

Ligand-Based Discovery of a New Scaffold for Allosteric Modulation of the μ -Opioid Receptor

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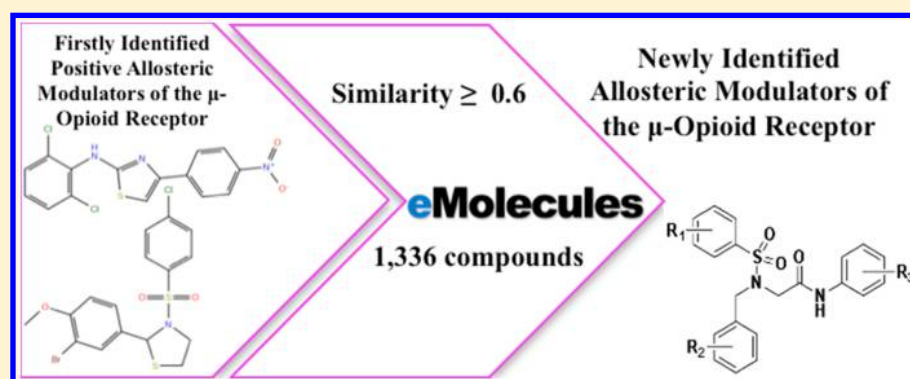
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Supporting Information



ABSTRACT: With the hope of discovering effective analgesics with fewer side effects, attention has recently shifted to allosteric modulators of the opioid receptors. In the past two years, the first chemotypes of positive or silent allosteric modulators (PAMs or SAMs, respectively) of μ - and δ -opioid receptor types have been reported in the literature. During a structure-guided lead optimization campaign with μ -PAMs BMS-986121 and BMS-986122 as starting compounds, we discovered a new chemotype that was confirmed to display μ -PAM or μ -SAM activity depending on the specific substitutions as assessed by endomorphin-1-stimulated β -arrestin2 recruitment assays in Chinese Hamster Ovary (CHO)- μ PathHunter cells. The most active μ -PAM of this series was analyzed further in competition binding and G-protein activation assays to understand its effects on ligand binding and to investigate the nature of its probe dependence.

■ INTRODUCTION

A prominent member of the G-protein-coupled receptor (GPCR) superfamily, the μ -opioid receptor is the main pharmacological target for both acute and chronic pain, as well as a target for the treatment of alcohol abuse, drug abuse, and addiction disorders.^{1,2} Although μ -opioid medications such as morphine and its derivatives remain the “gold-standard” for pain management, clinicians are rightly conservative in the administration of these drugs, owing to their dangerous adverse effects (e.g., respiratory depression, nausea, tolerance, dependence, and constipation), as well as social and legal issues. As a result, the development of new opioid analgesics that are free from side effects represents a critically important research objective for 21st century medicine.

Recent high-resolution structural information on the μ -opioid receptor,³ as well as novel paradigms of biased agonism (or functional selectivity) and allostereism at this receptor,^{4,5}

may offer unprecedented opportunities for the discovery of opioid therapeutics with reduced adverse effects. Allosteric ligands are defined as binding to regions that are distinct from the site where the endogenous ligand binds (defined as the orthosteric binding site). Depending on whether they enhance or reduce the affinity and/or efficacy of the orthosteric ligand, they can be classified as positive allosteric modulators (PAMs) or negative allosteric modulators (NAMs), respectively. In principle, these ligands have several theoretical advantages over traditional orthosteric agonists and antagonists. First, because allosteric regions of GPCRs tend to be less evolutionarily conserved than orthosteric binding sites, allosteric ligands can attain improved receptor type selectivity, which can limit the occurrence of off-target effects (although this does not eliminate the possibility of on-target effects). In the case of

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opioid receptors, development of selective opioid drugs has not been a major impediment, and most of the untoward side effects of opioid agonists are target-mediated; therefore, this specific advantage of allosteric modulators may have limited applicability to opioid receptors. Another important advantage of allosteric modulators is that their effect is limited by their cooperativity, and therefore allosteric ligands may hold great potential as safer drugs with fewer on-target overdosing risks. This feature may be more important in the case of μ -opioid receptors, where safety risks associated with drug overdose are a very significant problem. Finally, another major theoretical advantage of PAMs compared to orthosteric agonists is that PAMs are likely to maintain the temporal and spatial fidelity of signaling *in vivo* as they only act in the presence of the endogenous ligand. Therefore, PAMs might be expected to produce significantly less desensitization and tolerance than direct-acting agonists, which continuously activate the receptor until the drug is cleared. Because tolerance and dependence produced by direct opioid agonists remain major issues limiting their therapeutic utility, this feature of PAMs may have great importance in the case of μ -opioid receptors specifically. Similarly, opioid PAMs may be able to avoid some of the on-target side effects produced by opioid agonists by virtue of acting only in tissues where native opioid signaling is occurring. For a more thorough review on the potential advantages of opioid PAMs, see Burford et al.⁴ It is important to note that at present these potential advantages of opioid PAMs remain purely theoretical, as *in vivo* effects of opioid PAMs have not yet been reported.

