# Conformational plasticity of the intracellular cavity of GPCR—G-protein complexes leads to G-protein promiscuity and selectivity

Manbir Sandhu<sup>a,b</sup>, Anja M. Touma<sup>c</sup>, Matthew Dysthe<sup>c</sup>, Fredrik Sadler<sup>c</sup>, Sivaraj Sivaramakrishnan<sup>c,1</sup>, and Nagarajan Vaidehi<sup>a,b,1</sup>

<sup>a</sup>Irell & Manella Graduate School of Biological Sciences, Beckman Research Institute of the City of Hope, Duarte, CA 91010; <sup>b</sup>Department of Computational & Quantitative Medicine, Beckman Research Institute of the City of Hope, Duarte, CA 91010; and <sup>c</sup>Department of Genetics, Cell Biology, and Development, University of Minnesota, Twin Cities, Minneapolis, MN 55455

Edited by Robert J. Lefkowitz, Howard Hughes Medical Institute, Duke University Medical Center, Durham, NC, and approved May 2, 2019 (received for review December 13, 2018)

While the dynamics of the intracellular surface in agonist-stimulated GPCRs is well studied, the impact of GPCR dynamics on G-protein selectivity remains unclear. Here, we combine molecular dynamics simulations with live-cell FRET and secondary messenger measurements, for 21 GPCR-G-protein combinations, to advance a dynamic model of the GPCR-G-protein interface. Our data show C terminus peptides of  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_q$  proteins assume a small ensemble of unique orientations when coupled to their cognate GPCRs, similar to the variations observed in 3D structures of GPCR-G-protein complexes. The noncognate G proteins interface with latent intracellular GPCR cavities but dissociate due to weak and unstable interactions. Three predicted mutations in β2-adrenergic receptor stabilize binding of noncognate  $G\alpha_q$  protein in its latent cavity, allowing promiscuous signaling through both  $G\alpha_s$  and  $G\alpha_q$  in a dose-dependent manner. This demonstrates that latent GPCR cavities can be evolved, by design or nature, to tune G-protein selectivity, giving insights to pluridimensional GPCR signaling.

G-protein—coupled receptor | GPCR | functional selectivity | structural plasticity | dynamics

-protein-coupled receptors (GPCRs) bind a diverse array of agonists and regulate multiple physiological processes. Upon binding agonists, GPCRs couple to single or multiple Gprotein subtypes and initiate cell-specific signaling pathways. Studies with novel bioluminescence resonance energy transfer sensors show GPCRs exhibit a promiscuous and "pluridimensional" behavior, coupling to many Gα-proteins with different strengths (1-4). While a receptor may show similar affinity to different Ga proteins, the cellular context may render certain couplings moot (1, 5-9). There are four major subtypes of heterotrimeric ( $G\alpha\beta\gamma$ ) G proteins, typified by the  $G\alpha$  subunit:  $G\alpha_s$ ,  $G\alpha_{i/o}$ ,  $G\alpha_{q/11}$ , and  $G\alpha_{12/13}$ . The downstream cellular response elicited by G-protein signaling pathways are dependent on these distinct Gα-protein subfamilies. Current models of G-protein signaling cannot explain why certain GPCRs bind multiple subtypes, while others are selective. Currently, seven distinct 3D structures of Class A agonist–GPCR–G-protein complexes (10–16) provide details on the residue interactions in the GPCR-G-protein interface. This structural information, coupled with phylogenetic analysis of GPCR and G-protein sequences, highlight the G-protein barcodes for selectivity (17, 18). However, untangling which of these interacting pairs are critical "hotspots" mediating selectivity warrants probing the dynamics of the GPCR-G-protein interface, the focus of our current study.

Seminal works have shed light on the critical involvement of GPCR intracellular (IC) loops and the transmembrane (TM) helix 6 (TM6) interface in mediating selective G-protein interactions (19–23). Analysis of 3D structures combined with previous cell-based assay studies show the  $\alpha$ 5 helix in the C terminus of the G $\alpha$  protein exhibits a large effect on selective coupling to

GPCRs (24–29). Here we study the dynamic interactions of the C terminus of  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_q$  proteins, hereafter referred to as s-pep, i-pep, and q-pep, in combination with seven class A GPCRs ( $\beta$ 2-Adrenergic Receptor,  $\beta_2AR$ ;  $\beta$ 3-Adrenergic Receptor,  $\beta_3AR$ ; Dopamine 1 Receptor,  $D_1R$ ;  $\alpha$ 2A-Adrenergic Receptor,  $\alpha_{2A}AR$ ; Cannabinoid 1 Receptor,  $CB_1R$ ;  $\alpha$ 1A-Adrenergic Receptor,  $\alpha_{1A}AR$ ; and Vasopressin 1A Receptor,  $V_{1A}R$ ), to delineate the GPCR–G-protein selectivity determinants. Our focus is to delineate the contribution of the receptor–G-protein dynamics in G-protein selectivity and promiscuity.

Previous receptor dynamics studies showed that agonist binding makes the IC half of the receptor more dynamic and conformationally heterogeneous (30–32), while G-protein binding stabilizes the GPCR conformation and increases the affinity of a GPCR for a full agonist (33–35). Detailed dynamics studies of the agonist–GPCR–Gα-protein complex to identify selectivity determinants are sparse. In this work, we use extensive Molecular Dynamics (MD) simulations combined with a scalable fluorescence resonance energy transfer (FRET) sensor technique called Systematic Protein Affinity Strength Modulation (SPASM) that is performed in live cells. The advantage of the SPASM technique is

# **Significance**

Structures of GPCR–G-protein complexes show how cognate G proteins interact with GPCRs. However, noncognate GPCR–G-protein interactions are poorly understood, despite their relevance in cells. The conceptual advancements in our study show 1) the C terminus of  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_q$  proteins assume a small dynamic ensemble of unique orientations when coupled to their cognate GPCRs, explaining the variations observed in the X-ray and cryo-EM structures of GPCR–G-protein complexes; and 2) the noncognate G proteins interact dynamically with latent, previously uncharacterized cavities within the GPCR cytosolic cavity. Engineering these latent cavities with hotspots to the noncognate G proteins tunes promiscuity in the GPCR. This study provides a framework for understanding how GPCR dynamics subtly modulate signaling in different pathways.

Author contributions: M.S., S.S., and N.V. designed research; M.S., A.M.T., M.D., and F.S. performed research; M.S., A.M.T., S.S., and N.V. analyzed data; and M.S. and N.V. wrote the paper.

The authors declare no conflict of interest.

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<sup>1</sup>To whom correspondence may be addressed. Email: sivaraj@umn.edu or nvaidehi@coh.org.

This article contains supporting information online at www.pnas.org/lookup/suppl/doi:10. 1073/pnas.1820944116/-/DCSupplemental.

Published online May 28, 2019.

that tethering GPCRs to  $G\alpha$  proteins with the length-adjustable  $\alpha$ -helical ER/K linker (36) allows scaling of the effective localized concentration of GPCR and  $G\alpha$  protein to span various, plausible, cellular concentrations. SPASM is sensitive to measuring weak and dynamic protein–protein interactions in cellular conditions (29, 37, 38). This permits comparison between the binding affinities of cognate (canonical signaling partners) and noncognate (weak or uncharacterized partners)  $G\alpha$  proteins at the same stoichiometric ratios with the GPCR, which is not feasible with other biophysical techniques used in live cells (1, 4, 39, 40). Recent findings with SPASM FRET sensors show a physiologic effect of noncognate G proteins to prime GPCR signaling within the cell (41), demonstrating the importance for probing these noncognate G-protein interactions within the cell.

