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Binding modes and selectivity of cannabinoid 1 (CB1) and cannabinoid 2 (CB2) receptor ligands

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Abstract

The cannabinoid (CB) receptors (CB₁R and CB₂R) represent a promising therapeutic target for several indications such as nociception and obesity. The ligands with non-selectivity can be traced to the high similarity in the binding sites of both cannabinoid receptors. Therefore, the need for selectivity, potency, and G-protein coupling bias has further complicated the design of desired compounds. Currently studied cannabinoid agonists seldomly investigate their bias, and those that do exhibit bias are typically non-selective. However, certain long-chain endocannabinoids represent a class of selective and potent CB₁R agonists. The binding mode for this class of compounds has remained elusive, limiting the implementation of its binding features to currently studied agonists. Hence, in the present study, the binding poses for these long-chain cannabinoids, along with other interesting ligands, with the receptors have been determined, by using a combination of molecular docking and molecular dynamics (MD) simulations along with molecular mechanics-Poisson-Boltzmann surface area (MM-PBSA) binding free energy calculations. The binding poses for the long-chain cannabinoids implicate that a site surrounded by the transmembrane (TM)2, TM7, and extracellular loop (ECL)2 is vital for providing the long-chain ligands with the selectivity for CB₁R, especially I267 of CB₁R (corresponding to L182 of

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Author Contributions

J.-F.Y. and A.H.W. performed computational experiments, analyzed the data, and drafted the manuscript; N.R.P., P.L.P., and P.A.C. analyzed the data; C.-G.Z. designed the computational experiments, analyzed the data, and finalized the manuscript.

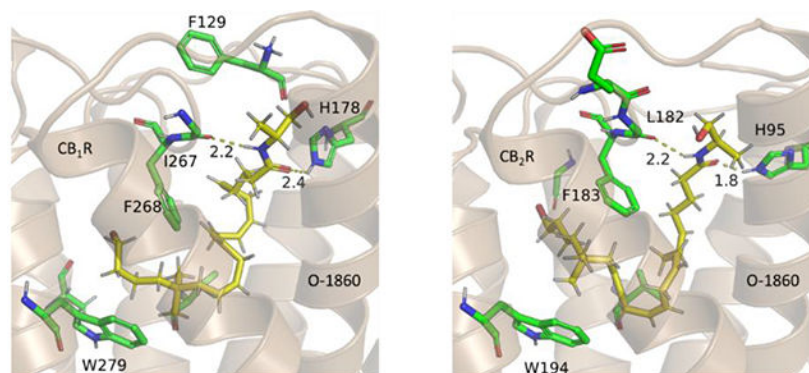
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Supporting Information

Additional figures for the sequence alignment of human, mouse, and rat CB receptors, the correction of MM-PBSA binding free energies with the corresponding experimental binding free energies for the long-chain ligands, and the modeled binding structures of CB₁R and CB₂R with various ligands.

CB₂R). Based on the obtained binding modes, the calculated relative binding free energies and selectivity are all in good agreement with the corresponding experimental data, suggesting that the determined binding poses are reasonable. The computational strategy used in this study may also prove fruitful in applications with other GPCRs or membrane-bound proteins.

Graphical Abstract



Keywords

Cannabinoid receptor; selectivity; endocannabinoid; drug design strategy; modeling

Introduction

G-protein coupled receptors (GPCRs) are a well-studied class of proteins, with significant viability as therapeutic targets due to their functions in critical physiological pathways.¹ Currently, there are over four hundred approved drugs targeting these receptors, with over a hundred targets represented amongst them.¹ The cannabinoid (CB) receptors are a subset of the GPCRs, consisting of seven transmembrane (TM) regions divided into two subtypes: CB₁ receptor (CB₁R) and CB₂ receptor (CB₂R). Each of these subtypes has characteristic functions related to their distribution in the body. While both CB₁R and CB₂R are found within the brain, CB₂R is additionally expressed in the periphery, most prominently within the spleen.² These receptors' primary function within the body is the regulation of adenylyl cyclase, which is implicated in nociception.³⁻⁶ This implication has led to a levy of studies performed to determine the cannabinoids' abilities to produce analgesic effects as a potential replacement for non-steroidal anti-inflammatory drugs (NSAIDs) and opioids, which both come with a set of noxious side effects.^{4, 5, 7-14} Additionally, the knock-out (KO) of CB₁R has been implicated in the protection against obesity due to the CB receptors' functions in regulating metabolism.¹⁵ These relationships have made the CB receptors a promising target for several therapeutic indications. However, there has yet to be an FDA-approved selective cannabinoid agonist for either CB₁R or CB₂R, an advantageous property that would allow for the limiting of off target effects induced by these previously approved non-selective therapeutics.^{16, 17}

Current drug design targeting CB₁R or CB₂R primarily falls within the small-molecule space, with the molecules studied utilizing the same binding site as the phytocannabinoid

class, *e.g.* (-)-*trans*-⁹-tetrahydrocannabinol (THC), cannabidiol (CBD), and cannabigerol (CBG).¹⁸ This binding site has been studied extensively and has previously had several star compounds (*e.g.* rimonabant and WIN-55,212) tailored to it.¹⁹⁻²² While the cannabinoid agonists targeting this site can exhibit high potency towards the CB receptors, many are ultimately unable to exhibit high selectivity towards either receptor.^{23, 24} Interestingly, the endogenous cannabinoids (endocannabinoids) with a long carbon chain structural scaffold (Figure 1) exhibit considerable selectivity towards CB₁R, with comparable potency to many of these previously reported compounds.^{18, 25, 26} With minimal modifications to these endogenous ligands, analogs of these endocannabinoids exhibit greater selectivity and potency than their precursors (Figure 1).²⁷ However, these long-chain ligands have been far less studied concerning their potential as CB receptor agonist therapeutics in comparison to compounds with structural similarity to the phytocannabinoids. The indole quinuclidinone (IQD) compounds, PNR-4-20 and PNR-4-02, were the only reported G-protein biased agonists of CB₂R (Figure 2).²⁸ Incorporating the binding modes of these long-chain endocannabinoids with the recently published new agonists, including a G-protein biased agonist, could be a viable path towards the rational design of the desirable CB₁R-specific and G-protein biased agonists.²⁹⁻³³ Hence, it is crucial for rational design of CB₁R-specific ligands to first determine how these compounds (Figure 1 and 2) bind with both CB₁R and CB₂R and to understand the nature of their selectivity.

There have been various reports of computational and experimental studies on CB₁R and CB₂R binding with various ligands. Reported cryogenic electron microscopy (Cryo-EM) structures of CB₁R or CB₂R binding with ligands revealed a commonly available binding site, *i.e.* the phytocannabinoid binding site, for a few ligands examined so far.^{21, 22, 34-37} Previously reported computational studies have been focused on the phytocannabinoid binding site.^{19, 20, 22, 38-40} None of the previously reported computational studies examined the possible binding poses of the IQD series of compounds (Figure 2), and there have been few reports concerning the binding poses of the long-chain endocannabinoids.^{19, 20, 22}

Particularly, studies concerning the long-chain endocannabinoids and their analogs have primarily been *in vitro* based, using structure-activity relationships (SAR) to discover productive modification for these agonists.^{25, 27, 41-43} Through these studies, several important factors have been determined such as the necessary aliphatic chain length for CB₁R binding, and the importance of double bonds within the aliphatic chain.⁴¹ Previous *in silico* attempts at explaining the binding mode of these compounds have relied on homology-based methods of the cannabinoid receptors which were inaccurate in comparison to the recently published structures.⁴⁴ One attempt to elucidate the binding mode of these endocannabinoids came from McAllister *et al.* which proposed a folded anandamide structure within a homology-modeled CB₁R.⁴⁴ Similar binding mode was also reported by other groups using molecular docking to homology-modeled CB₁R.³⁷ However, the recently published Cryo-EM structures of CB₁R and CB₂R revealed that the phytocannabinoid binding sites within these receptors possess significant similarity within the pocket proposed for anandamide, eliminating the possibility for CB₁R selectivity.^{21, 22, 35, 36} These new Cryo-EM studies also attempted to computationally place long-chain cannabinoids within the resolved structures of CB₁R. While these binding poses were stable when subjected to short-timescale MD simulations, they did not comment on the selectivity of these

compounds; additionally, in their proposed binding modes for these compounds at CB₁R relied heavily on the central channel binding pocket, thus lacking any major differences between the two receptors that could be used to determine their selectivity for CB₁R.^{21, 22} With this similarity of the central binding pocket in mind, it is critical to explore possible binding modes for these endocannabinoids that do not solely rely on the typical phytocannabinoid binding pocket to decide their selectivity.