Although several GPCR allosteric modulators have shown preclinical promise in neurodegenerative, psychiatric, or neurobehavioral diseases,⁶ the development and validation of drug-like allosteric modulators of the opioid receptors lags behind. The first opioid allosteric modulators were identified for the μ -opioid receptor from a recent high throughput screening campaign using a β -arrestin2 recruitment assay.⁷ Specifically, this screen identified two PAMs and two silent allosteric modulators (SAMs) of the μ -opioid receptor. While the μ -SAMs exhibited neutral cooperativity with orthosteric ligands in spite of their competitive binding at the allosteric site, the two μ -PAMs BMS-986121 and BMS-986122 potentiated the effects of endomorphin-1, DAMGO ([D-Ala², N-MePhe⁴, Gly-ol]-enkephalin), and morphine in β -arrestin2 recruitment, G-protein activation, and adenylyl cyclase (AC) inhibition. Although a few PAMs of the δ -opioid receptor have also been recently identified,^{8,9} additional pharmacological tools are needed to investigate further the effect of allosterism on μ -opioid receptor signaling, and to test whether μ -opioid receptor PAMs will in fact provide the potential therapeutic advantages described above.

Here, we report the discovery of a new chemotype that, depending on the specific substitutions, exhibits μ -PAM or μ -SAM activity as assessed by endomorphin-1-stimulated β -arrestin2 recruitment assays in Chinese Hamster Ovary (CHO)- μ PathHunter cells. Further radioligand binding and G-protein activation assays were performed on the most active μ -PAM of this series (MS1) to understand both its effects on ligand binding and the nature of its probe dependence.

MATERIALS AND METHODS

Dataset Generation and Clustering. The eMolecules database¹⁰ of 6 million compounds was used to search for chemical analogs of BMS-986121 and BMS-986122, including

compounds with a significantly different chemotype. An eMolecules similarity cutoff of 0.6 to either parent compound led to the retrieval of 661 analogs of BMS-986121 and 675 analogs of BMS-986122 on January 31, 2014. A hierarchical clustering of the resulting 1336 molecules (Table S1) was performed using a Tanimoto distance matrix generated from linear chemical fingerprints with Canvas version 2.2 of the Schrödinger Suite 2014-4.¹¹ Using default options such as the cluster linkage method and the Kelly criterion, molecules were grouped into 7 clusters separated by a Tanimoto distance of 0.9. The three most populated of these clusters included derivatives of BMS-986121 and BMS-986122, as well as a significantly different chemical scaffold herein termed “MS” (Figure 1). An additional 33 molecules with high chemical

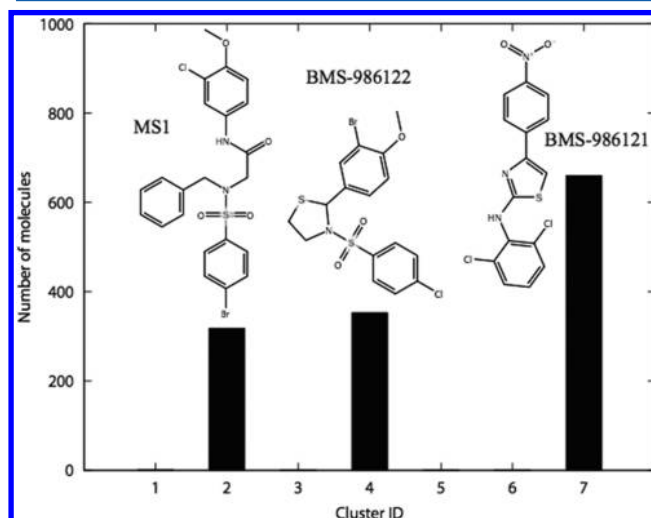


Figure 1. Clustering results of the 1336 analogs of BMS-986121 and BMS-986122 extracted from eMolecules. The three most populated clusters 2, 4, and 7 included analogs of MS1, BMS-986122, and BMS-986121, respectively.

similarity (≥ 0.9) to MS1 were retrieved from both the eMolecules¹⁰ and ZINC¹² (over 35 million purchasable compounds) databases. Twenty-eight of such compounds were purchased for experimental testing.

Cell Lines. CHO PathHunter cells expressing enzyme acceptor (EA)-tagged β -arrestin2 PK-tagged human μ -opioid receptor (CHO- μ) were from DiscoverX (Fremont, CA). PathHunter is a trademark of DiscoverX.^{13,14} Cells were grown in F-12 media (Invitrogen 11765), containing Hyclone FBS 10%, Hygromycin 300 μ g/mL (Invitrogen 10687), G418 800 μ g/mL (Invitrogen 10131), and maintained at 37 °C in a humidified incubator containing 5% CO₂. These cells were used for the β -arrestin recruitment assays. C6 rat glioma cells stably expressing the rat μ -opioid receptor (C6- μ) were generated as described previously.¹⁵ Cells were maintained in Dulbecco's Modified Eagle Medium (DMEM) supplemented with 10% fetal bovine serum (FBS) and 1% penicillin/streptomycin with G418 to maintain μ -opioid receptor expression. Membranes prepared from these cells were used for the radioligand binding and guanosine 5'-O-[γ -thio]triphosphate (GTP γ ³⁵S) assays as described below.