The key findings from our study are as follows: 1) The  $G\alpha$ peptides assume a small ensemble of unique orientations when coupled to a cognate GPCR. 2) The s-pep binds in a different IC cavity of its cognate GPCR and orients its C terminus toward TM helices 5 and 6 (TM5 and TM6) compared with i-pep and q-pep that orient toward TM2 and IC loop 1 (ICL1). 3) MD simulations of β<sub>2</sub>AR complexed with the noncognate q-pep reveal formation of a transient cavity in the  $\beta_2AR$  IC interface, resembling the stable IC cavity observed in the V<sub>1A</sub>R:q-pep complex. Mutation of the hotspot residues identified for  $G\alpha q$  coupling in  $V_{1A}R$ , into  $\beta_{2A}R$ , stabilizes this transient cavity. We have generated a triple mutant,  $\beta_{2}AR-Q142K^{5.67}-R228I^{5.68}-Q229W^{34.54}$ , that displays dose-dependent, isoproterenol-induced, promiscuity toward  $G\alpha_s$ - and  $G\alpha_q$ -coupled signaling pathways. 4) This promiscuous β<sub>2</sub>AR mutant demonstrates that GPCRs contain defined, latent IC receptor cavities showing weak interactions with noncognate G proteins. These latent cavities can couple to the noncognate G proteins if stabilized with the necessary hotspot residues, through mutagenesis or natural evolution. The promiscuous β<sub>2</sub>AR mutant thus serves as a model system to probe the dynamics of GPCRs exhibiting pluridimensional G-protein coupling. Our dynamics-based framework reveals the structural plasticity of the GPCR cytosolic pocket that underlies G-protein selectivity and the role of noncognate G-protein interactions in influencing GPCR dynamics. Furthermore, this study provides features of the GPCR-G-protein interaction that can be targeted by functionally selective drugs to tune therapeutic response to specific GPCR signaling pathways (42).

## Results

Cognate GPCR-Gα-Protein C Terminus Complexes Reveal Distinct Conformations for  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_q$  Signaling Pairs. We performed atomistic MD simulations and generated a minimum of 1-us ensembles for seven different class A GPCRs bound to full agonists and complexed with each of three  $G\alpha$  peptides (SI) Appendix, Table S1). From the MD data, we detect that s-pep, i-pep, and q-pep insert in distinct cavities within the IC interface of their respective cognate GPCRs (Fig. 1 A and B and SI Appendix, Fig. S1B). The N terminus of the Gα peptides, which protrude out of the GPCR IC cavity, are highly flexible during the MD simulations and normally engaged in intramolecular interactions with the "Ras" domain of the Gα protein (43, 44). Therefore, we omitted the N-terminal region for analysis of receptor-G-protein contacts. The C terminus of the Gα peptides (indicated by "\*", Fig. 1B) insert into the GPCR IC cavity and retain helicity. We have used the axis defined by this helical region of the Gα peptide [Common G-protein Numbering, residues H5.12 to H5.26 (17)] for our analyses of Gα-peptide orientation.

The GPCR conformations shown (Fig. 1A and SI Appendix, Fig. S1B) are the centroid of the most populated conformation cluster from the ensemble of MD trajectories with the cognate  $G\alpha$  peptide bound. The  $G\alpha$ -peptide conformations shown in Fig. 1B, are centroids from the top three populated clusters of

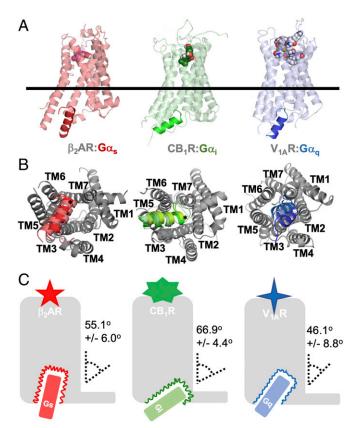


Fig. 1. The s-pep, i-pep, and q-pep reveal distinct binding orientations in GPCR cavity of respective, cognate GPCRs. (A) View of the β<sub>2</sub>AR:s-pep (Left),  $CB_1R:i$ -pep (Center), and  $V_{1A}R:q$ -pep (Right) complexes. Each receptor is shown oriented parallel to the membrane-normal, with a horizontal plane bisecting the TM helices at the vertical center of the protein complex. The orientations of the three bound peptides in their respective cognate receptors vary. (B) IC view of each complex from A. Simulations were clustered by RMSD of the peptide backbone, and the representative conformation of the  $G\alpha$  peptide from the top three clusters is shown for each complex. In this view, we observe distinct differences with the orientation of each peptide, particularly that the C-terminal end of the helical portion of each peptide (denoted by "\*") points toward distinct IC regions of the respective GPCRs. (C) A schematic for each unique GPCR-Gα-peptide complex is shown. The colored wavy line which outlines the receptor IC cavity surrounding the Gα peptide represents the dynamic interface of the GPCR as it contacts and interfaces the G-protein C terminus. We have calculated the insertion angle of the principle axis of the G-protein C terminus with the principle axis of the GPCR and provided this value here. See also SI Appendix, Fig. S1.

these simulations. The central region of all of the three  $G\alpha$ peptides are anchored to TM5 and ICL2 of their given GPCRs. The extreme C termini of i-pep and q-pep orient toward TM2, ICL1, and ICL2 in their cognate GPCRs, while the C terminus of s-pep orients toward an interface between TM6 and TM7 (Fig. 1B and SI Appendix, Fig. S1B). We calculated the insertion of the Gα peptides in their cognate GPCRs as the angle between the principal axis of the GPCR TM core bundle and principal axis of the Gα-protein α5 helix for each cognate GPCR-G-protein simulation. We did the same for the X-ray and cryo-Electron Microscopy (cryo-EM) structures (Fig. 1C and SI Appendix, Fig. S1B and Table S2). The three Gα-protein subtypes show different angles of insertion in the GPCR IC cavity. There is also variation in the insertion angles even among the three Gas coupled receptors studied here. Our previous FRET sensor studies (29, 37) have shown differences in coupling strengths of Gas to  $\beta_2AR$ ,  $\beta_3AR$ , and  $D_1R$  in the order  $\beta_2 AR > \beta_3 AR > D_1 R$ . As shown in *SI Appendix*, Fig. S1C,

speculate that the differences in the  $\alpha 5$ -helix insertion may modulate the strength of interaction between GPCR and  $G\alpha$  peptide.