Recent advancement in computational power and support for GPU-accelerated hardware have made long-timescale molecular dynamics (MD) simulation (0.1-1 μ s) more feasible for large-scale systems, including lipid bilayers with proteins embedded within them.⁴⁵ Through a combination of the MD simulations and molecular mechanics–Poisson-Boltzmann surface area (MM-PBSA) binding free energy calculations, compounds binding with a given protein can be ranked accurately in correlation with their experimental binding free energy (G_{exp}) values.^{45, 46} Our group has previously been successful in developing and utilizing various computational approaches for modeling ligands binding with the transmembrane proteins to elucidate subtype selectivity.⁴⁷⁻⁵¹ Hence, in the present study, we employed a variety of computational methods, including molecular docking, MD, and MM-PBSA, to explore the binding poses of these interesting compounds (Figures 1 and 2) with CB₁R and CB₂R and reveal the binding and selective mechanism. According to the computational data, the IQD series of compounds bind to the receptors in the known traditional binding site (phytocannabinoid binding site) of the receptors, whereas the long-chain cannabinoids bind to the receptors in a binding mode which is more favorable for CB₁R. These computationally determined binding modes show excellent correlation with the empirically obtained binding data, suggesting that these binding modes are reasonable for these receptors.

Results and Discussion

Due to the high binding selectivity and potency of O-1860 with CB₁R, its binding mode was studied closely, in the present study, to determine potential unique binding features through molecular docking and MD simulations (Figure 3A and 3B). The obtained binding mode of O-1860 reveal a previously unused binding site in proximity to the extracellular interface of the receptor. As opposed to the previously suggested binding modes concerning these compounds, the hydrophilic binding site within the extracellular interface of CB₁R provides pivotal interactions with the long-chain endocannabinoids. Within this region, there are additional critical residue substitutions within CB₂R that change the binding pocket's ability to receive these long chain endocannabinoids. The critical change between the two receptors is from a change in I267 in CB₁R to L182 in CB₂R (Figure S1 in Supporting Information). This change causes a steric clash with the long-chain cannabinoids (Figure S3 to S14), increasing the hydrogen bond-related distance with L182 and the ligand (Figure 3B) and reducing van der Waals (vdW) interactions with the receptor (Table 1). Conversely, the stricter binding site from these residues in the extracellular interface creates a method to induce CB₁R selectivity. The size of the agonist supported by the binding pocket in CB₂R will be decreased due to these residue changes from CB₁R to CB₂R. From these initial results concerning the binding free energy of O-1860, one can see the large differences in the experimental binding affinity be quantitatively validated through the combined MD and

MM-PBSA binding free energy calculations (Table 1). Through the decomposition of the per-residue contributions to the binding energy, it was revealed that the residues 177, 267, 268, 279, 376, 379, and 380 within CB₁R had greater binding affinities with O-1860 (Figure 3D) than their corresponding analogs in CB₂R.

The binding mode of long-chain molecules

To further verify our binding model, twelve additional long-chain molecules with known K_i values for the CB receptors were collected (Figure 1), and their binding free energies were estimated *via* the MD/MM-PBSA methodology. For each of the long-chain agonists examined in this study, according to the computational data (Table 2) the binding affinity is shown to be higher with the CB₁R over the CB₂R, this is consistent with previously obtained experimental data.^{27, 52-55} This selectivity for CB₁R extends to anandamide, which has previously been erroneously reported as a non-selective CB agonist.⁵⁶ However, these previous reports were performed in tissue-based assays, which contained amidohydrolases that degraded anandamide.⁵⁷⁻⁶⁰ When these confounding enzymes are inhibited using phenylmethylsulfonyl fluoride (PMSF), the K_i of anandamide decreased considerably (543 nM against CB₁R w/o PMSF *vs* 90 nM against CB₁R w/ PMSF), revealing its true selectivity for CB₁R over CB₂R ($K_i = 1980$ nM against CB₂R w/ PMSF).^{56, 57} The computational results obtained have a high correlation with the experimental data, with an R^2 of 0.8318 (Figure S2). When compared to O-1860, these long-chain endocannabinoids have similar per-residue contributions to their binding free energies, suggesting that these compounds bind similarly to O-1860 with the CB receptors. (Figure 3E)

Structure-activity and structure-selectivity correlation relationships of endocannabinoids

O-1860 represents the culmination of a series of additions to the endogenous cannabinoid anandamide, each step of which incrementally increases the binding affinity with CB₁R. The first change to O-1860 from anandamide involves the substitution of two additional methyl groups onto carbon-17, turning it into a neopentane moiety. These additional methyl groups allow for additional vdW interactions with the primarily hydrophobic pocket formed by TM4 and TM5 including F268 and W279 (Figure 3C). Additionally, the substitution of the terminal hydroxyl group with a halogen increases the favorable vdW interactions with the mainly hydrophobic pocket between TM3 and TM4 (Figure 3C) over the endocannabinoid (R)-methanandamide (Figure 4A). The second modification of anandamide (Figure 4B) comes from an additional methyl group placed one carbon from the terminal hydroxyl group (Figure 4A) allowing for additional vdW interactions with I267.

The binding mode of the IQD series of compounds

Furthermore, we used the IQD derivatives shown in Figure 2 to test our models. It is gratifying that the calculated results were in good agreement to the experimental data, suggesting that these models also can be used to the drug design for this series of compounds. Key to the binding of these compounds to each receptor is the carbonyl group on the quinuclidine ring accepting a hydrogen bond from the nearby H178/95 residue in CB₁R/CB₂R. Additionally, these compounds have strong hydrophobic interactions in both CB₁R and CB₂R with nearby F268 & W279 in CB₁R (F183 & W194 in CB₂R) (Figure S15 to S22). PNR-4-20 (Figure 4C and D) represents both a G-protein biased and potent CB₁R

agonist, only lacking in selectivity for one of the receptors (or limited selectivity for CB₂R). This lack in selectivity for CB₁R is readily apparent when one looks at the binding mode comparison (Figure 4C and D) where the only major change in position is a slight rotation in the central indole ring. The similarity of the central binding pocket for the CB receptors is the main hinderance towards developing selective CB receptor agonists. The binding poses proposed for the endocannabinoids and their analogs, shown in the above, give clues as to how these compounds could be modified to allow for CB receptor selectivity.

The correction of binding free energies

Summarized in Table 2 are the binding free energies obtained from the MM-PBSA calculations in comparison with the corresponding binding free energies for CB₁R and CB₂R with all of the 23 ligands shown in Figure 1 and 2. As seen in Table 2, our computational protocol performs similarly well with both the long-chain cannabinoids and the typical IQD derivatives. The relative magnitudes of the MM-PBSA binding free energy (G_{PB}) values are qualitatively consistent with the relative experimental binding free energies in terms of the structure-activity relationship (SAR) for each receptor and the receptor selectivity between CB₁R and CB₂R (Figure 5).