Membrane Preparation. Confluent C6 rat glioma cells stably expressing rat μ -opioid receptor (C6- μ) were rinsed with phosphate buffered saline and then detached using harvesting buffer (20 mM 4-(2-hydroxyethyl)-1-piperazineethanesulfonic

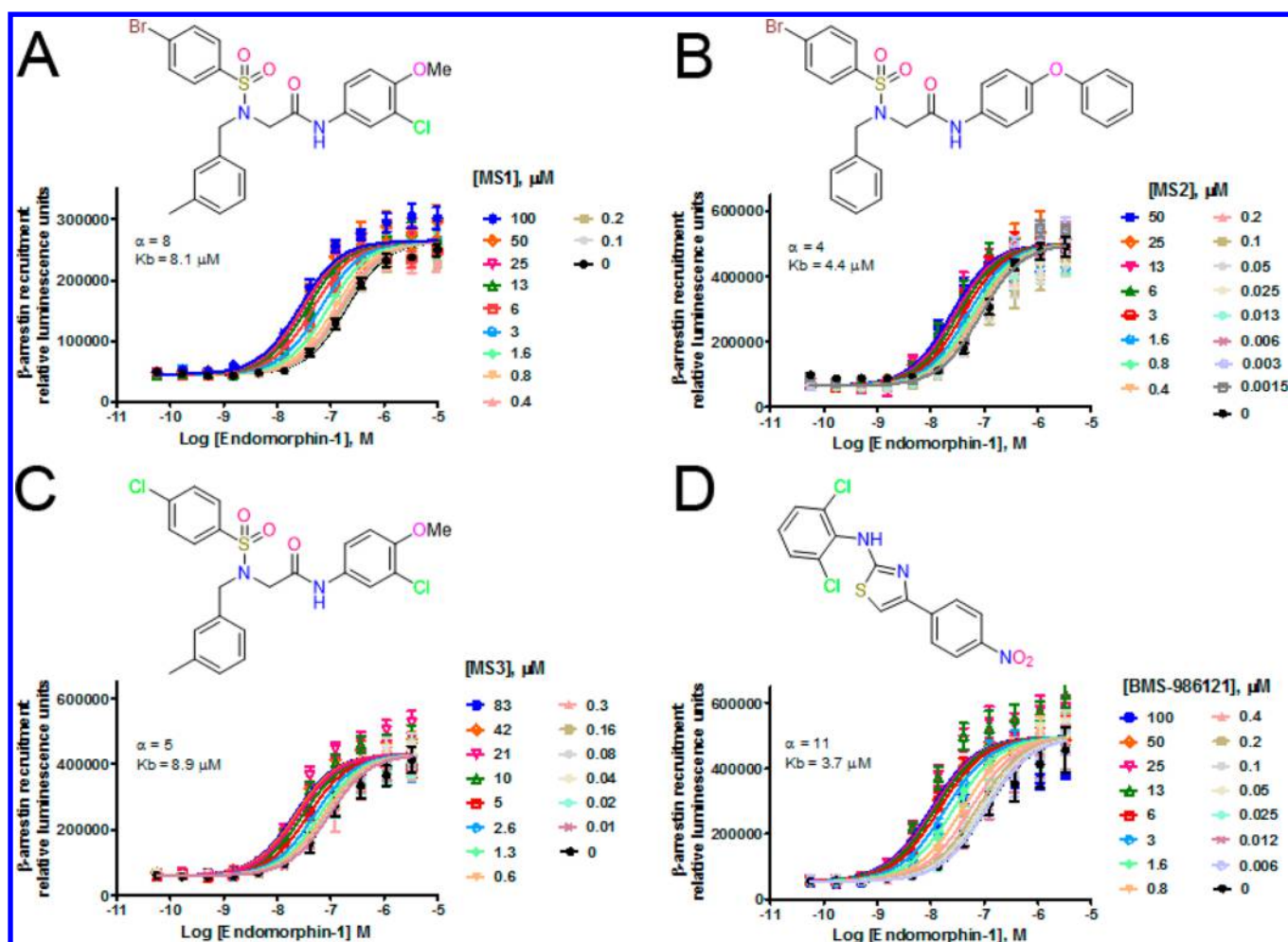


Figure 2. Allosteric EC_{50} shifts of endomorphin-1-stimulated β -arrestin recruitment in CHO- μ PathHunter cells in the presence of increasing concentrations of PAM: MS1 (A), MS2 (B), MS3 (C), and BMS-986121 (D). K_b = calculated binding affinity of PAM to free receptor; α = allosteric cooperativity factor.

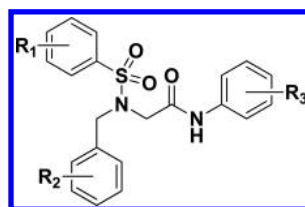
acid (HEPES) pH 7.4, 0.68 mM ethylenediaminetetraacetic acid (EDTA), and 150 mM NaCl). Cells were pelleted following centrifugation at 300g for 3 min at room temperature. The supernatant was discarded and the pellet was resuspended in ice-cold 50 mM Trizma buffer, pH 7.4. The pellet was homogenized using a Tissue Tearor and then centrifuged at 20000g for 20 min at 4 °C. The supernatant was discarded and the pellet was resuspended, homogenized, and centrifuged once more. The final pellet was homogenized in 50 mM Trizma, pH 7.4 using a glass dounce homogenizer and aliquots were flash frozen and stored at -80 °C until use in assays. Concentration of protein was determined using a bicinchoninic acid assay (BCA) protein assay with bovine serum albumin as the standard.

Materials. PathHunter detection reagents were from DiscoverX (Fremont, CA). Cell culture media and supplements were from Life Technologies (Carlsbad, CA). All other chemicals, unless otherwise specified, were purchased from Sigma (St. Louis, MO).