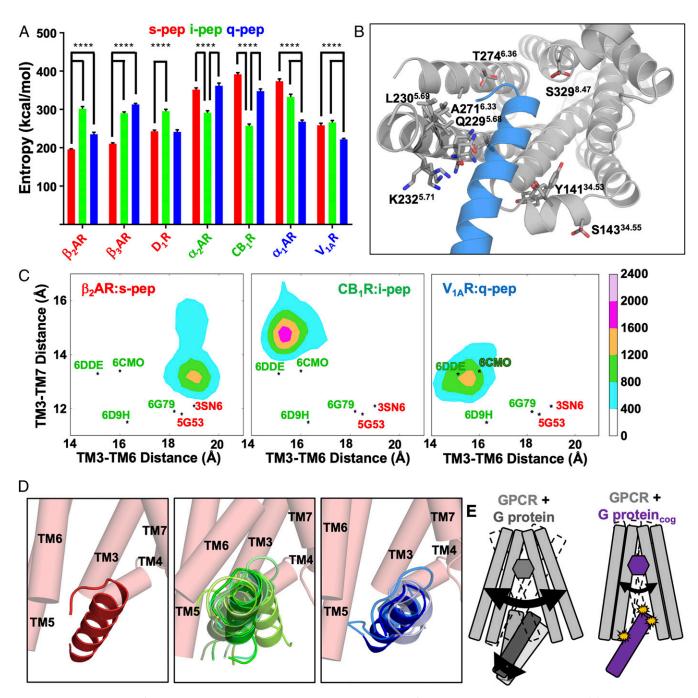


Fig. 2. Dynamic properties of the cognate and noncognate agonist–GPCR– $G\alpha$ -peptide interfaces that stabilize a signaling complex. (A) First-order torsional entropy values calculated at 300 K, using torsion angles distribution for the GPI residues of each GPCR in the presence of cognate and noncognate  $G\alpha$  peptides. Values are shown as means from five replicate simulations  $\pm$  SEM for s-pep (red), i-pep (green), and q-pep (blue). Significance was calculated using two-sided ANOVA; \*\*\*\*P < 0.0001. (B) Visual model of the sampled rotamer conformations for the GPI residues of the  $β_2AR$  with the highest entropy values when bound to noncognate  $G\alpha$  peptides. The spread of sampled rotamer angles is shown in transparent sticks. (C) Population distribution of the MD simulation snapshots for  $β_2AR$ , CB<sub>1</sub>R, and V<sub>1</sub><sub>A</sub>R when bound to their respective agonists and cognate  $G\alpha$  peptides, with respect to interresidue distances between TM3 and TM6, and TM3 and TM7, shown in SI Appendix, Fig. S2A; "\*" denotes the interresidues distances for X-ray and cryo-EM structures, colored as in A, based on G-protein preference: 3SN6- $G\alpha_3$ -bound  $β_2AR$  (red); 5G53-mini- $G\alpha_3$ -bound  $β_2AR$  (red); 6DDE- $G\alpha_i$ -bound μOR (green); 6D9H- $G\alpha_i$ -bound A<sub>1</sub>R (green); 6G79- $G\alpha_0$ -bound 5HT-1BR (green); and 6CMO- $G\alpha_i$ -bound Rhodopsin (green). (D) Representation of centroids from conformational clusters of the cognate and noncognate  $β_3AR$  (shown as pink cylinders). The top clusters making up 85% of the conformational ensemble are shown. The noncognate i-pep (nine clusters, green) and q-pep (three clusters, blue) in  $β_2AR$  show greater flexibility as multiple conformation clusters compared with s-pep (one cluster, red). (E) Model derived from the data in this figure: Both receptor and (cognate and noncognate)  $β_3AR$  show greater flexibility as multiple conformation clusters compared with s-pep (one cluster, red). (E) Model derived from the data in this figure: Both receptor and (cognate and noncognate)  $β_3AR$  showless are highly dynamic

Only Cognate GPCR-G $\alpha$ -Peptide Pairs Stabilize Clamping of GPCR IC Cavity on  $\alpha$ 5 Helix. GPCRs and G proteins cluster in plasma membrane domains (45), inflating the relative concentration of cognate and noncognate G proteins compared with GPCRs (5). Gupte et al. (41) showed that noncognate G proteins can synergize the signaling efficacy of cognate G proteins. To assess how cognate and noncognate G-protein interactions affect the GPCR IC cavity, we calculated the first-order torsional entropy of the GPCR residues which interface the G protein (GPI) (Fig. 2A and SI Appendix, Table S4). A schematic of side-chain conformations of the  $\beta_2AR$  residues with highest entropy is shown (Fig. 2B). The GPI residues show lower entropy when coupled to their cognate G proteins compared with noncognate G proteins. We also observed increased flexibility in the GPCR IC cavity measured as the distance between residues 3.50 and 6.30 (SI Appendix, Fig. S2A) (46) when bound to noncognate G proteins (SI Appendix, Fig. S2B and Table S3). The residue notations shown are the Ballesteros-Weinstein GPCR numbering system (47). The reduced entropy and flexibility of cognate interactions allows the GPCR residues in the IC cavity to form strong enthalpic interactions with the G protein, except in the  $G\alpha_q$ -coupled  $\alpha_{1A}AR$ . We and others have shown, through live-cell coupling data, that  $\alpha_{1A}AR$  interacts promiscuously with all three Gα peptides (29, 48).

The elongation of the interresidue distance between residues 3.50 and 6.30 and the contraction of the residue distance between 3.50 and 7.53 are characteristics of GPCR activation (46, 49, 50) (SI Appendix, Fig. S2A). MD trajectories of  $\beta_2$ AR,  $\beta_3$ AR, and D<sub>1</sub>R complexed with s-pep projected on these two distances show ensembles of states close to the conformation in the crystal structure of β<sub>2</sub>AR with nucleotide-free Gs [Protein Data Bank (PDB) ID code 3SN6] and adenosine 2A Receptor (A<sub>2A</sub>R) bound to mini-Gs protein (PDB ID code 5G53; Fig. 2C and SI Appendix, Fig. S2C). Both  $CB_1R$  and  $V_{1A}R$ , with i-pep and q-pep, respectively (Fig. 2C), show ensembles representing the active state identified in the cryo-EM structures of  $\mu$  Opioid Receptor (µOR) and Rhodopsin with nucleotide-free trimeric Gi (PDB ID codes 6DDE and 6CMO). We also observe that the  $\alpha_{2A}AR$  and  $\alpha_{1A}AR$  both sample active states similar to the  $A_{2A}R$ bound to mini-Gs, Serotonin 1B Receptor (5HT-1B) bound Go protein, and  $\beta_2AR$  bound to nucleotide-free  $G\alpha_s$  (PDB ID codes 5G53, 6G79, and 3SN6). These distances in the X-ray and cryo-EM structures of G-protein-bound class A GPCRs are also shown in SI Appendix, Table S2.

We analyzed the  $G\alpha$ -peptide conformational dynamics by clustering the Gα-peptide MD simulation trajectories using rootmean-square deviation (RMSD) in coordinates. The cognate  $G\alpha$ peptide is stabilized in the majority of the seven GPCRs, revealed by fewer conformational clusters compared with the number of clusters sampled by noncognate  $G\alpha$  peptides (SI *Appendix*, Table S5). In the cognate interaction of  $\beta_2$ AR with the s-pep, >85% of the MD snapshots are located within the top cluster (Fig. 2 D, Left), whereas the noncognate i-pep (green) and q-pep (blue) sample only 30% (top nine clusters to reach >85% population) and 67% (top three clusters to reach >85% population), respectively, of the population within the top cluster (Fig. 2 D, Center and Right). Taken together, these results show that the GPCR clamps tighter on the cognate  $G\alpha$  C terminus, lowering the flexibility, and improves the enthalpic interaction leading to productive signaling (Fig. 2E). The noncognate  $G\alpha$  peptides show high flexibility, show weaker interactions in the GPCR IC cavity, and eventually fall out of the cavity.

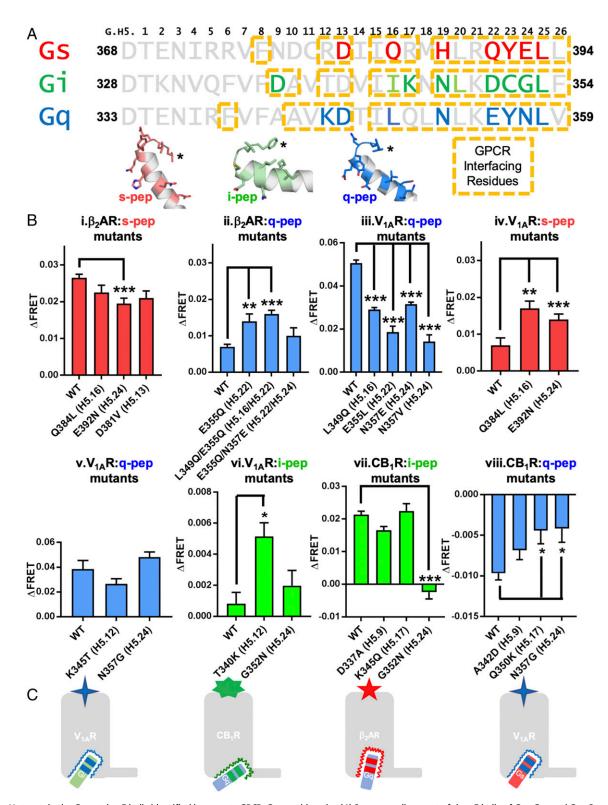
Identifying Amino Acid Hotspots in the C Terminus  $\alpha 5$  Helix That Confer Selectivity to GPCRs. We used an iterative combination of MD simulation analysis and SPASM experiments to identify the amino acid residues in each  $G\alpha$  peptide which confer selectivity to their cognate receptors among the seven studied (SI Appendix, Fig. S3). We identified residues on the  $G\alpha$  peptide that remain in