In terms of the absolute binding free energies, it is not surprising to note that the MM-PBSA calculations systematically overestimated the binding affinities of the ligands with both CB₁R and CB₂R. Nevertheless, the empirical linear correlation relationships indicated in Figure 5 may be used to empirically correct the calculated binding free energies. Particularly, for CB₁R binding with ligands, we have

$$\Delta G_{\text{corr}}(\text{CB}_1\text{R}) = 0.1939 \times \Delta G_{\text{PB}}(\text{CB}_1\text{R}) - 4.5021 \quad (1)$$

with a correlation coefficient (R^2) of 0.9381 and a root-mean-squares deviation (RMSD) of 0.36 kcal/mol. For CB₂R binding with ligands, we have

$$\Delta G_{\text{corr}}(\text{CB}_2\text{R}) = 0.3057 \times \Delta G_{\text{PB}}(\text{CB}_2\text{R}) - 2.0485 \quad (2)$$

with $R^2 = 0.6334$ and RMSD = 0.75 kcal/mol. In addition, for the difference in the binding free energy between CB₁R and CB₂R, we have

$$\Delta \Delta G_{\text{corr}} = 0.2619 \times \Delta \Delta G_{\text{PB}} + 0.4457 \quad (3)$$

with $R^2 = 0.8649$ and RMSD = 0.69 kcal/mol. In Eq. (3), $G_{PB} = G_{PB}(\text{CB}_1\text{R}) - G_{PB}(\text{CB}_2\text{R})$, and G_{corr} is the corrected binding free energy difference reflecting the selectivity between CB₁R and CB₂R. In all of these equations, G_{PB} represents the binding free energy obtained directly from the MM-PBSA calculation, whereas G_{corr} refers to the corrected binding free energy.

As seen in Table 2, the empirically corrected binding free energies with both CB₁R and CB₂R, as well as the difference between them, are all in excellent agreement with the corresponding experimental data, suggesting that the binding modes determined in this study are reasonable. Furthermore, our models are expected to be valuable for the rational drug design in the future.

In summary, using molecular docking, MD simulation, and MM-PBSA binding free energy calculations, we have been able to determine the binding modes of CB₁R and CB₂R interacting with both the IQD series of ligands and long-chain cannabinoids (including their synthetic analogs). Based on the obtained binding poses, the calculated relative binding free energies are in good agreement with the corresponding experimental binding affinity data in terms of the SAR for each receptor (CB₁R or CB₂R) and the receptor selectivity between CB₁R and CB₂R. The binding poses for the long-chain cannabinoids and their synthetic analogs implicate the site surrounded by the TM2, TM7, and ECL-2 regions being vital for providing the long-chain ligands with the selectivity for CB₁R, especially the I267/L182 of CB₁R/CB₂R. Considering this computational insight, the future rational design of new selective ligands for CB₁R and CB₂R may be focused on favorable interactions with this site. Particularly, as we have also determined the binding poses of the IQD compounds including the unique G-protein biased agonist PNR-4-20 and PNR-4-02, new compounds may be designed that bring the features of both classes of molecules together, creating selective, potent, and G-protein biased IQD/endocannabinoid hybrids. The similar computational strategy used in this study may also prove fruitful in applications with other GPCRs or membrane-bound proteins.

Methods

Multiple sequences alignment

The amino-acid sequences of CB₁R and CB₂R were downloaded from the Uniprot database.⁶¹ The multiple sequence alignment was performed using the MUSCLE software, which also was used to calculate sequence identity.⁶² The figure for sequence alignment was generated using the ESPript 3.0 software.⁶³

Docking and molecular dynamics simulations

The cannabinoid receptors (PDB ID: 5XRA for CB₁R and 6PT0 for CB₂R) were prepared using the PDB2PQR module to fix any potential errors with the models, and to additionally assign the ff14SB force field parameters to the constituent atoms.^{22, 35} The structures of ligands were built and energy-minimized using the SYBYL v2.0 software (Tripos Inc., St. Louis, USA). Initial poses for the ligands were predicted using the AutoDock 4.2 software with the default parameters.⁶⁴ To improve the efficiency of calculation, the CB₂R model was superimposed to the CB₁R model. The grid size was set to 60 × 60 × 60, and the grid center was designated at -43.616, 164.787, 306.920. For each ligand, 265 possible binding poses were generated for further study. Each ligand had its atomic charges calculated through the AM1-BCC method in the Antechamber module and was subsequently energy-minimized through the Sander module of AMBER16 program before being placed within the binding site of each receptor.⁶⁵⁻⁶⁷

For the compound O-1860 binding with each receptor, the complexes were inserted into a POPC lipid bilayer through the use of the Membrane-Builder module of CHARMM-GUI.⁶⁸ Then the complex structures were energy-minimized over five steps: an initial energy minimization where only hydrogens and lipid bilayer were energy-minimized, followed by energy minimization of the ligand, receptor hydrogens, and lipid bilayer, followed by

sidechains of the receptor, residues within 6 Å of the ligand, and finally the entire system. Each of these steps consisted of a total of 3000 energy minimization steps. Then the MD simulation of the energy-minimized complex was performed using the CUDA accelerated PMEMD module of AMBER.⁶⁵ After energy minimization and heating of the lipid/complex system, 100 ns of MD simulations were performed. One hundred snapshots of the last nanosecond of the system were used within the MM-PBSA module of the AMBER to make sure that the binding free energy based on the final snapshot is reasonably close to the average of binding free energies associated with the one hundred snapshots. The energy decomposition was performed using the decomposition option within the MMPBSA module of the AMBER16.

The last snapshot of the MD-simulated complex with O-1860 was subsequently used as the receptor with O-1860 and lipid bilayer removed. Each ligand (including O-1860) was then placed into the receptor based on the previously obtained binding poses from the AutoDock software.⁶⁴ The whole complex structure was then energy-minimized, and had its binding free energy calculated using the same MM-PBSA methodology.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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References

1. Hauser AS, Attwood MM, Rask-Andersen M, Schiöth HB, and Gloriam DE (2017) Trends in GPCR Drug Discovery: New Agents, Targets and Indications. *Nature Reviews Drug Discovery* 16 (12), 829–842. [PubMed: 29075003]
2. Basu S, and Dittel BN (2011) Unraveling the Complexities of Cannabinoid Receptor 2 (CB2) Immune Regulation in Health and Disease. *Immunol. Res* 51 (1), 26–38. [PubMed: 21626285]
3. Baron EP, Lucas P, Eades J, and Hogue O (2018) Patterns of Medicinal Cannabis Use, Strain Analysis, and Substitution Effect among Patients with Migraine, Headache, Arthritis, and Chronic Pain in a Medicinal Cannabis Cohort. *J. Headache Pain* 19 (1), 37. [PubMed: 29797104]
4. Vu kovi S, Srebro D, Vujovi KS, Vu eti , and Prostran M (2018) Cannabinoids and Pain: New Insights from Old Molecules. *Front. Pharmacol.* 9, 1259. [PubMed: 30542280]
5. Abrams DI, Couey P, Shade SB, Kelly ME, and Benowitz NL (2011) Cannabinoid-Opioid Interaction in Chronic Pain. *Clin. Pharmacol. Ther* 90 (6), 844–851. [PubMed: 22048225]
6. Cichewicz DL, and McCarthy EA (2003) Antinociceptive Synergy between Delta(9)-Tetrahydrocannabinol and Opioids after Oral Administration. *J. Pharmacol. Exp. Ther* 304 (3), 1010–1015. [PubMed: 12604676]
7. Lötsch J, Weyer-Menkhoff I, and Tegeder I (2018) Current Evidence of Cannabinoid-Based Analgesia Obtained in Preclinical and Human Experimental Settings. *Eur. J. Pain* 22 (3), 471–484. [PubMed: 29160600]
8. Benedetti F, Amanzio M, Rosato R, and Blanchard C (2011) Nonopioid Placebo Analgesia Is Mediated by CB1 Cannabinoid Receptors. *Nat. Med* 17 (10), 1228–1230. [PubMed: 21963514]

