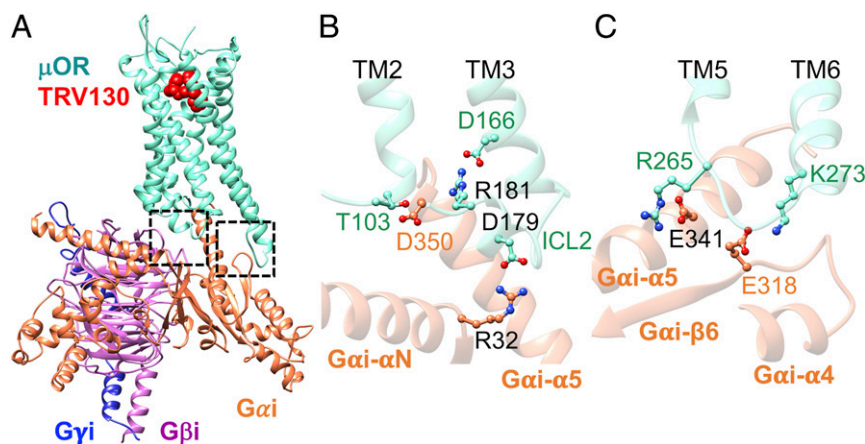
**Active-State Complex of  $\beta$ arr2-pp- $\mu$ OR Bound to TRV130, a Biased Agonist.** To understand how TRV130, a biased clinical agonist, selectively stimulates Gi protein while disfavoring  $\beta$ arr2 signaling, we started with modeling and optimizing the activated state



**Fig. 4.** Process of forming the fully engaged complex between the pp- $\mu$ OR and the  $\beta$ arr2 in the presence of morphine. (A) The averaged potential of mean force (PMF) indicates that the recruited  $\beta$ arr2 by the pp-C tail spontaneously couples the core of pp- $\mu$ OR. The free energy was obtained by umbrella sampling MD, where the reaction coordinate is the distance along the z component between the center of mass of C $\alpha$ s in the pp- $\mu$ OR for residues 54 to 340 and the center of mass of C $\alpha$ s in  $\beta$ arr2. The errors (shaded as pink) were assessed by the bootstrap method (38). (B) Sequence of important events in the recruitment of the  $\beta$ arr2 by the pp- $\mu$ OR bound to morphine. Our free energy calculation suggests the following pathway. 1) S-I: the  $\beta$ arr2 couples to the pp-C tail of  $\mu$ OR, involving mainly salt bridges from pS and pT residues to positively charged residues on the N domain of the  $\beta$ arr2. 2) S-II: the flexible finger loop extends to the receptor core to engage the H8 helix. 3) S-III: the extended finger loop moves toward ICL1 to form an anchor from E67 to K102<sup>ICL2</sup>. Anchoring to the ICL1 allows the rest of  $\beta$ arr2 to ascend to form another anchor from D241 to R265 on the ICL3. 4) S-IV: finally, the  $\beta$ arr2 forms a polar anchor from R286 on the C loop to D179 on the ICL2 that transforms the finger loop to the final position.

of  $\mu$ OR-Gi-TRV130 (Fig. 5A). We find that Gi binds to the human  $\mu$ OR by forming ionic anchors to ICL2 and the cytosolic end of TM6, which is consistent with our previous computational study showing that ionic anchors to the ICLs are essential for Gi

protein signaling mediated by opioid receptors (15). Here, R179<sup>ICL2</sup> forms a salt bridge to R32 on the G $\alpha$ i subunit (Fig. 5B), while K273<sup>6,26</sup> forms a salt bridge with E318 in the RAS-like domain of G $\alpha$ i (Fig. 5C). Moreover, R265<sup>ICL3</sup> makes a salt bridge



**Fig. 5.** Activated Gi protein binds to activated human  $\mu$ OR. (A) Well-optimized Gi-human- $\mu$ OR-TRV130 complex obtained from an  $\sim$ 250-ns MD simulation. (B) The polar anchor from R32<sup>Gai</sup> to D179<sup>ICL2</sup>. This salt bridge creates a network of polar interactions from the G $\alpha$ i- $\alpha$ 5 helix to ICL2 and the cytosolic end of TM2, which is similar to the network that emerges in the presence of DAMGO. (C) The polar anchor between Gi protein and  $\mu$ OR: E318 to K273<sup>6,26</sup>.



