



Article

Molecular Docking Assessment of Cathinones as 5-HT_{2A}R Ligands: Developing of Predictive Structure-Based Bioactive Conformations and Three-Dimensional Structure-Activity Relationships Models for Future Recognition of Abuse Drugs

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Abstract: Commercially available cathinones are drugs of long-term abuse drugs whose pharmacology is fairly well understood. While their psychedelic effects are associated with 5-HT₂AR, the enclosed study summarizes efforts to shed light on the pharmacodynamic profiles, not yet known at the receptor level, using molecular docking and three-dimensional quantitative structure–activity relationship (3-D QSAR) studies. The bioactive conformations of cathinones were modeled by AutoDock Vina and were used to build structure-based (SB) 3-D QSAR models using the Open3DQSAR engine. Graphical inspection of the results led to the depiction of a 3-D structure analysis-activity relationship (SAR) scheme that could be used as a guideline for molecular determinants by which any untested cathinone molecule can be predicted as a potential 5-HT₂AR binder prior to experimental evaluation. The obtained models, which showed a good agreement with the chemical properties of co-crystallized 5-HT₂AR ligands, proved to be valuable for future virtual screening campaigns to recognize unused cathinones and similar compounds, such as 5-HT₂AR ligands, minimizing both time and financial resources for the characterization of their psychedelic effects.

Keywords: cathinones; 5-HT2AR; molecular docking; 3-D QSAR

1. Introduction

The aminergic family of G-protein coupled receptors (GPCRs) physiologically respond to hormonal and neurotransmitter stimuli by activating internal signal

Citation: Tomašević, N.; Vujović, M.; Kostić, E.; Ragavendran, V.; Arsić, B.; Matić, S.L.; Božović, M.; Fioravanti, R.; Proia, E.; Ragno, R.; et al. Molecular Docking Assessment of Cathinones as 5-HT2AR Ligands: Developing of Predictive Structure-Based Bioactive Conformations and Three-Dimensional Structure-Activity Relationships Models for Future Recognition of Abuse Drugs. *Molecules* **2023**, *28*, 6236. https://doi.org/10.3390/ molecules28176236

Academic Editor: Dmitri B. Kireev

Received: 3 August 2023 Revised: 21 August 2023 Accepted: 22 August 2023 Published: 24 August 2023



Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https://creativecommons.org/license s/by/4.0/). transduction pathways and cellular responses [1], thus representing a valuable target class for drug discovery [2]. The 5-HT receptors (5-HTRs), as the largest subfamily of GPCRs, are activated by the neurotransmitter and neuromodulator serotonin (i.e., 5-hydroxytryptamine, 5-HT). After being biosynthesized in the intestine from tryptophan, the hormonal behavior of 5-HT in the periphery is associated with mitogenesis and the proliferation of fibroblast cells [3], homeostasis of glucose and lipid metabolism [4], enhanced arterial contraction during cardiac hypertrophy [5,6], bronchoconstriction [7], rhythmic breathing, and circadian rhythms [8], as well as pain, increased appetite, body temperature, etc. [9]. Nevertheless, small amounts of serotonin are biosynthesized in the axons of brain neurons, where 5-HT acts within the CNS (i.e., neocortex and hippocampi of the brain) as a major site for the expression of 5-HT receptors (5-HTRs), regulating mood, social cognition [10], neurogenesis [11], short- and long-term memory [12], spatial memory that enables navigation, sexual behavior, impulsivity, aggression, and migraine attacks [13,14].

At least 14 different serotonin receptors (5-HTRs), divided into seven subgroups (i.e., 5-HT₁₋₇R), constitute the serotonergic system, primarily located on the membranes of either presynaptic or postsynaptic neurons [15]. The studied 5-HT₂AR here (Figure 1), together with the 5-HT₂BR and 5-HT₂cR, is expressed on the postsynaptic membrane and acts as a mediator between the extracellular physiological ligand serotonin and intracellular G-proteins [1,16]. Activation of the 5-HT₂AR by 5-HT induces the involvement of the G α_i , G $\alpha_{q/11}$, or G α_s proteins and subsequently increases the cellular levels of inositol triphosphate (IP3) and diacylglycerol (DAG) [17]. The 5-HT₂AR-mediated pharmacology distinguishes the macromolecule as a drug target in the treatment of Parkinson's and Alzheimer's diseases, as well as mental disorders such as schizophrenia, bipolar disorder, depression, anxiety, and insomnia [16]. On the other hand, the 5-HT₂AR is also a target for a variety of recreational drugs, mediating the effects of potent psychoactive substances such as lysergic acid diethylamide (LSD) or amphetamines, commonly known as psychedelics or hallucinogens [1,18].



Figure 1. Left: The crystal structure of 5-HT_{2A}R in complex with LSD (as deposited at PDB, https://www.rcsb.org/, PDB ID: **6HWT** [16], accessed on 1 December 2022). LSD is depicted in blue encircled by the transparent sphere, TM1 (residues 69–101) is colored in blue, TM2 (residues 111–137) is depicted in plum, TM3 (residues 114–179) is painted in orange, TM4 (residues 188–217) is colored in lime green, TM5 (residues 231–265) is depicted in dark red, TM6 (residues 315–349) is painted in violet-red, TM7 (residues 353–383) is colored in dark grey, intracellular amphipathic helix H8 (residues 384–399) is depicted in yellow, two intracellular loops ICL1 and ICL2 (residues 102–111 and 179–187) are illustrated in cyan and hot pink, respectively, three extracellular loops ECL1,

ECL2, and ECL3 (residues 134–138, 218–230, and 350–352) are labeled in gold, dim gray, and dark slate gray, respectively; Right: The crystal structure of 5-HT_{2A}R immersed into dipalmitoylphosphatidylcholine (DPPC) lipid bilayer (as deposited at OPM, https://opm.phar.umich.edu/, entry: 4282, accessed on 2 March 2023): the DPPCs are illustrated with transparent gray spheres, oxygen atoms from water molecules are colored in red, sodium atoms are presented as pink spheres, and chlorine atoms are described as green spheres. For the clarity of the presentation, hydrogen atoms were omitted.