9. Agarwal N, Pacher P, Tegeder I, Amaya F, Constantin CE, Brenner GJ, Rubino T, Michalski CW, Marsicano G, and Monory K (2007) Cannabinoids Mediate Analgesia Largely Via Peripheral Type 1 Cannabinoid Receptors in Nociceptors. *Nat. Neurosci* 10 (7), 870–879. [PubMed: 17558404]
10. Burns TL, and Ineck JR (2006) Cannabinoid Analgesia as a Potential New Therapeutic Option in the Treatment of Chronic Pain. *Ann. Pharmacother* 40 (2), 251–260. [PubMed: 16449552]
11. Walker JM, and Huang SM (2002) Cannabinoid Analgesia. *Pharmacol. Ther.* 95 (2), 127–135. [PubMed: 12182960]
12. Abdallah FW, Hussain N, Weaver T, and Brull R (2020) Analgesic Efficacy of Cannabinoids for Acute Pain Management after Surgery: A Systematic Review and Meta-Analysis. *Reg. Anesth. Pain Med* 45 (7), 509–519. [PubMed: 32471924]
13. Wiese B, and Wilson-Poe AR (2018) Emerging Evidence for Cannabis' Role in Opioid Use Disorder. *Cannabis Cannabinoid Res.* 3 (1), 179–189. [PubMed: 30221197]
14. Rice A (2001) Cannabinoids and Pain. *Curr. Opin. Investig. Drugs* 2 (3), 399.
15. Rossi F, Punzo F, Umamo GR, Argenziano M, and Miraglia Del Giudice E (2018) Role of Cannabinoids in Obesity. *Int. J. Mol. Sci* 19 (9), 2690.
16. Pertwee RG (2012) Targeting the Endocannabinoid System with Cannabinoid Receptor Agonists: Pharmacological Strategies and Therapeutic Possibilities. *Philos. Trans. R. Soc. Lond., B, Biol. Sci* 367 (1607), 3353–3363. [PubMed: 23108552]
17. Pertwee RG (2009) Emerging Strategies for Exploiting Cannabinoid Receptor Agonists as Medicines. *Br. J. Pharmacol* 156 (3), 397–411. [PubMed: 19226257]
18. Shahbazi F, Grandi V, Banerjee A, and Trant JF (2020) Cannabinoids and Cannabinoid Receptors: The Story So Far. *iScience*, 101301. [PubMed: 32629422]
19. Song Z-H, Slowey C-A, Hurst DP, and Reggio PH (1999) The Difference between the CB1 and CB2cannabinoid Receptors at Position 5.46 Is Crucial for the Selectivity of WIN55212-2 for CB2. *Molecular pharmacology* 56 (4), 834–840. [PubMed: 10496968]
20. Tuccinardi T, Ferrarini PL, Manera C, Ortore G, Saccomanni G, and Martinelli A (2006) Cannabinoid CB2/CB1 Selectivity. Receptor Modeling and Automated Docking Analysis. *J. Med. Chem* 49 (3), 984–994. [PubMed: 16451064]
21. Hua T, Vemuri K, Nikas SP, Laprairie RB, Wu Y, Qu L, Pu M, Korde A, Jiang S, and Ho J-H (2017) Crystal Structures of Agonist-Bound Human Cannabinoid Receptor CB1. *Nature* 547 (7664), 468–471. [PubMed: 28678776]
22. Hua T, Vemuri K, Pu M, Qu L, Han GW, Wu Y, Zhao S, Shui W, Li S, and Korde A (2016) Crystal Structure of the Human Cannabinoid Receptor CB1. *Cell* 167 (3), 750–762. [PubMed: 27768894]
23. Herzberg U, Eliav E, Bennett G, and Kopin IJ (1997) The Analgesic Effects of R (+)-Win 55,212–2 Mesylate, a High Affinity Cannabinoid Agonist, in a Rat Model of Neuropathic Pain. *Neurosci. Lett* 221 (2-3), 157–160. [PubMed: 9121688]
24. Diaz P, Phatak SS, Xu J, Astruc-Diaz F, Cavasotto CN, and Naguib M (2009) 6-Methoxy-N-Alkyl Isatin Acylhydrazone Derivatives as a Novel Series of Potent Selective Cannabinoid Receptor 2 Inverse Agonists: Design, Synthesis, and Binding Mode Prediction. *J. Med. Chem* 52 (2), 433–444. [PubMed: 19115816]
25. Vemuri VK, and Makriyannis A, *Endocannabinoids and Their Synthetic Analogs In The Cannabinoid Receptors*, Springer: 2009; pp 21–48.
26. ME PRHAA, Elphick ASDMV, and Kunos MGPHHG Mackie K 2010 International Union of Basic and Clinical Pharmacology. Lxxix. Cannabinoid Receptors and Their Ligands: Beyond CB1 and CB2. *Pharmacol. Rev* 62, 588–631. [PubMed: 21079038]
27. Di Marzo V, Bisogno T, De Petrocellis L, Brandi I, Jefferson R, Winckler R, Davis J, Dasse O, Mahadevan A, and Razdan R (2001) Highly Selective CB1 Cannabinoid Receptor Ligands and Novel CB1/Vr1 Vanilloid Receptor “Hybrid” Ligands. *Biochem. Biophys. Res. Commun* 281 (2), 444–451. [PubMed: 11181068]
28. Madadi NR, Penthala NR, Brents LK, Ford BM, Prather PL, and Crooks PA (2013) Evaluation of (Z)-2-((1-Benzyl-1h-Indol-3-Yl)methylene)-Quinuclidin-3-One Analogues as Novel, High Affinity Ligands for CB1 and CB2 Cannabinoid Receptors. *Bioorg. Med. Chem. Lett* 23 (7), 2019–2021. [PubMed: 23466226]