contact to D341 on the G $\alpha$ - $\alpha$ 5 helix. Our MD simulations show that the Gi protein couples to the  $\mu$ OR bound to TRV130 in a fashion similar to the coupling of Gi to  $\mu$ OR in the presence of DAMGO. This behavior is expected since the main role of the biased ligand is to favor only Gi signaling. In this regard, measurements (24) in HEK293 cells reveal that the TRV130, morphine, and DAMGO exhibit a comparable efficacy for G protein recruitment.

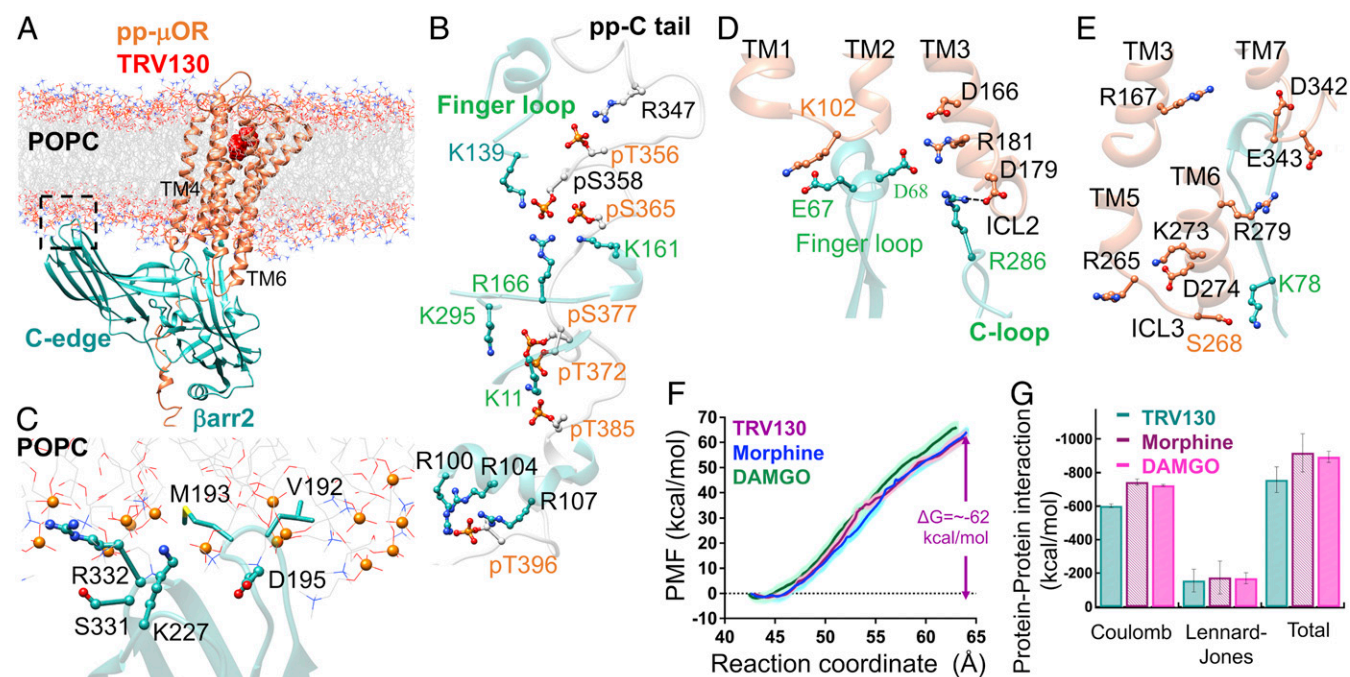
TRV130 selectively disfavors the pathway of  $\beta$ arr2 signaling. Thus, it exhibits 14% of the morphine efficacy for  $\beta$ arr2 recruitment (24) in the HEK293 cells. To determine why TRV130 deviates from morphine and DAMGO regarding  $\beta$ arr2 signaling, we predicted the fully activated  $\beta$ arr2-pp- $\mu$ OR-TRV130 complex by performing a 500-ns MD simulation. To have a fair comparison between DAMGO, morphine, and TRV130, we considered the full phosphorylation at all 10 serine and threonine residues on the C tail, even though this phosphorylation is a  $\beta$ arr2 agonist property. Indeed, TRV130 is known to lead to less phosphorylation at S375 in the HEK293 experiments (equivalent to S377 in human  $\mu$ OR) compared with morphine, which is a full agonist for phosphorylation of S375 (24). Thus, the lack of full phosphorylation at S375 may lower the efficacy of TRV130 for  $\beta$ arr2 coupling (24). Even so, our model with full phosphorylation at the C tail already shows that TRV130 is less able to recruit  $\beta$ arr2, which is consistent with TRV130 leading to only the 14% of the morphine efficacy for  $\beta$ arr2 coupling (24).