helical conformation, and show above-average favorable interaction energies and sustained contacts (with >50% frequency) during the dynamics with the GPCR (shown in yellow boxes and bold, colored font, Fig. 3A and Materials and Methods). We observe these predicted selectivity hotspot residues to be both conserved and mutated across the Ga peptides. Where applicable, the hotspot residues were swapped with homologous positions from another  $G\alpha$  peptide, and binding was tested with the cognate GPCRs for both the cognate and mutated noncognate Gα peptides. For the hotspots conserved in both position and sequence across  $G\alpha$  peptides, the residue was mutated to alter amino acid physical characteristics and test disruption in the cognate complex.

We hypothesized that the swapping mutations would enable GPCRs to couple to noncognate Gα peptides with appropriate "cognate-like" swapping mutations. We tested this swapping between s-pep and q-pep and also between i-pep and q-pep using β<sub>2</sub>AR for Gαs coupling, V<sub>1A</sub>R for Gαq coupling, and CB<sub>1</sub>R for Gαi coupling. The mutations were made in SPASM FRET sensor constructs and transiently transfected into HEK-293T cells. FRET ratio is measured as agonist-stimulated minus unstimulated FRET, and comparisons to the wild type (WT) were calculated (SI Ap*pendix*, Table S6). The swapping mutations in the cognate  $G\alpha$ peptides led to significant reduction in FRET intensity changes upon treatment with agonist as shown in Fig. 3 B, i for  $\beta_2AR$  with the q-like mutations in s-pep, Fig. 3 B, iii for  $V_{1A}R$  with s-like mutations in q-pep, Fig. 3 B, vii for CB<sub>1</sub>R with q-like mutations in the i-pep, and Fig. 3 B, v for  $V_{1A}R$  with i-like mutations in q-pep. These results affirm the conclusion that  $G\alpha_s$  residue E392<sub>H5.24</sub>,  $G\alpha_q$  residues L349<sub>H5.16</sub>, E355<sub>H5.22</sub>, and N357<sub>H5.24</sub>, and  $G\alpha_i$  residue  $G352_{H5.24}$  are some of the selectivity hotspot residues. The details of the FRET data are discussed in SI Appendix, Table S6.

We performed reciprocal, gain-of-coupling experiments by introducing cognate hotspot residue mutations into homologous structural positions in noncognate  $G\alpha$  peptides. We performed FRET assays for  $\beta_2$ AR with s-like mutations in q-pep (Fig. 3 B, ii), V<sub>1A</sub>R with q-like mutations in s-pep and also q-like mutations in i-pep (Fig. 3 B, iv and vi), and  $CB_1R$  with i-like mutations in q-pep (Fig. 3 B, viii). These data show that the following residue positions mediate significant increase in G protein coupling to the noncognate GPCR:  $G\alpha_q$  residues E355Q<sub>H5.22</sub>, E355Q<sub>H5.22</sub>/L349Q<sub>H5.16</sub> with  $\beta_2$ AR (Fig. 3 B, ii); G $\alpha_s$  residues Q384L<sub>H5.16</sub>, E392N<sub>H5.24</sub> (Fig. 3 B, iv), and G $\alpha_i$  residue T340K<sub>H5.12</sub> with V<sub>1A</sub>R (Fig. 3 B, vi); and G $\alpha_q$  residues Q350K<sub>H5.17</sub>, N357G<sub>H5.24</sub> with CB<sub>1</sub>R (Fig. 3 B, vii). Taken together, these results show that positions H5.16, H5.22, and H5.24 play a critical role in binding of all three Gα subtypes to their respective GPCRs, with positions H5.12 and H5.17 involved in ancillary roles within the  $G\alpha_i$  and  $G\alpha_q$  interactions. These experiments suggest that the IC cavity of a given GPCR recognizes a small number of critical structural features in the  $\alpha$ 5 helix of the G $\alpha$  protein, and, if these minimal features are present in the correct orientation, the Gα protein can complex with the GPCR. This is exemplified in MD simulations of the β<sub>2</sub>AR with the noncognate q-pep becoming stabilized in the GPCR IC cavity, similar to the cognate s-pep, with the addition of the s-pep H5.16 and H5.22 hotspots (L349Q/E355Q) (Movie S1).

Rational Design of a Promiscuous  $\beta_2AR$   $G\alpha_0$ - and  $G\alpha_s$ -Coupled **Receptor.** Fig. 4A shows the contribution from residues in each TM and ICL region in the  $G\alpha_s$ -,  $G\alpha_i$ -, or  $G\alpha_q$ -coupled receptors toward binding their cognate Gα peptides. The relative sizes of the circles reflect the percentage of total contacts (SI Appendix, Table S7) contributed from the TM or ICL region of the given GPCR. Specifically,  $G\alpha_s$ -coupled receptors interact with the s-pep primarily through contacts on TM3, TM5, and TM6. The i-pep contacts the residues in TM3, TM5, TM6, and ICL2 in the  $G\alpha_i$ coupled receptors. Most contacts in  $G\alpha_q$ -coupled receptors are from



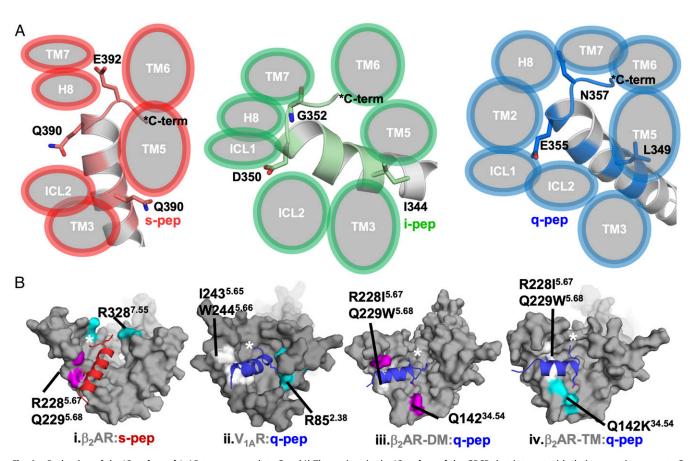
 $\textbf{Fig. 3.} \quad \text{Hotspots in the G-protein $\alpha$5 helix identified in cognate GPCR-$G$\alpha$-peptide pairs. (A) Sequence alignment of the $\alpha$5 helix of $G$\alpha$_{sr}$ $G$\alpha$_{ir}$ and $G$\alpha$_{q}$ C termini. The $G$-protein $G$-protei$ residues on the Ga peptides that make up the GPCR-interfacing residues (based on frequency of interaction) with their cognate receptors are shown in yellow boxes. The significant energetically favorable residue hotspots are marked in bold and colored font in the respective sequences and shown in stick representation in the cartoon of the Gα peptides shown below the alignment. The C termini of the peptides are marked with an asterisk for visual orientation. (B) Selectivity "hotspot" residues predicted from MD simulations were validated in SPASM FRET sensors, by mutating the Ga-peptide residue to a homologous residue of another Gα protein, and testing the interaction of the mutant Gα peptide with the original cognate GPCR (i, iii, v, vii) or the cognate GPCR of the homologous "donor" Gα peptide (ii, iv, vi, viii). (B, iv) Republished with permission of American Society for Biochemistry and Molecular Biology, from ref. 29; permission conveyed through Copyright Clearance Center, Inc. Mean FRET values were compared by one-way ANOVA and Tukey's comparison of means. Significance is denoted as \*P < 0.05, \*\*P < 0.01, \*\*\*P < 0.001. (C) The schematic model depicts that mutations to the selectivity hotspots in the  $\alpha$ 5 helix orient noncognate G $\alpha$  peptides into a cognate-like orientation within a given GPCR, by making the Gα peptide amenable to the GPCR cavity available for binding. See also SI Appendix, Figs. S3 and S4.