29. Ford BM, Franks LN, Tai S, Fantegrossi WE, Stahl EL, Berquist MD, Cabanlong CV, Wilson CD, Penthala NR, and Crooks PA (2017) Characterization of Structurally Novel G Protein Biased CB1 Agonists: Implications for Drug Development. *Pharmacol. Res* 125, 161–177. [PubMed: 28838808]
30. Kendall D, Alexander S, Priestley R, Asghar M, and von Mentzer B (2017) Biased Agonism at Cannabinoid CB1 and μ -Opioid Receptors; Therapeutic Potential. *Neuropeptides* 65, 131.
31. Newman-Tancredi A (2011) Biased Agonism at Serotonin 5-Ht1a Receptors: Preferential Postsynaptic Activity for Improved Therapy of Cns Disorders. *Neuropsychiatry* 1 (2), 149.
32. Rankovic Z, Brust TF, and Bohn LM (2016) Biased Agonism: An Emerging Paradigm in GPCR Drug Discovery. *Bioorg. Med. Chem. Lett* 26 (2), 241–250. [PubMed: 26707396]
33. Whalen EJ, Rajagopal S, and Lefkowitz RJ (2011) Therapeutic Potential of B-Arrestin-and G Protein-Biased Agonists. *Trends Mol. Med* 17 (3), 126–139. [PubMed: 21183406]
34. Hua T, Li X, Wu L, Iliopoulos-Tsoutsouvas C, Wang Y, Wu M, Shen L, Johnston CA, Nikas SP, and Song F (2020) Activation and Signaling Mechanism Revealed by Cannabinoid Receptor-Gi Complex Structures. *Cell* 180 (4), 655–665. [PubMed: 32004463]
35. Xing C, Zhuang Y, Xu T-H, Feng Z, Zhou XE, Chen M, Wang L, Meng X, Xue Y, and Wang J (2020) Cryo-Em Structure of the Human Cannabinoid Receptor CB2-Gi Signaling Complex. *Cell* 180 (4), 645–654. [PubMed: 32004460]
36. Li X, Hua T, Vemuri K, Ho J-H, Wu Y, Wu L, Popov P, Benchama O, Zvonok N, and Qu L (2019) Crystal Structure of the Human Cannabinoid Receptor CB2. *Cell* 176 (3), 459–467. [PubMed: 30639103]
37. Salo OM, Lahtela-Kakkonen M, Gynther J, Järvinen T, and Poso A (2004) Development of a 3d Model for the Human Cannabinoid CB1 Receptor. *J. Med. Chem* 47 (12), 3048–3057. [PubMed: 15163186]
38. Sapundzhi F, and Dzimbova T (2020) A Computational Study of Cannabinoid Receptors and Cannabinoid Ligands. *J. Chem. Technol. Metall* 55 (5), 959–964.
39. Reggio PH, and Traore H (2000) Conformational Requirements for Endocannabinoid Interaction with the Cannabinoid Receptors, the Anandamide Transporter and Fatty Acid Amidohydrolase. *Chem. Phys. Lipids* 108 (1-2), 15–35. [PubMed: 11106780]
40. Lynch DL, and Reggio PH (2005) Molecular Dynamics Simulations of the Endocannabinoid N-Arachidonylethanolamine (Anandamide) in a Phospholipid Bilayer: Probing Structure and Dynamics. *J. Med. Chem* 48 (15), 4824–4833. [PubMed: 16033262]
41. Reggio PH (2010) Endocannabinoid Binding to the Cannabinoid Receptors: What Is Known and What Remains Unknown. *Curr. Med. Chem* 17 (14), 1468–1486. [PubMed: 20166921]
42. Lin S, Khanolkar AD, Fan P, Goutopoulos A, Qin C, Papahadjis D, and Makriyannis A (1998) Novel Analogues of Arachidonylethanolamide (Anandamide): Affinities for the CB1 and CB2 Cannabinoid Receptors and Metabolic Stability. *J. Med. Chem.* 41 (27), 5353–61. [PubMed: 9876105]
43. Dainese E, Gasperi V, and Maccarrone M (2005) Partial Qsar Analysis of Some Selected Natural Inhibitors of Faah Suggests a Working Hypothesis for the Development of Endocannabinoid-Based Drugs. *CNS Neurol. Disord. Drug Targets* 4 (6), 709–714.
44. McAllister SD, Rizvi G, Anavi-Goffer S, Hurst DP, Barnett-Norris J, Lynch DL, Reggio PH, and Abood ME (2003) An Aromatic Microdomain at the Cannabinoid CB1 Receptor Constitutes an Agonist/Inverse Agonist Binding Region. *J. Med. Chem* 46 (24), 5139–5152. [PubMed: 14613317]
45. Perez A, Morrone JA, Simmerling C, and Dill KA (2016) Advances in Free-Energy-Based Simulations of Protein Folding and Ligand Binding. *Curr. Opin. Struct. Biol* 36, 25–31. [PubMed: 26773233]
46. Loo JS, Yong AY, and Yong YN (2020) The Effect of Multiple Simulation Parameters on MM/PBSA Performance for Binding Affinity Prediction of CB1 Cannabinoid Receptor Agonists and Antagonists. *Chem. Biol. Drug Des* [Online early access]. DOI:10.1111/cbdd.13733. Published Online: 5 27, 2020. <https://onlinelibrary.wiley.com/doi/abs/10.1111/cbdd.13733> (accessed Aug 11, 2020).

47. Huang X, Zheng F, and Zhan C-G (2008) Modeling Differential Binding of A4 β 2 Nicotinic Acetylcholine Receptor with Agonists and Antagonists. *J. Am. Chem. Soc* 130 (49), 16691–16696. [PubMed: 19554732]
48. Huang X, Zheng F, Chen X, Crooks PA, Dwoskin LP, and Zhan C-G (2006) Modeling Subtype-Selective Agonists Binding with A4 β 2 and A7 Nicotinic Acetylcholine Receptors: Effects of Local Binding and Long-Range Electrostatic Interactions. *J. Med. Chem* 49 (26), 7661–7674. [PubMed: 17181149]
49. Huang X, Zheng F, Crooks PA, Dwoskin LP, and Zhan C-G (2005) Modeling Multiple Species of Nicotine and Deschloroepibatidine Interacting with A4 β 2 Nicotinic Acetylcholine Receptor: From Microscopic Binding to Phenomenological Binding Affinity. *J. Am. Chem. Soc* 127 (41), 14401–14414. [PubMed: 16218635]
50. Jin Y, Huang X, Papke RL, Jutkiewicz EM, Showalter HD, and Zhan C-G (2017) Design, Synthesis, and Biological Activity of 5'-Phenyl-1, 2, 5, 6-Tetrahydro-3, 3'-Bipyridine Analogues as Potential Antagonists of Nicotinic Acetylcholine Receptors. *Bioorg. Med. Chem. Lett* 27 (18), 4350–4353. [PubMed: 28838693]
51. Huang X, Zheng F, Stokes C, Papke RL, and Zhan C-G (2008) Modeling Binding Modes of A7 Nicotinic Acetylcholine Receptor with Ligands: The Roles of Gln117 and Other Residues of the Receptor in Agonist Binding. *J. Med. Chem* 51 (20), 6293–6302. [PubMed: 18826295]
52. Hillard CJ, Manna S, Greenberg MJ, DiCamelli R, Ross RA, Stevenson LA, Murphy V, Pertwee RG, and Campbell WB (1999) Synthesis and Characterization of Potent and Selective Agonists of the Neuronal Cannabinoid Receptor (CB1). *J. Pharmacol. Exp. Ther* 289 (3), 1427–1433. [PubMed: 10336536]
53. Thakur GA, Nikas SP, and Makriyannis A (2005) CB1 Cannabinoid Receptor Ligands. *Mini Rev. Med. Chem* 5 (7), 631–640. [PubMed: 16026309]
54. Willinsky M Composition and Methods to Improve Stability, Dosing, Pharmacodynamics and Product Shelf Life of Endocannabinoids, Phytocannabinoids and Synthetic Cannabinoids Delivered by Nasal Inhaer. US20180000727A1, 2018.
55. Lin S, Khanolkar AD, Fan P, Goutopoulos A, Qin C, Papahadjis D, and Makriyannis A (1998) Novel Analogues of Arachidonylethanolamide (Anandamide): Affinities for the CB1 and CB2 Cannabinoid Receptors and Metabolic Stability. *J. Med. Chem* 41 (27), 5353–5361. [PubMed: 9876105]
56. Felder CC, Joyce KE, Briley EM, Mansouri J, Mackie K, Blond O, Lai Y, Ma AL, and Mitchell RL (1995) Comparison of the Pharmacology and Signal Transduction of the Human Cannabinoid CB1 and CB2 Receptors. *Mol. Pharmacol* 48 (3), 443–450. [PubMed: 7565624]
57. Adams IB, Ryan W, Singer M, Thomas BF, Compton DR, Razdan RK, and Martin BR (1995) Evaluation of Cannabinoid Receptor Binding and in Vivo Activities for Anandamide Analogs. *J. Pharmacol. Exp. Ther* 273 (3), 1172–1181. [PubMed: 7791088]
58. Wiley JL, Dewey MA, Jefferson RG, Winckler RL, Bridgen DT, Willoughby KA, and Martin BR (2000) Influence of Phenylmethylsulfonyl Fluoride on Anandamide Brain Levels and Pharmacological Effects. *Life Sci.* 67 (13), 1573–1583. [PubMed: 10983852]
59. Compton DR, and Martin BR (1997) The Effect of the Enzyme Inhibitor Phenylmethylsulfonyl Fluoride on the Pharmacological Effect of Anandamide in the Mouse Model of Cannabimimetic Activity. *J. Pharmacol. Exp. Ther* 283 (3), 1138–1143. [PubMed: 9399986]
60. Laine K, Järvinen K, Pate DW, Urtti A, and Järvinen T (2002) Effect of the Enzyme Inhibitor, Phenylmethylsulfonyl Fluoride, on the Iop Profiles of Topical Anandamides. *Invest. Ophthalmol. Vis. Sci* 43 (2), 393–397. [PubMed: 11818382]
61. UniProt C (2008) The Universal Protein Resource (Uniprot). *Nucleic Acids Res.* 36 (Database issue), D190–D195. [PubMed: 18045787]
62. Edgar RC (2004) Muscle: Multiple Sequence Alignment with High Accuracy and High Throughput. *Nucleic Acids Res.* 32 (5), 1792–1797. [PubMed: 15034147]
63. Robert X, and Gouet P (2014) Deciphering Key Features in Protein Structures with the New Endscript Server. *Nucleic Acids Res.* 42 (W1), W320–W324. [PubMed: 24753421]