An overview of the optimized complex immersed in the lipid bilayer is shown in Fig. 6A. Our  $\beta$ arr2-pp- $\mu$ OR-TRV130 complex features two important sites for interactions: 1) strong interactions between the N domain of  $\beta$ arr2 and the pp-C tail (Fig. 6B), which are dominated mostly by ionic contacts (Fig. 6C), and 2) hydrophobic contacts between the C edge of  $\beta$ arr2 and lipid membrane. These interactions, which are similar to those we found

for complexes to nonbiased ligands, stabilize the active conformation of the  $\beta$ arr2 with an averaged interdomain twist angle of  $\sim 19^\circ \pm 6^\circ$  (SI Appendix, Figs. S2 G–J and S4B).

We find that in the presence of TRV130 the active conformation of  $\beta$ arr2 forms a polar anchor with the ICL2 of the pp- $\mu$ OR. In this structure, R286 on the C loop makes a hydrogen bond with D179<sup>ICL2</sup> (Fig. 6D), which is identical to the one we identified in the presence of morphine (Fig. 2D). This anchor coordinates ICL2 to interact strongly with the finger loop. R181<sup>ICL2</sup> establishes a persistent salt bridge with D68<sup>Finger loop</sup>. Indeed, this network of polar interactions is similar to the one created by DAMGO and morphine.

Strikingly, for the TRV130 case, the  $\beta$ arr2 is unable to make polar anchors with either ICL3 or the cytosolic end of TM6, in stark contrast to the complexes obtained by the nonbiased ligands. Here, R265<sup>ICL3</sup> does not interact with any polar residues on  $\beta$ arr2, while K273<sup>6,26</sup> forms an internal salt bridge with D274<sup>6,25</sup>, making K273<sup>6,26</sup> inaccessible for forming anchors with  $\beta$ arr2 (Fig. 6E). In the presence of nonbiased ligands, R265<sup>ICL3</sup> and K273<sup>6,26</sup> play crucial roles in mediating  $\beta$ arr2 coupling to the pp- $\mu$ OR. These results suggest that the ability of pp- $\mu$ OR to make polar anchors to the ICL3 or to the cytosolic end of TM6 to  $\beta$ arr2 may distinguish biased from nonbiased ligands. We propose that this lack of polar anchors between  $\beta$ arr2 and pp- $\mu$ OR has significant consequences on the binding affinity between the  $\beta$ arr2 and the pp- $\mu$ OR. To test this idea, we examined the binding free energy of the  $\beta$ arr2 to the pp- $\mu$ OR in the presence of DAMGO, morphine, and TRV130 (Fig. 6F and SI Appendix, Figs. S7 and S8). We find that the free energy differences as the system evolves from the partially engaged to the fully engaged state are  $\sim -68$ ,  $-65$ , and  $-62$  kcal/mol for the DAMGO, morphine, and TRV130, respectively. Thus, all