TM2, TM3, TM5, TM6, and ICL2. Both  $G\alpha_{i}$ - and  $G\alpha_{q}$ -coupled receptors, but not  $G\alpha_{s}$ -coupled receptors, contact the C terminus of their respective peptides through ICL1 residues. The predicted pairwise interactions between the  $G\alpha$  peptides and their respective cognate GPCRs are given in *SI Appendix*, Table S8.

Similar to the swapping mutations we tested in  $G\alpha$ -peptide hotspots, we predicted GPCR hotspot swapping mutations to allow promiscuous coupling of  $\beta_2AR$  to  $G\alpha q$ . We observed that the residues Q384(s-pep)/L349(q-pep) (H5.16) make sustained interactions with Q229<sup>5.68</sup> ( $\beta_2AR$ )/W244<sup>5.66</sup> ( $V_{1A}R$ ), respectively (Fig. 4 B, i and ii). Although Q384(s-pep)/L349(q-pep) interact with residues on TM5 in both  $\beta_2AR$  and  $V_{1A}R$ , the hydrophilic interaction pair in  $\beta_2AR$ :s-pep is swapped to a hydrophobic interaction pair in  $V_{1A}R$ :q-pep (Fig. 4 B, i and ii), suggesting that this interaction pair could be a selectivity filter. To further strengthen the binding and coupling of  $G\alpha q$  to  $\beta_2AR$  in the TM5 region, we proposed the double mutant  $R2281^{5.67}$ –Q229W<sup>5.68</sup>. The C terminus residue  $E392_{H5.24}$  orients the s-pep toward the basic residue patch  $K270^{6.33}$ ,  $R328^{7.55}$ , and  $R333^{8.51}$  located between TM6 and TM7. The  $E355_{H5.22}$  residue in q-pep orients the C terminus toward ICL1/TM2, interacting with  $R81^{ICL1}$ ,  $K82^{ICL1}$ ,  $T83^{ICL1}$ ,  $T83^{ICL1$ 

our hypothesis that GPCRs may couple to different  $G\alpha$  proteins with different interfaces, but the interfaces for the noncognate G proteins could be latent cavities with weak interactions. We predicted that mutations of the  $\beta_2AR$  TM5 interface that mimic  $V_{1A}R$  may stabilize the short-lived  $V_{1A}R$ :q-pep—like orientation observed in  $\beta_2AR$ :q-pep. We expressed and tested a  $\beta_2AR$ -R228l<sup>5.67</sup>-Q229W<sup>5.68</sup> ( $\beta_2AR$ -DM) construct which produced an IP-1 signal about threefold greater than WT  $\beta_2AR$  (Fig. 5 A, Left). We also measured cAMP activity from the double-mutant construct, which showed a nonsignificant reduction in the  $G\alpha_s$  pathway activity (Fig. 5 A, Right). This result suggests that the  $\beta_2AR$ -DM does complex with  $G\alpha_g$  protein, and also with  $G\alpha_s$  but with less coupling strength.

MD simulations of the q-pep bound to  $β_2AR$ -DM:q-pep were started from a  $Gα_q$ -like and  $Gα_s$ -like orientation. Results show favorable interaction in the  $Gα_q$ -like orientation (Fig. 4 B, iii), with E355<sub>H5.22</sub> of q-pep stably binding to Q142<sup>34.54</sup> in  $β_2AR$ -DM. We predicted that a third mutation of Q142<sup>34.54</sup> to lysine in  $β_2AR$ -DM would further strengthen the q-pep interaction with  $β_2AR$  in  $Gα_q$ -like orientation. As predicted, the triple mutant  $β_2AR$ -Q142 $K^{34.54}$ -R228 $I^{5.67}$ -Q229 $I^{5.68}$  simulations showed q-pep binding in a similar interface to q-pep in  $V_{1A}R$ :q-pep (Fig. 4  $I^{5.67}$ ). Agonist-induced IP-1 production significantly increased in the triple mutant compared with WT  $β_2AR$  (Fig. 5  $I^{5.67}$ ). Measurement of agonist-induced cAMP showed a significant reduction in the triple mutant compared with WT  $β_2AR$  (Fig. 5  $I^{5.67}$ ). We



**Fig. 4.** Reshaping of the IC surface of  $β_2AR$  to accommodate  $Gα_q$ . (A) The regions in the IC surface of the GPCR that interact with their respective cognate G peptides, as calculated from the MD simulation trajectories. The size of the circles shows the level of interaction with that particular TM helix. The larger the circle, the more favorable and stronger is the interaction with the receptor. The s-pep interaction with IC region of  $β_2AR$  is shown in red, i-pep interaction with the CB<sub>1</sub>R is shown in green, and q-pep interaction with V<sub>1A</sub>R is shown in blue. The peptides are shown in cartoon representation. The C termini of the Gα peptides are indicated by an asterisk in the figure. (β) (i) The orientation of binding of the s-pep (red cartoon) in  $β_2AR$ . Residues R228<sup>5.67</sup> and Q229<sup>5.68</sup> anchor H5.16 of s-pep to TM5, while R328<sup>7.55</sup> draws the C terminus (H5.24) toward TM6 and TM7. (ii) The corresponding q-pep (blue cartoon) H5.16 anchoring residues in TM5 are W244<sup>5.66</sup> and I243<sup>5.65</sup> in V<sub>1A</sub>R, and the R85<sup>2.38</sup> residue draws the C terminus (H5.22) of q-pep toward ICL1 and TM2. (iii) The q-pep orientation in the double-mutant  $β_2AR$ -R228I-Q229W. (iv) The q-pep-bound triple-mutant  $β_2AR$ -Q142K-R228I-Q229W shows the same orientation as the q-pep in V<sub>1A</sub>R.

tested whether Gα<sub>i</sub> signaling played a role in this decreased cAMP activity, but assays suggest this effect is insensitive to pertussis toxin (SI Appendix, Fig. S3C). Additionally, the dynamics of the triple mutant  $\beta_2$ AR:s-pep does not show lowering in s-pep binding (SI Appendix, Fig. S4D). We observe E225<sup>5.64</sup> in the triple-mutant  $\beta_2$ AR complementing the Q384<sub>H5.16</sub>, and the E392<sub>H5.24</sub> hotspot shows orientation to the TM6/TM7 region where it maintains contact with K270<sup>6.32</sup>, R328<sup>7.55</sup>, and R333<sup>8.51</sup>. Dose–response curves reveal how the triple mutation in  $\beta_2$ AR affects the potency and efficacy for the  $G\alpha_q$  and  $G\alpha_s$  interactions. For the  $G\alpha_q$  pathway, we observe a reduction in the EC<sub>50</sub> of isoproterenol from 2.97  $\mu$ M to 17.00 nM in the production of IP-1 by the  $\beta_2AR$  triple mutant, and approximately fourfold increase in overall efficacy (Fig. 5 B, Left). In the  $G\alpha_s$ pathway, the EC<sub>50</sub> of isoproterenol for cAMP production increased from 0.28 nM in the WT to 55.13 nM in the triple mutant, with approximately threefold reduction in overall efficacy (Fig. 5 B, Right).