PathHunter β -Arrestin Assay. Confluent flasks of CHO- μ PathHunter cells were harvested with TrypLE Express, and resuspended in F-12 media supplemented with 10% FBS and 25 mM HEPES, at a density of 6.67×10^5 cells/mL and plated (3 μ L/well) into white solid tissue culture (TC)-treated 1536-well plates (3727BC, Corning, NY). Plates were incubated over-

night at 37 °C in a humidified incubator containing 5% CO_2 . The next day, compounds (40 nL of 100 \times final concentration in 100% DMSO) were added to cell plates by acoustic dispense using an Echo-550 (Labcyte, Sunnyvale, CA) from Echo-qualified 1536-well source plates (Labcyte). Next, 1 μ L of either: assay buffer (Hanks Balanced Salt Solution (HBSS) with 25 mM HEPES, and 0.05% bovine serum albumin, pH 7.4) (agonist mode); or assay buffer containing a low concentration ($\sim 4 \times EC_{20}$) of the orthosteric agonist endomorphin-1 (PAM mode); or a higher concentration ($\sim 4 \times EC_{50}$) of endomorphin-1 (NAM mode); or a low concentration of endomorphin-1 ($\sim 4 \times EC_{20}$) plus 40 μ M BMS-986122 (10 μ M final) (SAM mode) were added to assay plates. Plates were covered with a lid and incubated at room temperature for 90 min. Incubations were terminated by the addition of 2 μ L PathHunter Reagent (DiscoverX). One hour later, luminescence was detected using a Viewlux imaging plate reader (PerkinElmer, Cambridge, MA).

Radioligand Binding Assay. Displacement of 3H -diprenorphine (DPN) ($K_d = 0.15$ nM) by increasing concentrations of orthosteric ligand was measured in the presence of vehicle (1% DMSO) or allosteric ligand. Briefly, C6- μ cell membranes (10 μ g/well, prepared as described above) were incubated in a buffer (50 mM Trizma base pH 7.4, 1 mM EDTA, 5 mM $MgCl_2$, 100 mM NaCl) containing

Table 1. Structure Activity Relationship of a New μ -PAM/SAM Chemotype in a PathHunter β -Arrestin Recruitment Assay

sample ID	R1	R2	R3	EC ₅₀ , μ M (PAM/SAM mode) ^a	PAM mode Y _{max} %	activity
MS1	4-Br	H	3-Cl,4-MeO	6.5	85.1	PAM
MS2	4-Br	H	4-PhO	6.2	109.2	PAM
MS3	4-Cl	3-Me	3-Cl,4-MeO	5.7	44.6	PAM
MS4	4-Br	H	3-Cl	3.9	32.4	PAM
MS5	3-Me,4-MeO	H	3-Cl,4-MeO	4.7	21.0	PAM
MS6	4-Me	H	3-Cl,4-MeO	5.3	21.8	PAM
MS7	4-Br	H	4-MeO	5.4	22.1	PAM
MS8	4-Cl	H	4-EtO	6.4	31.8	PAM
MS9	4-F	H	3-Cl,4-MeO	7.0	24.0	PAM
MS10	4-Cl	H	4-MeO	8.9	26.4	PAM
MS11	4-OMe	H	3-Br	14.5	33.0	PAM
MS12	4-Me	4-Me	3-Cl,4-MeO	21.9	10.3	PAM
MS13	H	H	3-Br	> 30	20	PAM
MS14	H	H	3-Cl,4-MeO	76.1	28.4	PAM
MS15	H	2,4-di-Cl	3-Cl,4-MeO	6 ^a	NA ^b	SAM
MS16	4-Cl	H	3-MeO	6.5 ^a	NA ^b	SAM
MS17	H	4-F	3-Cl,4-MeO	6.9 ^a	NA ^b	SAM
MS18	4-Me	H	4-MeO	14.4 ^a	NA ^b	SAM
MS19	H	4-Me	3-Cl	16.2 ^a	NA ^b	SAM
MS20	H	4-Cl	4-MeO	16.6 ^a	NA ^b	SAM
MS21	H	4-Cl	3-Me	21.2 ^a	NA ^b	SAM
MS22	H	4-Br	4-MeO	22.7 ^a	NA ^b	SAM
MS23	4-Cl	H	3-Cl,6-MeO	23.5 ^a	NA ^b	SAM
MS24	H	4-Cl	3-Cl,4-MeO	24.2 ^a	NA ^b	SAM
MS25	H	4-Cl	2-MeO,5-Me	27.7 ^a	NA ^b	SAM
MS26	4-Cl	H	2-MeO,5-Me	>30 ^a	NA ^b	SAM
MS27	H	4-Me	3-Cl,4-MeO		NA ^b	inactive
MS28	4-MeO	H	2-CF3		NA ^b	inactive

^aSAM compounds were detected by incubating a serial dilution of the compound with cells in the presence of an EC₂₀ of endomorphin-1 plus an EC₈₀ of BMS-986121 PAM. Under these conditions, the SAM compound acts as an antagonist of PAM binding, reducing PAM activity. Control PAMs: BMS-986121 (EC₅₀ 2.2 μ M, Y_{max} 86%) and BMS-986122 (EC₅₀ 16.2 μ M, Y_{max} 108%). ^bNA = not active in PAM mode.

orthosteric ligand, allosteric ligand (or vehicle), 10 μ M GTP γ S, and ³H-DPN (0.2–0.3 nM) for 60–90 min shaking at room temperature. Nonspecific binding was assessed in the presence of 10 μ M naloxone. Reactions were terminated by rapid filtration through glass microfiber GF/C filters (Whatman) using a Brandell harvester and washed three times using ice-cold 50 mM Trizma buffer pH 7.4. Filters were dried and radioactivity was measured using liquid scintillation counting with EcoLume liquid scintillation cocktail (MP Biomedicals) in a Wallac 1450 MicroBeta counter.