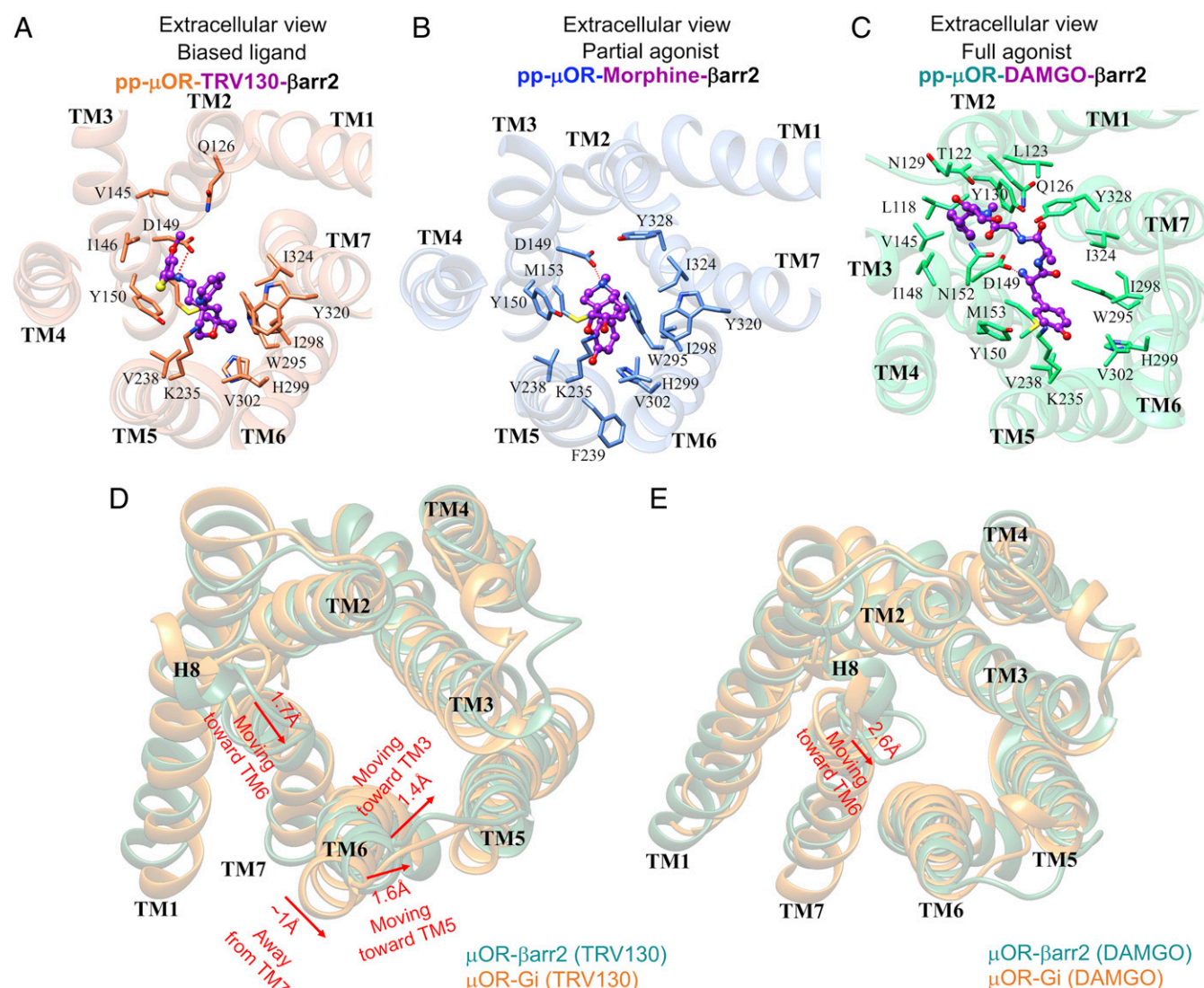
**Fig. 6.** (A) The high-affinity  $\beta$ arr2-pp- $\mu$ OR-TRV130 immersed in the membrane bilayer. (B) Strong interactions between the N domain of  $\beta$ arr2 and the pp-C tail of the  $\mu$ OR, mostly involving pS and pT residues on the pp-C tail with positively charged residues on the N domain of  $\beta$ arr2. (C) The membrane anchoring from the C edge of  $\beta$ arr2, which is mostly dominated by hydrophobic contacts. Here, the P atoms are shown by orange spheres. (D) The polar anchor from  $\beta$ arr2 to ICL2 of  $\mu$ OR, which creates a polar network of interactions from the finger loop to ICL2 and the cytosolic end of TM2. (E) The lack of polar anchoring from  $\beta$ arr2 to ICL3 or the bottom end of TM6 hinders the proper coupling of  $\beta$ arr2 to the core of  $\mu$ OR. (F) The averaged potential of mean force (PMF) for  $\beta$ arr2 coupling to the 7TM core  $\mu$ OR. The free energy was obtained by umbrella sampling where the reaction of coordinate is the distance along the z component between the center of mass of C $\alpha$ s in the pp- $\mu$ OR for residues 54 to 340 and the center of mass of C $\alpha$ s in  $\beta$ arr2. The errors (shaded as pink for TRV130, light green for DAMGO, and light blue for morphine) were assessed by the bootstrap method (38). (G) The nonbonded interactions within 12 Å between  $\beta$ arr2 and the core of pp- $\mu$ OR for DAMGO (full), morphine (partial), and TRV130 (biased) agonist in the fully engaged complexes, where we excluded water, and ions from these calculations.