64. Morris GM, Huey R, Lindstrom W, Sanner MF, Belew RK, Goodsell DS, and Olson AJ (2009) Autodock4 and Autodocktools4: Automated Docking with Selective Receptor Flexibility. *J. Comput. Chem* 30 (16), 2785–2791. [PubMed: 19399780]
65. Pearlman DA, Case DA, Caldwell JW, Ross WS, Cheatham TE III, DeBolt S, Ferguson D, Seibel G, and Kollman P (1995) Amber, a Package of Computer Programs for Applying Molecular Mechanics, Normal Mode Analysis, Molecular Dynamics and Free Energy Calculations to Simulate the Structural and Energetic Properties of Molecules. *Comput. Phys. Commun* 91 (1-3), 1–41.
66. Jakalian A, Jack DB, and Bayly CI (2002) Fast, Efficient Generation of High-Quality Atomic Charges. Am1-Bcc Model: II. Parameterization and Validation. *J. Comput. Chem* 23 (16), 1623–41. [PubMed: 12395429]
67. Case DA, Cheatham TE 3rd, Darden T, Gohlke H, Luo R, Merz KM Jr., Onufriev A, Simmerling C, Wang B, and Woods RJ (2005) The Amber Biomolecular Simulation Programs. *J. Comput. Chem* 26 (16), 1668–88. [PubMed: 16200636]
68. Jo S, Kim T, Iyer VG, and Im W (2008) CHARMM-GUI: A Web-Based Graphical User Interface for Charmm. *J. Comput. Chem* 29 (11), 1859–1865. [PubMed: 18351591]

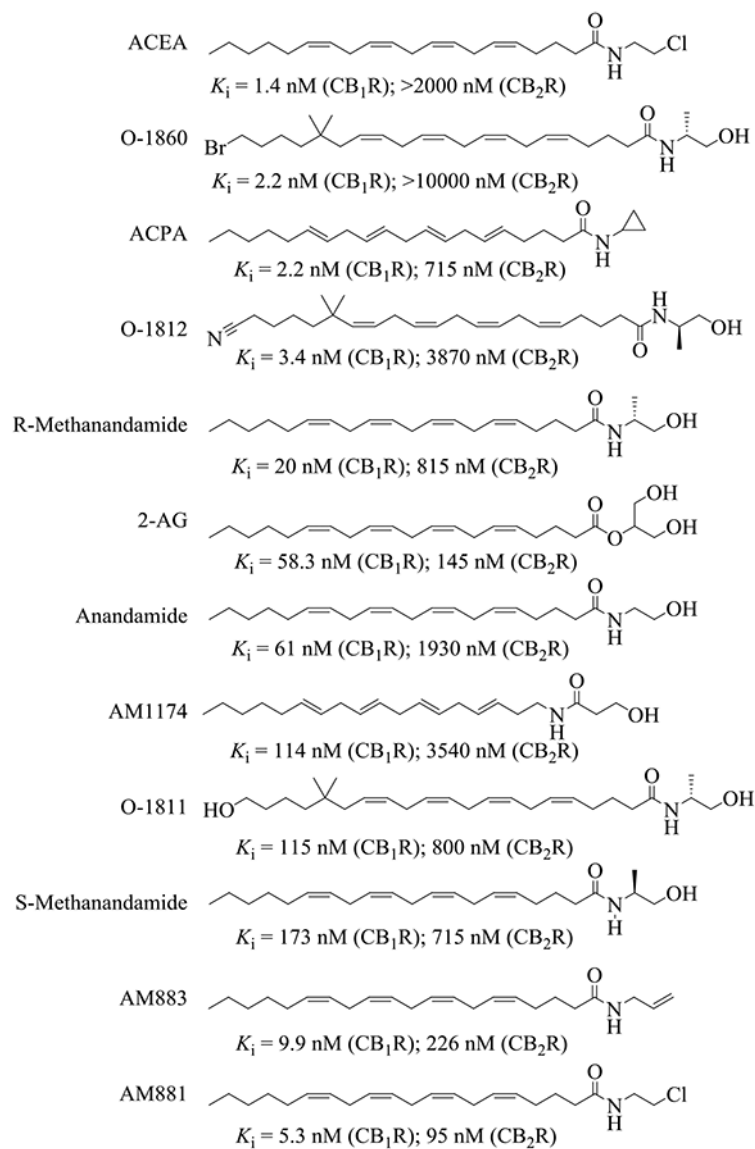


Figure 1. Representative long-chain endocannabinoids and their synthetic analogs. The experimental binding affinities come from the references indicated in Table 2.

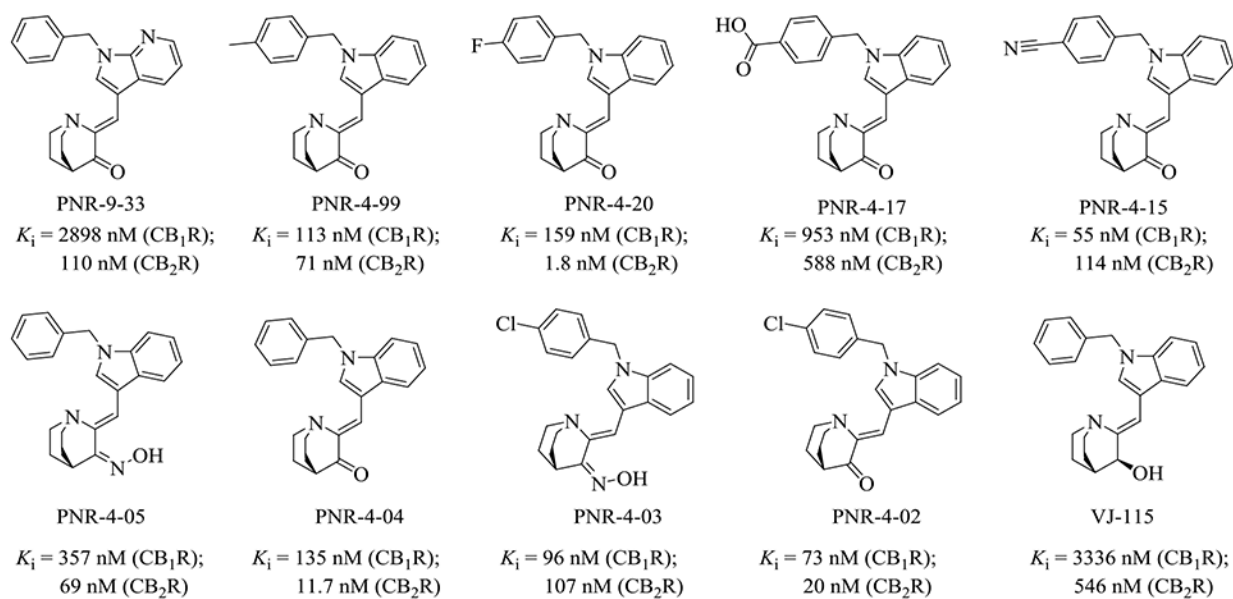


Figure 2. Molecular structures of indole quinuclidinone (IQD) series cannabinoid receptor agonists, along with the experimental binding affinities.²⁸