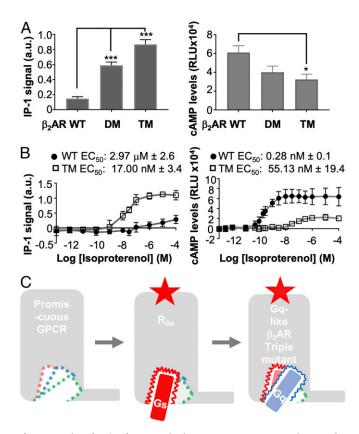


Fig. 5. Tuning the  $G\alpha_{\alpha}$  latent cavity in  $\beta_2AR$  generates a promiscuous signaling receptor. (A) Secondary messengers IP-1 and cAMP production in cells showing that the triple-mutant β<sub>2</sub>AR-Q142K-R228I-Q229W and doublemutant  $\beta_2 AR\text{-R228I-Q229W}$  efficiently couples to both  $G\alpha_q$  and  $G\alpha_s$  in the cell. Significance is denoted as \*P < 0.05, \*\*\*P < 0.001. (B) Dose-response curves for WT  $\beta_2$ AR and triple mutant ( $\beta_2$ AR–Q142K–R228I–Q229W) denoted as TM in this figure for brevity. IP-1 dose response curve for WT (circle markers) vs. triple mutant (square markers). EC<sub>50</sub> values were calculated for each replicate (n = 3) and the mean values for IP-1 EC<sub>50</sub>  $\pm$  SEM are reported on the graph for WT (circles; mean EC50: 2.97  $\mu M$   $\pm$  2.6) and triple mutant (squares; mean EC<sub>50</sub>: 17.00 nM  $\pm$  3.4). cAMP dose-response curve for WT (circles) vs. triple mutant (squares). EC<sub>50</sub> values were calculated for each replicate (n=4) and the mean values for cAMP EC<sub>50</sub>  $\pm$  SEM are reported on the graph for WT (circles; mean EC<sub>50</sub>: 0.28 nM  $\pm$  0.1) and triple mutant (squares; mean EC<sub>50</sub>: 55.13 nM  $\pm$  19.4). (C) Model showing that GPCRs have latent cavities to fit  $G\alpha_s$ ,  $G\alpha_i$  and  $G\alpha_q$  proteins. A  $G\alpha_s$ -coupled receptor shows a deep attractive binding cavity for s-pep, while the latent binding cavities of  $G\alpha_{\mathbf{q}}$  and  $G\alpha_{i}$  are shallow. Engineering the appropriate mutations, predicted from MD simulations, reshapes the IC surface in triple-mutant  $\beta_2AR$ , making it promiscuous to  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_g$ .

We summarize the results from these data in a model (Fig. 5C). We propose that GPCRs have latent cavities within their IC surface to bind different G proteins. The cavity in which the cognate G protein binds is attractive, with enthalpically favorable hotspots that lower the entropy of the complex and stabilize the agonist-bound GPCR interaction with the cognate G protein. Although GPCRs possess latent cavities for noncognate G proteins, the cavities are dynamic and unable to stabilize the noncognate G proteins, since they lack affinity. Promiscuous GPCRs have hotspot residues in the respective G-protein binding cavities that make them attractive to multiple G proteins. We note that possible selectivity hotspots outside of the G $\alpha$ -protein C terminus have not been probed in this study.

Dynamic Reshaping of the IC Cavity in  $\beta_2AR$ . MD results suggest that the triple-mutant undergoes dynamic reshaping of the IC cavity to bind both  $G\alpha_s$  and  $G\alpha_q$  proteins. MD simulations of the triplemutant  $\beta_2 AR$  coupled to s-pep and q-pep started from both  $G\alpha_s$ like and  $G\alpha_q$ -like orientations revealed s-pep only binds in the  $G\alpha_s$ -like cavity, and q-pep only binds in the  $G\alpha_q$ -like cavity (Fig. 6A, i and ii). The  $G\alpha_s$ -interacting hotspots are shown as salmoncolored surface and span TM5, TM6, and TM7 and helix 8, with strongest interacting residues shown as spheres (Fig. 6A, i). The residues that make contact with the q-pep are shown in blue surface, with the strongest interacting positions shown as blue spheres (Fig. 6 A, ii). The  $G\alpha_{o}$ -interacting residues projected on the IC surface of s-pep-bound WT  $\beta_2AR$  show that  $G\alpha_q$ -interacting residues are spread out and form a dispersed cavity when  $G\alpha_s$  is bound (Fig. 6 A, iii). In the triple-mutant, the IC surface reshapes and positions the  $G\alpha_q$ -interacting residues into a trident-like pattern spanning the IC portions of TM3, TM5, and TM6 and ICL1 and ICL2 (Fig. 6 A, iv). We projected this dynamic cavity on the interresidue distances between TM3 and TM6 and between TM3 and TM7, and we observe that WT  $\beta_2AR$ :q-pep samples a  $\beta_2AR$  cavity similar to the  $G\alpha_s$ -bound crystal structure. This suggests that the lack of q-pep stabilizing hotspots prevents the stabilization of the  $\beta_2AR$  conformation observed in the triple-mutant complex wth q-pep (Fig. 6 B, Left). The q-pep interaction in the triple mutant shows a very distinct conformation, with a narrower cavity between TM3 and TM6 and a slightly wider cavity between TM3 and TM7. This shrinking of the TM3 to TM6 distance is similar to that observed in the interaction of WT  $\beta_2$ AR with the Gai protein in previous MD simulations (51). The  $\beta_2AR$  conformation sampled by the triple mutant with s-pep is similar to that sampled by WT  $\beta_2$ AR:s-pep (Fig. 2B), but the most populated conformational cluster shifts to a smaller TM3 to TM7 distance compared with WT  $\beta_2$ AR.

### Discussion

The 3D structures of GPCR-G-protein complexes predominantly inform us on how cognate G proteins interact with GPCRs in the nucleotide-free state. The dynamics of the agonistbound GPCR has been well characterized by spectroscopic and computational studies (30-32, 52-55). However, the dynamics of the GPCRs with their cognate and, especially, noncognate G proteins is poorly understood, despite their relevance in cellular conditions (1, 5). Our study combining MD simulations and FRET sensor measurements has yielded the following conceptual advancements: 1) Agonist-bound and G-protein-bound GPCRs contain multiple latent IC cavities, which were not formerly characterized. The cognate and noncognate G proteins interact dynamically with their latent cavities with varying strengths. 2) The C terminus of  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_q$  proteins assume a small ensemble of unique orientations when coupled to their cognate GPCRs. This ensemble explains the variations observed in the coupling strengths of the same G protein to different GPCRs. 3) Engineering the latent cavities with hotspots