GTP γ ³⁵S Binding Assay. C6- μ cell membranes (10 μ g/well; prepared as described above) were incubated for 1 h at 30 °C in a buffer (see composition above) containing 30 μ M guanosine diphosphate (GDP), 0.10 nM GTP γ ³⁵S, orthosteric ligand, and allosteric ligand (or vehicle). Basal binding was measured in the absence of orthosteric ligand and maximal binding was determined using 10 μ M DAMGO. The reaction was terminated and counted using filtration onto glass fiber filters and liquid scintillation counting as described above.

Data Analysis. Concentration response data were fit to a logistic eq 1 using nonlinear regression analysis to provide

estimates of Y_{min} (bottom), Y_{max} (top), potency (EC₅₀), and slope factor (Hill slope), using GraphPad Prism 5.01 (sigmoidal dose response with variable slope).

$$Y = \text{bottom} + (\text{top} - \text{bottom}) / (1 + 10^{((\log \text{EC}_{50} - X) \times \text{Hill slope})}) \quad (1)$$

The β -arrestin curve shift assays in Figure 2 were analyzed using an allosteric ternary complex model (Graphpad Prism 5.01 Dose response-Special-Allosteric EC₅₀ shift), to determine log K_b and the cooperativity factor (α) of the PAMs.

Calculation and Statistical Analysis of Physicochemical Properties. The Schrödinger Suite 2014-4 was used to calculate the physicochemical properties of the 14 PAMs and 12 SAMs listed in Table 1. The two-dimensional (2D) sketcher tool of Maestro 10.0 was used to draw 2D structures of each of these 26 compounds, which were imported as 3D structures into LigPrep v3.2 with protonation states assigned at physiological pH using Epik v3.0. Fifty-two physicochemical properties were calculated using QikProp v4.2. Among them, 42 properties (see Tables S2 and S3) displayed nonzero

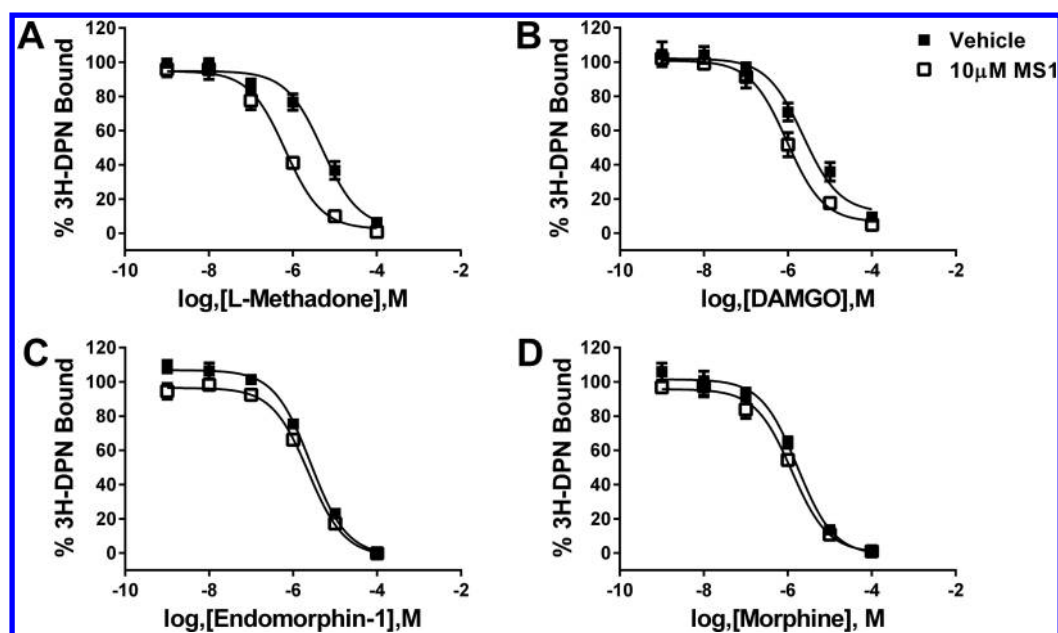


Figure 3. Effects of MS1 on the binding of various orthosteric μ -opioid receptor agonists. Displacement of ^3H -DPN by L-methadone (A), DAMGO (B), endomorphin-1 (C), and morphine (D) was measured in the presence of vehicle (■) or 10 μM MS1 (□) using C6- μ cell membranes.

variance across the 26 ligands calculated, and were therefore used for statistical analysis.

The `bayesglm` function in the “arm” R package was used to build a Bayesian logistic regression model for the classification of the PAM versus SAM activities at the μ -opioid receptor (see Table 1) based on their calculated physicochemical properties (see Table S2). Specifically, PAMs and SAMs were assigned effective values of 1 and 0, respectively, and the logistic model was built to predict numerical effective values for these compounds, ideally 0.5–1.0 for PAMs and 0–0.5 for SAMs. Binomial distribution was selected as the error distribution model. All models containing combinations of up to five properties (without interaction terms) were estimated, and the best linear model was selected based on the Akaike Information Criterion (AIC).

Ligand-Based 3D Pharmacophore Modeling. Ligand-based 3D pharmacophore modeling was performed using the PHASE workflow within the Schrödinger Suite 2014-4 and the same set of PAMs and SAMs reported in Table 1. First, thorough conformational sampling of these ligands was performed using the ConfGen search method, which produced about 50 conformations for each ligand. Classical pharmacophoric features were identified in the ligand dataset, specifically: hydrogen bond acceptors (A), hydrogen bond donors (D), hydrophobic groups (Hyd), and aromatic rings (R). Common 3D pharmacophore hypotheses were then generated by PHASE version 4.1 using all PAMs in Table 1, and requesting an exact match for the top three most active PAMs. These common pharmacophoric hypotheses were then scored based on optimal alignment between the PAMs of Table 1 and the pharmacophoric features. The default active survival scoring function that corresponds to $1 \times \text{vector score} + 1 \times \text{site score} + 1 \times \text{volume score} + 1.1 \times (\text{number of matches} - 1)$ was used for this evaluation. The hypotheses were further filtered so that the root-mean-square deviation (RMSD) of PAMs to the pharmacophore features was no more than 1.2 Å. SAMs were also aligned to each qualifying pharmacophore hypothesis

model to derive their alignment fitness scores (as the sum of vector, site, and volume scores).