three ligands lead to a comparable affinity between the  $\beta$ arr2 and the pp- $\mu$ OR. Even so, these values do indicate that the highest affinity between the  $\beta$ arr2 and the pp- $\mu$ OR is from binding of DAMGO to the pp- $\mu$ OR, while the lowest affinity is from binding of TRV130, which correlates with experimental recruitment data (24).

To determine whether the modest difference in the binding free energies is really significant, we further analyzed the nonbonded interactions (enthalpy contribution) in the fully engaged complexes. We evaluated the nonbonded interactions between the pair proteins within 12 Å excluding the effects of water and ions (Fig. 6G). We find that pp- $\mu$ OR exhibits a comparable nonbonded interaction ( $\sim$ 900 kcal/mol) with  $\beta$ arr2 when bound to morphine or DAMGO, but the nonbonded interactions decrease dramatically (by 17%) for TRV130 bound to pp- $\mu$ OR ( $\sim$ 750 kcal/mol). Thus, our free energy calculations and our analysis of nonbonded interactions both suggest that the affinity between the  $\beta$ arr2 and the pp- $\mu$ OR decreases remarkably when biased TRV130 binds to the pp- $\mu$ OR. This is consistent with biased activity for TRV130.

The comparable binding free energies between the pp- $\mu$ OR and the  $\beta$ arr2 in the presence of DAMGO, morphine, and TRV130 may arise because we assume the same degree of phosphorylation for all three. Thus, the actual level of phosphorylation for each case, which is not yet available from experiment, might further differentiate the ligands in terms of their activity for the  $\beta$ arr2 coupling.

Analysis of the extracellular portion of pp- $\mu$ OR reveals that all three agonists make a persistent salt bridge with D149<sup>3,32</sup> (Fig. 7 A–C), which is a well-known anchoring point for binding of various agonists and antagonists to  $\mu$ OR (17, 30, 31, 46). In addition, these agonists are locked into the human  $\mu$ OR through extensive hydrophobic plus a few polar interactions (Fig. 7 A–C). DAMGO as a full agonist for the  $\beta$ arr2 coupling makes the greatest number of contacts with the orthosteric binding pocket, including TM2, TM3, TM5, TM6, and TM7. This behavior is anticipated as DAMGO is a relatively bulky ligand. Compared with DAMGO, morphine makes significantly fewer interactions with



**Fig. 7.** The pp- $\mu$ OR binding pocket after  $\sim$ 500 ns of MD simulation stabilized by the  $\beta$ arr2 in the presence of (A) TRV130, a biased agonist; (B) morphine, a partial agonist; and (C) DAMGO, a full agonist for the  $\beta$ arr2 coupling. The dotted lines represent the hydrogen binding. (D) The structural differences between the cytoplasmic region of the  $\mu$ OR after recruiting the Gi protein (orange) and the  $\beta$ arr2 (green) in the presence of TRV130. The red arrows represent movements of the  $\mu$ OR induced by the  $\beta$ arr2. (E) The structural differences between the cytoplasmic region of the  $\mu$ OR after recruiting the Gi protein (orange) and the  $\beta$ arr2 (green) in the presence of DAMGO. The red arrow represents the only significant movement of the  $\mu$ OR induced by the  $\beta$ arr2.



the  $\mu$ OR binding pocket, and it does not make any contact to TM2, explaining why morphine has 8.8-fold lower efficacy than DAMGO (24) for  $\beta$ arr2 recruitment.