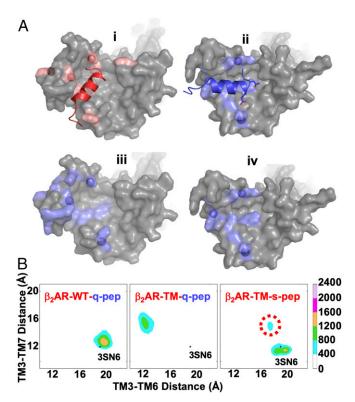


Fig. 6. Dynamic reshaping of the  $G\alpha_q$  cavity in a  $G\alpha_s$ -coupled receptor mutant: making  $\beta_2AR$  promiscuous toward  $G\alpha_a$  and  $G\alpha_s$ . (A) (i) The IC surface rendering of WT β<sub>2</sub>AR with the residues involved in binding of s-pep shown in red surface. The bright red spheres are the residues that interact strongly with the s-pep. (ii) MD simulations of the triple-mutant β<sub>2</sub>AR-Q142K-R228I-Q229W (denoted as  $\beta_2AR$ -TM in the figure for brevity) shows formation of a favorable  $G\alpha_0$ -like cavity with q-peptide wedged. (iii) This is the surface of the residues shown in ii when projected on the IC surface of WT  $\beta_2$ AR. This surface shows that the residues that should form a favorable cavity for  $G\alpha_q$ are spread out in the WT  $\beta_2 AR. \mbox{ (iv)}$  MD simulations of the double mutant of  $\beta_2AR$  show reshaping of these residues in iii to form a "trident"-like pattern. These are representative snapshots taken from the most populated conformation cluster from the MD simulations. (B) Ensemble of conformations from MD simulations projected on the interresidue distances between TM3 and TM6 (distance between  $C\alpha$  atoms of residues 3.50 and 6.30) and between TM3 and TM7 (distance between  $C\alpha$  atoms of 7.53 and 3.50) for WT  $\beta_2AR$  with q-pep (Left),  $\beta_2AR$  triple mutant with q-pep (Center), and  $\beta_2AR$ triple mutant with s-pep (Right).

to the noncognate G proteins tunes the promiscuity of the GPCR. Using the hotspot residues identified for coupling of  $G\alpha_s$ ,  $G\alpha_i$ , and  $G\alpha_q$  proteins to their respective cognate GPCRs, we have tuned a latent  $G\alpha_q$ -binding cavity in  $\beta_2AR$  to additionally bind and signal through  $G\alpha_q$ - This promiscuous triple mutant  $\beta_2AR$  demonstrates the tunability of G-protein selectivity in GPCRs.

G-protein selectivity likely arises from 1) several kinetic steps involved in going from engaging the G protein in the GDP-bound state and transitioning to the nucleotide-free state and 2) the relative thermodynamic stabilities of various conformational states involved in these kinetic steps (56). Our study probes the relative thermodynamic stabilities of the agonist–GPCR–G $\alpha$ -peptide complexes for the cognate and noncognate G $\alpha$  peptides in the presence of the same agonist. Previous studies showed that agonist binding results in increased conformational heterogeneity (30–32, 57) in  $\beta_2$ AR (R+Ag; Fig. 7B). Pushing this further, our study shows that G-protein insertion, be it cognate or noncognate, leads to dynamic conformational heterogeneity in the GPCR IC cavity (R+Ag+G) and to a moderate entropic stabilization (Fig. 7B). Importantly, the GPCR cytosolic pocket continues to exhibit

a high degree of structural plasticity, and the cognate G protein reduces the entropy of residues in the GPCR cavity (Fig. 2A), stabilizing the receptor and enabling it to clamp down on the Gα C terminus (SI Appendix, Fig. S2B). The presence of enthalpically favorable intermolecular contacts between the cognate G protein and its preferred cavity leads to full complexation and productive signaling (Fig. 7 A, iii and Fig. 7B). In contrast, the weak interactions between the GPCR cavity and noncognate G proteins result in the dissociation of Gα C terminus without productive complexation and signaling (Fig. 7 A, iv). Incorporation of single G-protein-selective residues in the latent cavities, whether by evolution or engineering, is sufficient to reshape the GPCR IC surface for productive coupling with the noncognate G proteins. We hypothesize that promiscuously coupling GPCRs evolved to make these latent cavities highly attractive, while selective GPCRs are under evolutionary pressure to optimize the affinity between one cognate G protein and cavity.

One of the caveats of this study is our focus on only the C terminus of the G protein. The  $G\alpha$  C terminus is a known determinant of G-protein selectivity, and it has long been established that swapping the last three amino acids between the  $G\alpha_i$  and  $G\alpha_q$  isoforms is sufficient to confer promiscuous signaling from chimeric G proteins in HEK293 cells (28). Our focus on GPCR–G $\alpha$  C terminus interactions prevents confounding effects from the integration of signaling downstream of endogenous and chimeric G proteins. Nonetheless, we acknowledge that other regions are likely involved in G-protein selectivity. Another caveat is that many of our MD simulations were started from a homology model of the receptor–G $\alpha$ -peptide complex. The accuracy of our dynamics and hotspot predictions will be enhanced as more structures of the GPCR–G-protein complexes emerge in literature.

This study fills the knowledge gap in linking the dynamics of ligand—GPCR complexes to the dynamics of G-protein coupling and provides a framework to interpret variance in the strength of interaction between different GPCRs and G proteins.

### **Materials and Methods**

Modeling of the GPCRs and Agonists. The summarized modeling details are given in *SI Appendix*, Table S1. Structures of the GPCRs studied were modeled based on homology to either  $β_2AR$ , μOR, or CB $_1R$  templates. The models were then aligned to the active states of  $β_2AR$  or Rhodopsin in the 3SN6 and 4J4Q PDB structures. Gα peptides were modeled using the α5 helix of Gα $_5$  in 3SN6, and then aligned to the α5 helix of Gα $_5$  or transducin in 3SN6 and 4J4Q. Structures were minimized using the MacroModel [Schrödinger Release 2015-4: MacroModel (2015); Schrödinger, LLC] application before simulation with Groningen Machine for Chemical Simulations (GROMACS). For more details, please see *SI Appendix*.

**Details of MD Simulations.** MD simulations were performed in explicit POPC lipid bilayer and water using gromos 53a6 force field and following a standard protocol for GPCRs used in our laboratory (29). Details are in *SI Appendix*.

Computational Data Analysis. One-microsecond ensemble trajectories were used for analyzing intermolecular contacts and interaction energies for GPCR–peptide pairs. Individual energies were calculated for each amino acid of the G $\alpha$  peptides with the entire GPCR using the GROMACS "energy" application. The total nonbond energy from short-range (within 12 Å) coulombic and van der Waals forces was extracted from an energy log file and summed for the total nonbond interaction energy. G $\alpha$ -peptide residues showing above-average interaction energy (Fig. 3A) are considered critical residues and potential "hotspots." Intermolecular contacts were calculated in Visual Molecular Dynamics (VMD) using Tcl scripts to identify the frequency of pairwise interactions within 5 Å between peptides and receptors. Contacts made with greater than or equal to 50% frequency were deemed critical contacts. Peptide residues deemed "critical" from both interaction energy and intermolecular contact analysis were strongly considered for their role as "hotspots" for G-protein selectivity.

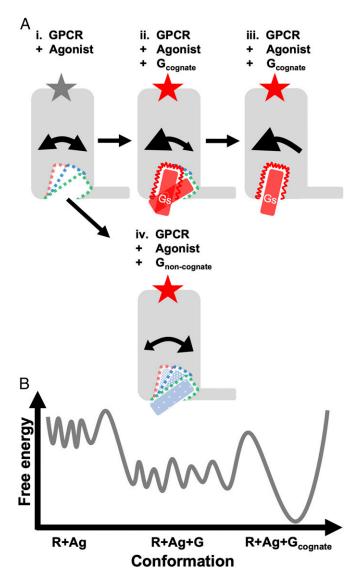


Fig. 7. The Goldilocks Effect: Cognate peptides fit "just right" for productive activation and signaling. (A) A model of the dynamics of the GPCR IC cavity and the C terminus of the G $\alpha$  proteins, cognate and noncognate, complexed with an agonist-bound GPCR. Double-sided curved arrows are drawn to show (i) balanced dynamic movement of GPCR TM bundle and G $\alpha$  C terminus between the dominant and latent cavities in the IC interface during the apo state, (ii) or skewed toward the dominant cavity upon initial complexation with cognate G protein, and (iv) skewed to the latent cavity upon complexing with a noncognate G protein. (iii) Strong, unidirectional arrows reveal stabilization of the dominant cavity during G-protein activation. (B) Schematic free-energy landscape describes the relative stability of the GPCR during agonist binding, transient interaction with G proteins, and full complexation with a cognate G protein.