RESULTS

Discovery and Structure–Activity Relationship of a New μ -PAM/SAM Chemotype. In the hunt for more active allosteric modulators of the μ -opioid receptor, we searched the eMolecules database for analogs of the recently identified μ -PAMs BMS-986121 and BMS-986122,⁷ including significantly different chemical scaffolds. Clustering of the resulting 1336 molecules (Table S1) led to their grouping into 7 clusters (Figure 1). While cluster 1 contained 2 elements and clusters 3, 5, and 6 contained 1 element only, clusters 2, 4, and 7 were highly populated (see Figure 1). Specifically, clusters 4 and 7 contained 353 and 660 close analogs of BMS-986122 and BMS-986121, respectively, whereas the 318 molecules of cluster 2 corresponded to a significantly different chemotype (e.g., compare MS1 to BMS-986122 and BMS-986121 in Figure 1). Additional analogs of this new chemotype were retrieved through a chemical similarity search to MS1 in both the eMolecules and ZINC databases (see Methods for details).

Twenty-eight of these compounds were purchased for experimental testing, and the results of a primary screen based on a PathHunter β -arrestin recruitment assay are shown in Table 1. While none of these compounds displayed agonist activity alone, all of them but two (i.e., MS27 and MS28) displayed PAM or SAM activity in the presence of low concentration of endomorphin-1, a μ -opioid receptor agonist. No NAM activity (inhibition of an EC_{50} concentration of endomorphin-1) was detected (data not shown). As shown in Table 1, most PAMs had low potencies in the single and low double digit μM range with efficacy (Y_{max}) values below 40% compared to endomorphin-1 maximal stimulation. The exceptions were MS1, MS2, and MS3, which displayed a Y_{max} value larger than 44% in PAM mode with EC_{50} values in the single digit μM range. The Y_{max} activity gives an indication of the degree of cooperativity exhibited by these compounds suggesting that MS1, MS2, and MS3 have greater cooperativity

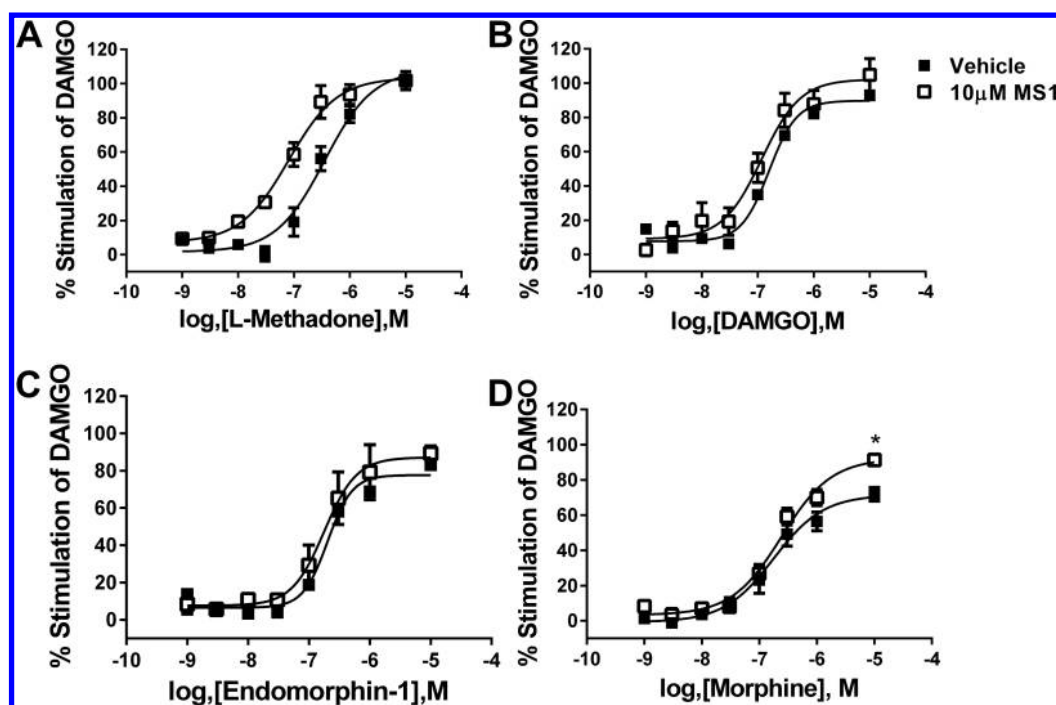


Figure 4. Effects of MS1 on the potency of various orthosteric μ -opioid receptor agonists to activate G-protein. Agonist-stimulated $\text{GTP}\gamma^{35}\text{S}$ binding was measured for L-methadone (A), DAMGO (B), endomorphin-1 (C), and morphine (D) in the presence of vehicle (■) or 10 μM MS1 (□) using C6- μ cell membranes.

compared to the other MS compounds tested. The remaining 12 compounds are either SAMs or weak PAMs judging from their reduced PAM activity. As expected, SAMs behave as competitive antagonists at the allosteric site, having little to no allosteric efficacy themselves but inhibiting the binding of a higher efficacy PAM to the allosteric binding site.