On the other hand, our MD simulations show that biased ligand TRV130 binds to  $\mu$ OR differently even though TRV130 has a size and structure comparable with morphine. We find that TRV130 has a stronger interaction with TM2 and TM3, with a hydrophobic interaction to Q126<sup>2,60</sup> in contrast to morphine, which has no contact to TM2. Also, TRV130 forms two hydrophobic interactions with V145<sup>3,28</sup> and I146<sup>3,29</sup>, whereas these two residues do not contribute to morphine binding. While V145<sup>3,28</sup> has a hydrophobic interaction with the DAMGO, I146<sup>3,29</sup> is specific for binding of TRV130. Moreover, TRV130 also fails to make contacts to several residues involved in the binding pockets of DAMGO and morphine. Thus, M153<sup>3,36</sup> is not involved in binding of TRV130. In contrast M153<sup>3,36</sup> is a well-known hydrophobic residue that defines the morphinan hydrophobic pocket for antagonists and agonists (17, 46). In addition, TRV130 does not interact with Y328<sup>7,42</sup>, which contrasts dramatically with the nonbiased morphine and DAMGO. In fact, Y328<sup>7,42</sup> plays an important role in mediating the binding pocket of morphine since mutation of Y328<sup>7,42</sup> to phenylalanine dramatically reduces morphine binding affinity (47). We attribute the lack of interaction between TRV130 and Y328<sup>7,42</sup> to the tendency of TRV130 to tightly engage the TM2 and TM3, which pulls TRV130 away from TM7 so that it cannot properly interact with Y328<sup>7,42</sup>. Overall, we find that the binding pocket of TRV130 differs significantly from that of the nonbiased agonist, which modifies the structure of the ICLs of the TRV130- $\mu$ OR complex sufficiently that the affinity of the pp- $\mu$ OR to the  $\beta$ arr2 is diminished substantially (Fig. 6F).

To better understand how TRV130 selectively discourages coupling of  $\beta$ arr2 to the pp- $\mu$ OR, we compare the cytoplasmic region of  $\mu$ OR stabilized by both Gi protein and  $\beta$ arr2 (Fig. 7D). We find that for TRV130 the cytoplasmic region of  $\mu$ OR undergoes remarkable structural changes when  $\beta$ arr2 is recruited. Notably, TM6 moves  $\sim 1$  Å away from TM7 [measuring the distance between L277<sup>6,30</sup> (C $\alpha$ )-N334<sup>7,49</sup> (C $\alpha$ )], while it approaches TM5 by  $\sim 1.6$  Å [measuring the distance between K271<sup>6,24</sup> (C $\alpha$ )-K262<sup>5,66</sup> (C $\alpha$ )] and TM3 by  $\sim 1.1$  Å [measuring the distance between K271<sup>6,24</sup> (C $\alpha$ )-V171<sup>3,54</sup> (C $\alpha$ )]. This remarkable repositioning of TM6 does not allow  $\beta$ arr2 to bind properly to ICL3 or the cytosolic end of TM6, which impedes the proper coupling of  $\beta$ arr2 to  $\mu$ OR (Fig. 7D).

Interestingly, analysis of the intracellular (IC) portion of the  $\mu$ OR stabilized by Gi protein compared with  $\beta$ arr2 for DAMGO shows that the TM6 hardly repositions, encouraging  $\beta$ arr2 to form an ionic anchor with the bottom of TM6 (Fig. 7E). Moreover, for DAMGO, the H8 helix on  $\mu$ OR has a similar movement of  $\sim 2.6$  Å toward the TM6, allowing E343<sup>8,48</sup> to make a persistent salt bridge with R279<sup>6,32</sup> (Fig. 1D). In addition, this movement coordinates D342<sup>8,47</sup> to establish a charge-charge interaction with R167<sup>3,50</sup>. In contrast, TRV130 is not able to promote the creation of these two salt bridges, while morphine favors only the formation of the salt bridge between the E343<sup>8,48</sup> and R279<sup>6,32</sup> (Fig. 2D). Summarizing, our MD simulations indicate that the reconfiguration of the cytoplasmic region of the  $\mu$ OR induced by TRV130 is the main cause preventing the  $\beta$ arr2 from binding to  $\mu$ OR with high affinity.