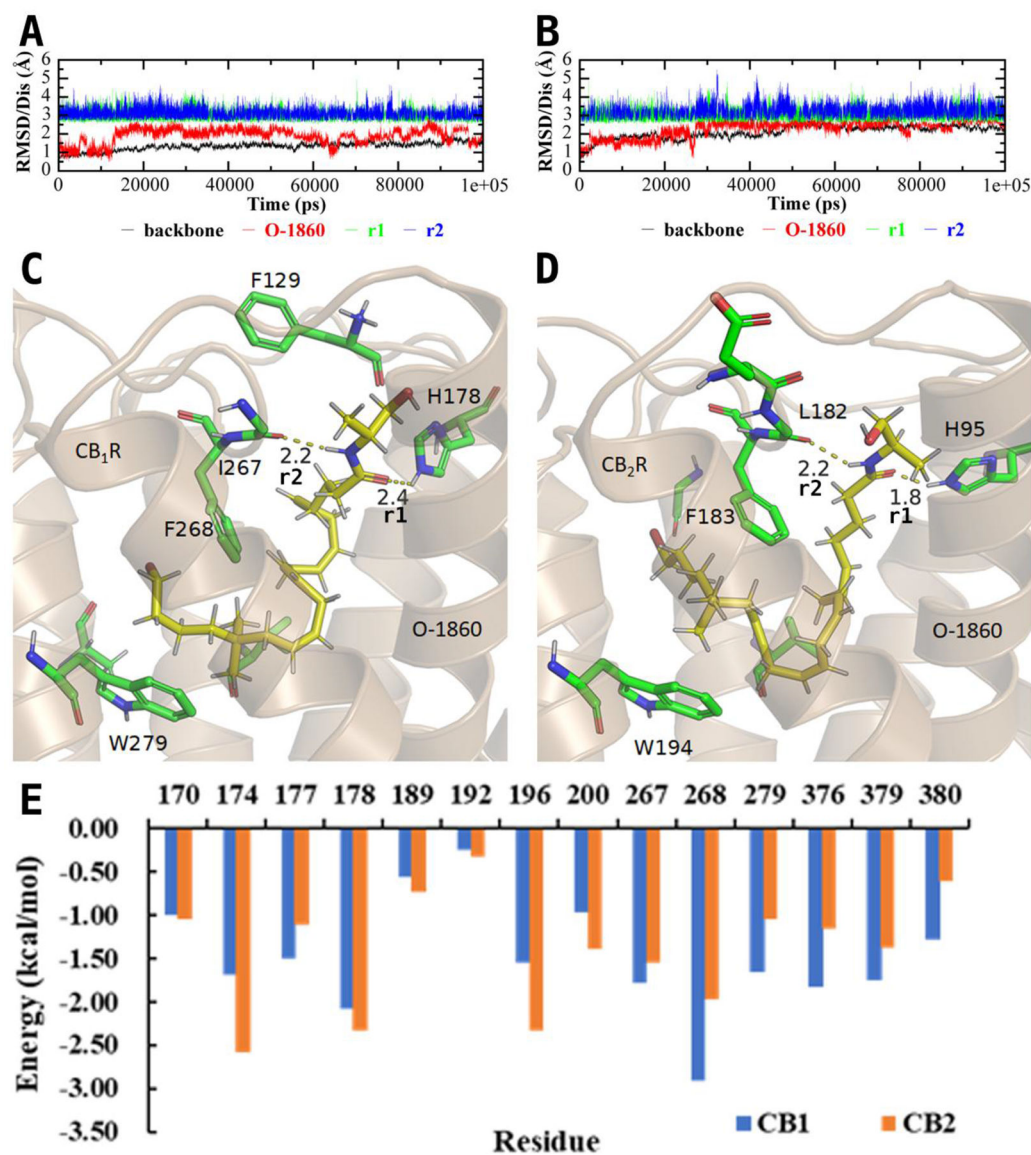


Figure 3. (A) Room-mean-squares deviation (RMSD) of backbone atoms (black) of CB₁R and heavy atoms of O-1860 (red) along with two crucial distances (r1 and r2) indicated in panel C in the MD-simulated CB₁R binding with O-1860. (B) RMSD of backbone atoms (black) of CB₂R and heavy atoms of O-1860 (red) along with two crucial distances (r1 and r2) indicated in panel D in the MD-simulated CB₂R binding with O-1860. (C) A snapshot of the MD-simulated structure of CB₁R binding with O-1860 after 100 ns. (D) A snapshot of the MD-simulated structure of CB₂R binding with O-1860 after 100 ns. (E) Decomposed per-residue binding energies for residues surrounding O-1860.

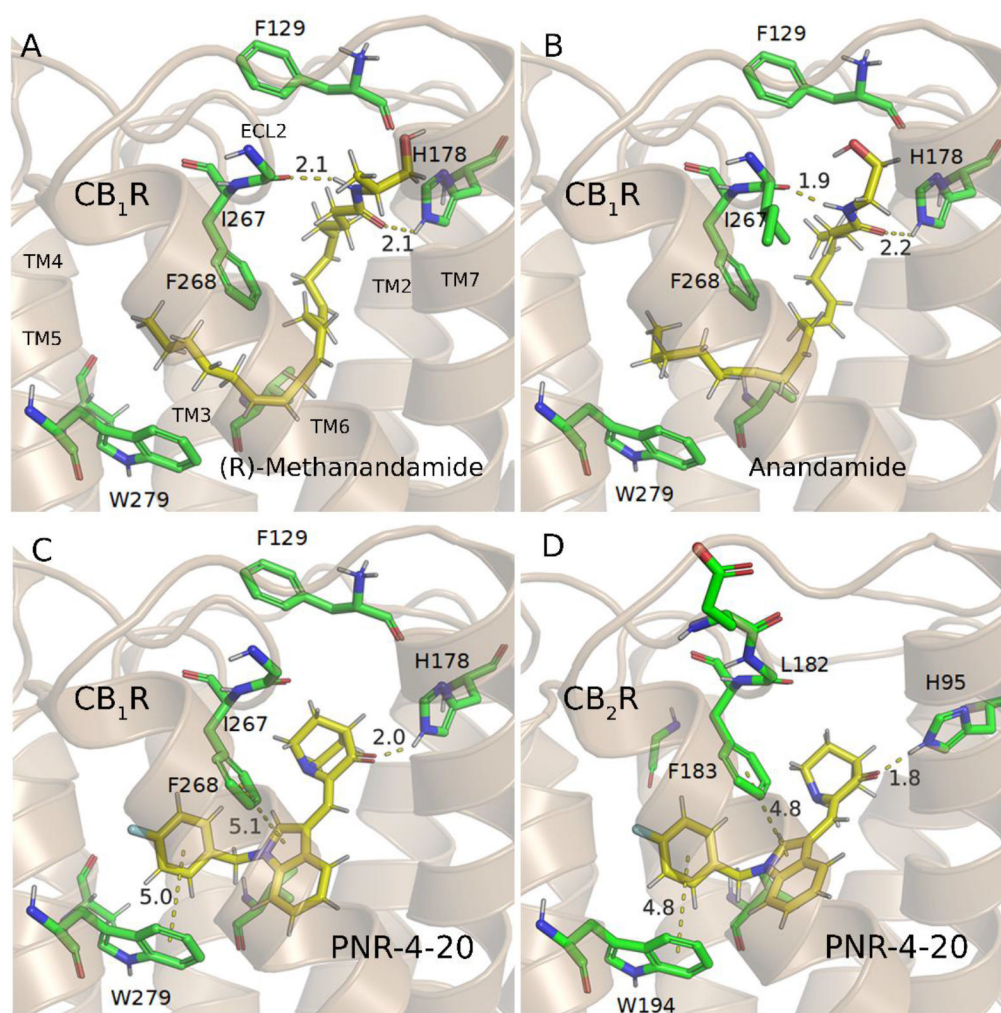


Figure 4.

The binding modes of representative long-chain compounds in CB₁R and CB₂R. (A) CB₁R binding with (R)-methanandamide. (B) CB₁R binding with anandamide. The binding mode of O-1860 with CB₁R consists of two hydrogen bonds with H178 and I267. Additionally, favorable hydrophobic interactions are created with F268 and W279. The removal of the neo-pentane and bromide on the long aliphatic chain further reduces the binding affinity with the CB₁R receptor for (R)-methanandamide. The removal of the methyl group adjacent to the amide head group further removes the selectivity and potency to the original endocannabinoid anandamide. (C) Binding pose of PNR-4-20 with CB₁R. (D) Binding pose of PNR-4-20 with CB₂R. PNR-4-20 binds within the central binding pocket of the receptors, surrounded by several hydrophobic residues including F268 and W279 in CB₁R and F183 and W194 in CB₂R. The carbonyl formed hydrogen bond with His178/95 of CB₁R/CB₂R. A slight rotation in the central indole ring is the only major difference between these two binding poses, demonstrating the similarity in the binding pockets between the two receptors.