For the most efficacious MS1–MS3 compounds, we assessed the K_b and α values of cooperativity by performing full concentration–response curves of the orthosteric ligand endomorphin-1 in the presence of increasing concentrations of the allosteric compounds in the β -arrestin recruitment assay (see Figure 2). The results confirm the ability of these molecules to act as PAMs with K_b and α cooperativity values slightly weaker, but comparable, to those observed for the previously reported BMS-986121.⁷

The allosteric compound with the highest α value of cooperativity, MS1, was analyzed further in competition binding and G-protein activation assays to understand its effects on ligand binding and to investigate the nature of its probe dependence. Saturation binding using the neutral antagonist ^3H -diprenorphine (^3H -DPN) was performed in cell membranes prepared from C6 glioma cells stably expressing rat μ -opioid receptor (Figure 3). The K_d of ^3H -DPN was unchanged in the presence of 10 μM MS1 (K_d with veh = 0.25 ± 0.10 nM; K_d with MS1 = 0.35 ± 0.15 nM, data not shown). In contrast, MS1 was able to enhance the affinity of the agonist L-methadone to bind μ -opioid receptor (Figure 3A). The K_i of L-methadone in the absence or presence of 10 μM MS1 was enhanced by 7-fold (K_i in the presence of vehicle = 1177 ± 329 nM; K_i in the presence of MS1 = 161 ± 38 nM; $p = 0.04$). Notably, MS1 exhibited strong probe dependence in that it failed to alter the affinity of the agonists DAMGO, endomorphin-1, and morphine to bind μ -opioid receptor (Figure 3B–D).

In addition to binding, the ability of MS1 to alter the activity of μ -opioid receptor agonists was investigated using $\text{GTP}\gamma^{35}\text{S}$ binding in C6- μ cell membranes. Although MS1 (up to 30 μM) failed to have any activity alone (data not shown), the presence of 10 μM MS1 enhanced the potency of L-methadone to activate G-protein by over 4-fold (Figure 4A) but had no effect on the degree of maximal stimulation. Again, MS1 showed strong probe dependence and failed to alter the potency or maximal stimulation of DAMGO and endomorphin-1 to activate G-protein (Figure 4B,C, respectively). However, MS1 did enhance the maximal activation by morphine to that of a full agonist while having no effect of morphine's potency (Figure 4D). The lack of effect of MS1 on endomorphin-1 stimulation of $\text{GTP}\gamma^{35}\text{S}$ binding was unexpected in view of the enhancement of endomorphin-1 recruitment of β -arrestin, but is in line with reports that the endomorphins are arrestin-biased agonists.^{16,17}

Molecular Descriptors of μ -PAMs/SAM and Their Statistical Analysis. We calculated fifty-two physicochemical properties for each of the 14 μ -PAMs and 12 μ -SAMs reported in Table 1. The numerical values of those descriptors that displayed nonzero variance across these twenty-six ligands (Table S2) are reported in Table S3. Considering combinations of up to 5 descriptors, Bayesian logistical regression analysis identified four descriptors that could best separate between μ -PAMs and μ -SAMs as assessed experimentally. Specifically, the best linear model according to AIC (Table S4) resulted from using the following four properties: the predicted central nervous system activity (CNS), the conformation-independent predicted aqueous solubility (CIQPlogS), the Parameterized Model Number 3 (PM3)-calculated electron affinity (EA.eV), and the van der Waals surface area of polar nitrogen and oxygen atoms and carbonyl carbon atoms (PSA). Using this model, only four (MS12, MS13, MS14, and MS23) out of twenty-six compounds could not be confidently assigned the same μ -PAM

or μ -SAM activity inferred from experiments owing to their predicted effect value below or above an arbitrary 0.5 cutoff, respectively (Table S5). The remaining 11 PAMs exhibited calculated average values of -0.82 ± 0.40 , -7.12 ± 0.75 , $+1.07 \pm 0.14$, and $+76.51 \pm 3.62$ for CNS, CIQPlogS, PM3, and EA.eV., respectively, whereas the remaining 11 SAMs had corresponding values of -0.91 ± 0.54 , -6.54 ± 0.51 , $+0.94 \pm 0.08$, and $+74.04 \pm 2.78$.

Common 3D-Pharmacophore of μ -PAMs. We built a ligand-based 3D pharmacophore model to elaborate further on the molecular and structural determinants that differentiate μ -PAMs from μ -SAMs. The best 3D pharmacophore model of this kind (Figure 5) includes: (i) two H-bond acceptors (i.e.,

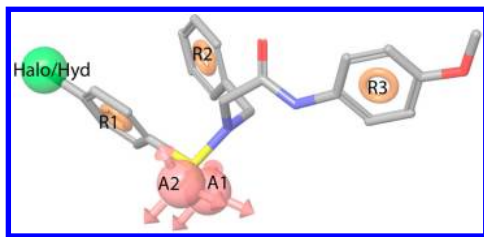


Figure 5. Ligand-based 3D pharmacophore model built from μ -PAMs shown in Table 1. The best 3D pharmacophore model that separates μ -PAMs and μ -SAMs includes two H-bond acceptors (i.e., the two oxygen atoms of the sulfur dioxide group), one halogen substituent or hydrophobic group (i.e., R1 = Br, Cl, Me; see Table 1), and three aromatic rings related by specific distances and angles listed in Tables S6 and S7.