## Conclusions

We report 3D structures of the final activated state of  $\beta$ arr2 stabilized by the active state of pp- $\mu$ OR bound to a full agonist

DAMGO, a partial agonist morphine, and TRV130, which is biased against for the  $\beta$ arr2 coupling. We found that in the presence of the nonbiased agonists,  $\beta$ arr2 couples to the pp- $\mu$ OR by forming strong polar interactions with ICL2 and either the ICL3 or cytoplasmic region of TM6. Interestingly, we found that Gi protein couples with  $\mu$ OR in a similar fashion, with Gi making similar polar contacts to the identical residues on the ICL2 and either of the ICL3 or the cytoplasmic region of TM6. These results indicate that Gi protein and  $\beta$ arr2 compete for the same binding site even though their recruitment leads to opposite outcomes.

On the other hand, we found that biased TRV130 has a greater tendency to bind to the extracellular portion of TM2 and TM3, inducing a repositioning of TM6 in the cytoplasmic region of the  $\mu$ OR, which hinders  $\beta$ arr2 from properly binding to pp- $\mu$ OR. We found that for TRV130,  $\beta$ arr2 is unable to form any polar anchors to the ICL3 or the cytosolic end of TM6 (although it does make an anchor to ICL2 similar to nonbiased agonists), which causes a remarkable reduction in the affinity between the pp- $\mu$ OR and  $\beta$ arr2. This dramatic difference in the pharmacophore for biased and nonbiased agonists suggests that ligands could be designed to have much greater biased activity.

## Methods

As described in detail in *SI Appendix*, we built active-state complexes of  $\beta$ arr2-pp- $\mu$ OR bound to DAMGO (full agonist), morphine (partial agonist), and TRV130 (biased agonist). Subsequently, we performed long MD simulations ( $\sim 500$  ns) to optimize these complexes with lipid (POPC), water, and ions, which resulted in a simulation box of  $123 \times 104 \times 138$  Å<sup>3</sup> with  $\sim 180,000$  atoms.

All molecules were described using AMBER force fields. The proteins were described using AMBER14 (48), while parameters for the POPC were borrowed from LIPID17, which is incorporated in Ambertools 16 (49). The phosphorylated serine and threonine residues with a net charge of  $-2$  were parameterized using Ambertools 16 (49) with phosaa10 (50) parameters. The morphine, DAMGO, and TRV130 ligands were described using parameters obtained from the Generalized Amber force field (51) using ACPYPE (52) and Antechamber16 (53). The partial charges for the ligands were assigned with the semiempirical AM1-BCC model (54), which is incorporated in USCF chimera (55). The transferable intermolecular potential 3P (TIP3P) (56) model was used to treat the water.

We used the following simulation algorithms for the final equilibration. The temperature was maintained at 310 K using a Nose-Hoover (57, 58) thermostat with a damping constant of 1.0 ps, and the pressure was controlled at 1 bar using a Parrinello-Rahman barostat algorithm (59) with a damping constant of 5.0 ps. Semi-isotropic pressure coupling was applied during this calculation. The Lennard-Jones cutoff radius was 1.2 nm, where the interaction was smoothly shifted to zero after 1.0 nm. Unlike-atom interactions were computed using the standard Lorentz-Berthelot combination rules. Periodic boundary conditions were applied to all three directions. The short-range coulombic interaction was treated within a cutoff radius of 1.2 nm, while the particle mesh Ewald (PME) algorithm (60) with a grid spacing of 0.16 nm was used to calculate the long-range electrostatic interactions. The compressibility of  $4.5 \times 10^{-5}$  bar<sup>-1</sup> was used in the xy plane and z axis to relax the box volume. All simulations were performed using GROMACS (61) graphics processing unit computing algorithm with an autotuning PME. Water OH bonds were constrained by the SETTLE algorithm (62), and the remaining H bonds were constrained using the P-LINCS algorithm (63).

All data and procedures are included in the manuscript, *Movies S1-S4*, and the GitHub repository.

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