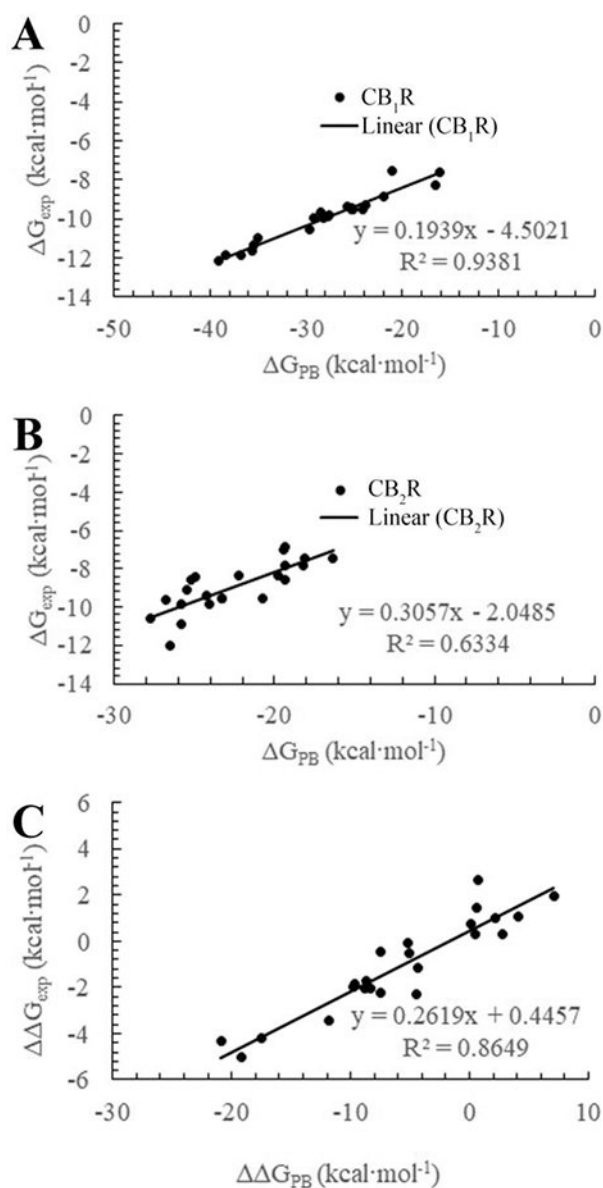


Figure 5. (A) Calculated binding free energy *vs* experimental binding free energy of ligands with CB₁R. (B) Calculated binding free energy *vs* experimental binding free energy of ligands with CB₂R. (C) Difference in experimental binding free energy *vs* the calculated binding free energy difference between CB₁R and CB₂R. These measures indicate that there is a strong correlation between the difference in the calculated and experimental binding free energy, allowing us to successfully predict the selectivity for a given ligand towards CB₁R or CB₂R as well as determine their relative affinity.

Table 1.

The binding free energies (kcal/mol) of O-1860 with CB₁R and CB₂R based on the combined MD simulation and MM-PBSA calculations.

CBRs	E_{ele}	E_{vdw}	E_{gas}	E_{pbsol}	E_{pb}	-T S	G_{PB}
CB ₁ R	-27.54	-70.34	-97.88	38.06	-59.82	22.04	-37.78
CB ₂ R	-16.37	-66.42	-82.79	39.75	-43.03	23.70	-19.33

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Table 2.

Calculated binding free energies (kcal/mol) compared to the corresponding experimental binding free energies (kcal/mol, derived from the experimental K_i shown in Figure 1 or 2).

Ligand ^a	G(CB ₁ R)			G(CB ₂ R)			G(CB ₁ R)- G(CB ₂ R)	
	G _{PB} ^b	G _{corr} ^c	G _{exp} ^d	G _{PB} ^b	G _{corr} ^c	G _{exp} ^d	G _{corr} ^{c,e}	G _{exp} ^f
ACEA ⁵²	-39.07	-12.08	-12.15	-18.19	-7.60	-7.82	-4.98	-4.33
O-1860 ²⁷	-38.44	-11.97	-11.88	-19.30	-7.96	-6.86	-4.54	-5.02
ACPA ⁵³	-36.78	-11.67	-11.88	-24.95	-9.79	-8.44	-2.68	-3.45
O-1812 ²⁷	-35.54	-11.44	-11.62	-18.06	-7.56	-7.43	-4.12	-4.20
AM881 ⁵³	-35.45	-11.43	-11.36	-26.78	-10.38	-9.64	-1.87	-1.72
AM883 ⁵⁴	-35.10	-11.36	-10.99	-25.48	-9.96	-9.12	-2.11	-1.86
VJ-115 ²⁸	-21.05	-8.82	-7.52	-25.19	-9.86	-8.60	1.39	1.08
R-Methanandamide ⁵³	-29.66	-10.38	-10.57	-22.18	-8.89	-8.36	-1.57	-2.21
2-AG ⁵³	-29.28	-10.31	-9.93	-24.23	-9.55	-9.39	-0.95	-0.54
Anandamide ⁵³	-27.69	-10.02	-9.90	-19.37	-7.98	-7.84	-1.79	-2.06
AM1174 ⁵⁵	-25.09	-9.55	-9.53	-16.34	-7.00	-7.48	-1.89	-2.05
O-1811 ²⁷	-24.13	-9.38	-9.52	-19.74	-8.10	-8.37	-0.79	-1.16
S-Methanandamide ²⁵	-23.83	-9.32	-9.28	-19.40	-7.99	-6.98	-0.80	-2.30
PNR-4-20 ²⁸	-25.79	-9.67	-9.33	-26.52	-10.29	-12.00	0.52	2.67
PNR-4-04 ²⁸	-25.22	-9.57	-9.43	-25.84	-10.07	-10.89	0.49	1.46
PNR-4-02 ²⁸	-27.64	-10.01	-9.80	-27.78	-10.70	-10.57	0.37	0.77
PNR-4-05 ²⁸	-21.95	-8.98	-8.85	-24.10	-9.51	-9.83	0.88	0.98
PNR-4-99 ²⁸	-25.28	-9.58	-9.54	-25.78	-10.06	-9.81	0.46	0.28
PNR-9-33 ²⁸	-16.18	-7.93	-7.60	-23.26	-9.24	-9.55	2.13	1.95
PNR-4-03 ²⁸	-28.42	-10.15	-9.63	-23.26	-9.24	-9.57	-0.98	-0.06
PNR-4-15 ²⁸	-28.18	-10.11	-9.96	-20.72	-8.42	-9.53	-1.57	-0.43
PNR-4-17 ²⁸	-16.52	-7.99	-8.26	-19.31	-7.96	-8.55	1.04	0.29
RMSD (kcal/mol)		0.35			0.75		0.75	

^aThe subscript after the ligand name refers to the reference for the experimental K_i (shown in Figure 1 or 2) used to derive the experimental binding free energy.

^bCalculated binding free energies obtained from the MM-PBSA calculations without any empirical correction.

^cCalculated binding free energies after empirical correction using Eq. (1), (2), or (3).

^dThe experimental binding free energy was converted from the experimental K_i using the well-known thermodynamic equation: $G_{\text{exp}} = -RT \ln(K_i)$.

^e G_{corr} is the corrected binding free energy difference ($G(\text{CB}_1\text{R}) - G(\text{CB}_2\text{R})$).

^f $G_{\text{exp}} = -RT \ln(K_i(\text{CB}_1\text{R})/K_i(\text{CB}_2\text{R})) = G_{\text{exp}}(\text{CB}_1\text{R}) - G_{\text{exp}}(\text{CB}_2\text{R})$.