the two oxygen atoms of the sulfur dioxide group) labeled A1 and A2 in the figure, (ii) one halogen substituent or hydrophobic group (i.e., R1 = Br, Cl, Me; see Table 1) labeled Halo/Hyd in the figure, and (iii) the three aromatic rings R1–R3 related by the distances and angles reported in Tables S6 and S7, respectively. Using this model, all μ -PAMs (but MS13) could be separated from all μ -SAMs (but MS16 and MS23) according to an arbitrary cutoff of 1.7 for the pharmacophore alignment fitness scores (see Table S8). In the case of MS13, an optimal alignment of this compound to the best pharmacophore model could not be found because of competition in the alignment between the hydrophobic substituent on ring 3 (R3) and that of ring 1 (R1). Although MS16 and MS23 could indeed be successfully aligned to the pharmacophore model, the R3 methoxy substitution at the ortho- position might interfere with the position of the ligand amide atoms although it is also possible that the R3 methoxy substitution at ortho- or meta- positions clashes with the receptor environment. More sophisticated strategies than simple docking are currently being tested in our lab to be eventually be able to support or dispute unambiguously this possibility.

DISCUSSION

Recently, attention has shifted to allosteric rather than orthosteric opioid ligands as a means of potentially providing effective pain relief that is free from debilitating adverse effects.⁵ These allosteric modulators are expected to be receptor type selective, and to act by enhancing the antinociceptive activity of endogenous opioid ligands. Therefore, μ -opioid receptor PAMs may have fewer on-target side effects and overdosing risks, and may produce less tolerance and dependence than currently used opioid agonists. It has been suggested that opioid ligands that bias receptor signaling toward the G-protein mediated

pathway instead of β -arrestin2 may be therapeutically beneficial.¹⁸ Whether caused by the receptor conformational plasticity, allostereism, or dimerization/oligomerization, this G-protein-biased agonism has been suggested to remove the on-target side effects such as drug tolerance associated with the μ -opioid receptor internalization (e.g., see ref 5). The current findings with endomorphin-1 suggest that the μ -opioid receptor PAM MS1 may promote signaling bias in the opposite direction (favoring β -arrestin versus G-protein activation), at least with this peptide. Further studies are needed in order to understand more fully both the signaling bias and probe-dependence of this PAM, and to determine whether these properties can be altered through modifications to the chemical structure.

The only two known μ -PAMs at the time of this work, i.e., BMS-986121 and BMS-986122, are limited in their ease of synthesis. Not only is the new allosteric modulator chemotype we identified easier to derivatize by synthetic chemistry, and offering an additional point of diversity for structure–activity relationship studies compared to previously published compounds, but the new scaffold increases the chemical diversity of known ligands for the allosteric site of the μ -opioid receptor. However, undesirable “off-target” effects may still be present for this scaffold, and must be evaluated before further development.

In competition binding and G-protein activation assays, MS1 displayed marked probe dependence. Indeed, the largest effects of MS1 were seen with L-methadone. The prototype μ -PAM BMS-986122 also showed the highest levels of cooperativity with methadone and its isomers.¹⁹ Because MS1 is a new scaffold, this similar probe dependence may be reflective of a similar mechanism of action and/or mode of binding. In addition, MS1 enhanced the maximal activation of the partial agonist morphine to activate G-protein. This again fits with the probe dependence of BMS-986122 in which the efficacy of partial agonists was increased. The mechanism of BMS-986122 action was found to be through allosteric disruption of sodium ion binding¹⁹ and it would be interesting to determine if this new chemotype also functions in a similar manner.

Cheminformatics analysis of the set of newly identified μ -PAMs and μ -SAMs suggested that physicochemical properties such as the predicted CNS, the CIQPlogS, the EA.eV., and the PSA may be used as searching criteria to identify additional compounds with potential PAM activity at μ -opioid receptors. Specifically, our best statistical model shows that μ -PAMs have higher predicted values of central nervous system activity, PM3-calculated electron affinity, and van der Waals surface area of polar nitrogen and oxygen atoms and carbonyl carbon atoms, but lower calculated values of conformation-independent predicted aqueous solubility, compared to μ -SAMs. However, it must be kept in mind that the dataset we used is limited in number and no thorough cross-validation of the presented statistical models could be performed. Although the same limitation exists for the predicted common 3D pharmacophore model of μ -PAMs vs μ -SAMs, the suggested model can be used as an initial criterion to either design more highly potent derivatives of the newly identified μ -PAM or to search for completely different chemotypes that retain the same pharmacophore features. These inferences can and will eventually be combined with structural studies using the crystal structure of the active μ -opioid receptor that has appeared in the literature during review of this paper.²⁰ In the meantime, additional ligand-based studies are ongoing in our laboratories to optimize the newly identified chemotype and to explore the

potential of this scaffold for the development of new therapeutics.

■ ASSOCIATED CONTENT

■ Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.jcim.5b00388.

Table S1 provides a list of the 1336 molecules identified in eMolecules as close analogs of BMS-986121 and BMS-986122. Table S2 provides a list of the physicochemical properties displaying nonzero variance across the twenty-six ligands shown to have either a PAM or a SAM activity at the μ -opioid receptor. Table S3 reports calculated values of the physicochemical properties displaying nonzero variance across the twenty-six ligands with a μ -PAM or μ -SAM activity. Table S4 reports the statistics of the best predictive model for PAM/SAM differentiation based on Bayesian logistic regression analysis of combinations of up to 5 descriptors. Table S5 reports the predicted effect values of MS1-MS26 based on Bayesian logistic regression analysis of combinations of up to five descriptors. Table S6 and S7 provide distance and angle measurements for the best pharmacophore model, respectively. Table S8 reports values of the best pharmacophore alignment fitness (PDF).

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Notes

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