Calculation of first-order torsional entropy. The first-order torsional entropy of the G-protein interacting residues shown in Fig. 2A was calculated using methods developed in-house (30). Further details of this analysis can be found in SI Appendix.

Calculation of the insertion angles of the G protein. We measured the angle between the principal axis of the helical portion of the  $G\alpha$  peptide (H5.13-H5.23) and the principal axis of the GPCR TM bundle, for each frame of the trajectory. The angle  $\theta$  was calculated from the dot product of these vectors using  $\mathbf{a} \cdot \mathbf{b} = \|\mathbf{a}\| \|\mathbf{b}\| \cos \theta$ .

Calculation of GPCR IC cavity width and active-state complex metrics. To measure the conformational flexibility in the IC cavity of the receptor, we measured the distance between  $C\alpha$  atoms of the residues 3.50 and 6.30 for each receptor (numbers shown using Ballesteros—Weinstein numbering system). The distance

between the residues in this pair is used as a standard indicator of receptor activation state (46). We also measured the distance between the  $C\alpha$  atoms of the residues 3.50 and 7.53 as another indication of receptor activation state. Conformational clustering method. RMSD clustering in coordinates was used to determine the number of conformational clusters sampled by  $G\alpha$  peptides within the 1-µs ensemble of simulations.  $C\alpha$  atoms from the GPCR TMs were aligned for the least-squares fit to serve as a frame of reference for comparing peptide orientations based on the backbone atoms of  $G\alpha$ -peptide positions H5.12 to H5.26. The aligned  $G\alpha$ -peptide conformations were clustered using the "gromos" method in the GROMACS "cluster" application, with a cutoff of 2 Å (58). This procedure identifies the centroid with the largest number of neighboring structures within the cutoff distance and sorts them to a unique cluster, repeating the same procedure with the remaining, unsorted structures.

Statistical analysis. The mean  $\pm$  SEM was determined from each of five 200-ns replicates of the 1- $\mu$ s ensemble trajectory. Means were compared using one-way ANOVA followed by Tukey's posttest to assess significance for multiple comparisons, using GraphPad Prism version 7.00 for Windows (GraphPad Software, https://www.graphpad.com) (Fig. 2A and SI Appendix, Fig. S4A). The Kolmogorov–Smirnov test statistic was calculated for each distribution of GPCR IC cavity width (TM3 to TM6 distances), to compare the variance of each distribution (59). The sample size of the distribution was calculated as 50,000 frames. Each comparison rejected the null hypothesis, and P values were too small to be calculated, due to limitations of machine precision (limited to  $2.2 \times 10^{-16}$ ), but all P values for each comparison were significantly less than  $1.0 \times 10^{-4}$  (SI Appendix, Fig. S2B and Table S3).

### **Experimental Methods**

Experiments were conducted similarly to procedures outlined in our previous study (29). Details of "Reagents and buffers," "Molecular cloning," and "Mammalian cell preparation and sensor expression" are found in *SI Appendix*.

cAMP Assays. HEK293T-Flp-in cells were transiently transfected (XtremeGENE HP) according to manufacturer's instructions. Where indicated, 10 h after transfection, cells were incubated with 100 ng·mL<sup>-1</sup> pertussis toxin (PTX) for 20 h. Between 28 h and 32 h posttransfection, (XtremeGENE HP) HEK293T cells expressing indicated sensor were harvested to assess cAMP levels using the bioluminescent cAMP Glo assay (Promega). Cells were gently suspended in their original media, were counted using a hemocytometer, and were spun down (350  $\times$  g, 3 min). Cells were resuspended in an appropriate volume of PBS (pH 7.4; Gibco) supplemented with 800 µM ascorbic acid and 0.2% dextrose (wt/vol) to reach  $4 \times 10^6$  cells/mL density. Cell suspensions were aliquoted into 384-well opaque plates. To assess Emax for cAMP production, cells were incubated with 100  $\mu M$  of isoproterenol for 15 min at 37 °C. For dose–response curves, cells were incubated under the same conditions with a range of isoproterenol concentrations from 100 fM to 100  $\mu$ M. Subsequently, cells were lysed and the protocol was followed according to the manufacturer's recommendation (Promega). Luminescence was measured using a microplate luminometer reader (SpectraMax M5e; Molecular Devices). The cAMP levels (relative luminescence unit) were evaluated by subtracting the isoproterenol conditions from the untreated conditions. Each experiment had four technical repeats per condition and was independently repeated at least three times (n > 3). To obtain EC<sub>50</sub> and Emax, dose–response data were fit to a sigmoidal dose-response equation using nonlinear least-squares regression.

IP-1 Assays. At 28 h to 32 h posttransfection, (XtremeGENE HP) HEK293T cells expressing the indicated sensor were harvested to assess IP-1 levels using the IP-One HTRF assay kit (Cisbio). Cells were gently suspended in their original media, counted using a hemocytometer, and spun down (350  $\times$  g, 3 min). An appropriate volume of StimB buffer (CisBio: 10 mM Hepes, 1 mM CaCl2, 0.5 mM MgCl2, 4.2 mM KCl, 146 mM NaCl, 5.5 mM glucose, 50 mM LiCl, pH 7.4) was added to reach 3  $\times\,10^6$  cells/mL density. Cells were incubated with 100  $\mu M$ isoproterenol at 37 °C for 120 min. For dose-response curves, cells were incubated under the same conditions with a range of isoproterenol concentrations from 100 fM to 100 µM. Following the manufacturer's protocol, each reaction suspension was then incubated for 1 h shaking (500 rpm) at room temperature with 15  $\mu L$  of IP-1 conjugated to d2 dye and 15  $\mu L$  of terbium cryptate-labeled anti-IP-1 monoclonal antibody prepared and stored as recommended by the manufacturer. IP-1 FRET spectra were collected by exciting samples at 340 nm (band-pass 15 nm). Emission counts were recorded from 600 nm to 700 nm (band-pass 10 nm) using a long-pass 475-nm filter (FSQ GG475; Newport). Raw IP-1 signal was calculated from the 665 nm to 620 nm ratio. Data are presented as a change in raw IP-1 ratio following drug treatment. Each experiment had four repeats per condition and was independently repeated at least three times (n > 3). To obtain EC<sub>50</sub> and Emax, dose–response

data were fit to a sigmoidal dose–response equation using nonlinear least-squares regression. Compared with the cAMP data, the IP-1 data were better explained by fitting to a dose–response model ( $\Sigma$ Residuals<sup>2</sup> = 0.01) than by fitting to a linear model ( $\Sigma$ Residuals<sup>2</sup> = 0.05).

**Statistical Analysis.** Data are expressed as mean values  $\pm$  SEM. Experiments were independently conducted at least three times, with three to six technical repeats per condition (n > 3). Statistical analysis was performed using GraphPad Prism 7.0c (GraphPad Software, Inc.). Statistical significance was performed for individual experiments using paired Student's t test. To assess

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how the data varied across experimental repeats, data were pooled, and paired or unpaired Student's t tests were conducted to evaluate significance. One-way ANOVA with a Tukey's posttest was performed to assess significance when evaluating comparisons between multiple conditions (Figs. 3B and 5A) with P values  $*P \leq 0.05$ ;  $**P \leq 0.01$ ;  $***P \leq 0.001$ ; and  $****P \leq 0.0001$ .

**ACKNOWLEDGMENTS.** Research in this publication is supported by Grant NIH-R01GM117923 (to N.V. and S.S.) and Maximizing Investigator Research Award Grant NIH-R35GM126940 (to S.S.).

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