Although a significant number of ligands co-crystallized with 5-HT_{2A}R were available and deposited in the Protein Data Bank at the start of this investigation (Table 1, 13 ligands found in 14 complexes), only nine of them were homogeneously associated with inhibition constants (i.e., *K*_is) and thus were insufficient for the development of broad and computationally applicable medicinal chemistry models. Therefore, attention was focused on the literature concerning amphetamines and their β-keto analogs cathinones, as compounds known to exert 5-HT_{2A}R-mediated psychedelic effects and well characterized by corresponding inhibition constants (Table 2), to elucidate their hitherto unknown binding modes and to describe their pharmacodynamic properties using 3D QSAR models. The 5-HT_{2A}R ligands (besides those found co-crystallized within 5-HT_{2B}R, Table 1) were further used either for defying structure-based alignment assessment (SBAA) rules, which were further employed for the generation of bioactive conformations of cathinones, or as an ultimate prediction test set (TSCRY) for external validation of 3-D QSAR models (see further discussion).

As natural products of the khat plant (Catha edulis (Vahl) Forssk. ex Endl.), cathinones were initially structurally optimized for the medical treatment of parkinsonism, obesity, and depression, but are now used as "legal highs" (also known as "bath salts", "research chemicals not for human consumption", or "plant food") [19]. Recently developed DFTbased protocols have successfully reproduced experimental spectral data of selected synthetic cathinones (SCs) and can be further used for the identification/prediction of physicochemical parameters of either known or new SCs, even in forensic applications [20]. SCs primarily target presynaptic plasma membrane transporters for dopamine, norepinephrine, and serotonin (DAT, NAT, and SERT, respectively) [21]. Nevertheless, they increase the concentration of 5-HT in the synaptic space, providing the basis for CNS stimulatory and sympathomimetic effects characterized by increased blood pressure, heart rate, mydriasis, and hyperthermia [22]. As monoamine releasers, they enhance neurotransmitter transmission and increase synaptic concentrations; as monoamine reuptake inhibitors, they prevent the return of neurotransmitters to presynaptic neurons and consequent metabolic degradation while simultaneously activating monoamine receptors within the limbic-corticostriatal pathway [23].

The signaling and neurobehavioral effects of hallucinogens are associated with a 5-HT_{2A}R expression on cortical layer V pyramidal neurons [17,24], suggesting the investigation of **SCs** as potential ligands for this receptor. Through 5-HT_{2A}R binding, **SCs** can induce euphoria, increased empathy, sociability, energy, and alertness, but also rhabdomyolysis and autonomic symptoms such as tachycardia, hypertension, hyperthermia, ecstasy, sociability, alertness, empathy, and increased energy [21,22]. However, when taken at higher doses or for longer periods, stimulants can cause many psychiatric symptoms, including anxiety, agitation, and fear, which can progress to psychosis (delusions and hallucinations) and delirium [19,22]. Compared with amphetamines, several **SCs**, such as α -PPP (**9**) and MDPV (**14**) (Table 1), have more severe psychiatric side effects [21].

Since the mechanisms by which **SCs** exert the above-described effects as 5-HT₂AR ligands are not yet fully understood and defined, the present study investigated the putative bioactive conformations and structure-based (SB) pharmacodynamic profiles of **SCs** (Table 2). The binding modes of the **SCs**, explored by molecular docking and 3-D QSAR studies were associated with their reported pharmacological profiles, providing a basis for the elucidation of the psychedelic or hallucinogenic effects of the **SCs** at the molecular level. Derived SB 3-D structure–activity relationships were found in good agreement with various ligands, either reported in the literature or experimentally resolved as 5-HT₂AR ligands, for which the obtained results can be used in future virtual screening campaigns to reveal new **SCs** and similar compounds not yet recognized as 5-HT₂AR ligands, minimizing both time and financial resources for the characterization of their potential psychedelic effects.

2. Results and Discussion

2.1. Crystal Dataset Compilation

The experimentally resolved complexes of ligands co-crystallized with either 5-HT_{2A}R or 5-HT_{2B}R (Table 1) were retrieved from the Protein Data Bank (PDB, https://www.rcsb.org/, accessed on 1 December 2022). Fourteen experimental 5-HT_{2A}R/ligand complexes were assembled, including the full 5-HT_{2A}R antagonists (FAs) and antipsychotics risperidone (PDB ID: **6A93**) [16], and zotepine (PDB ID: **6A94** [16]), a 5-HT_{2A}R agonist (AG) and psychotic LSD (PDB IDs: **6WGT** [25] and **7WC6** [26]), the inverse agonist (IA) 1-methyl-4-[(5~{S})-3-methylsulfanyl-5,6-dihydrobenzo[b][1]benzothiepin-5-yl]piperazine (PDB ID: **6WH4** [25]), the 5-HT_{2A}R agonist (3*R*)-3-methyl-5-(1*H*-pyrrolo[2,3-b]pyridin-3-yl)-1,2,3,6-tetrahydropyridin-1-ium (**7RAN** [27]), the FAs cariprazine (PDB ID: **7VOD** [28]) and aripiprazole (PDB ID: **7WCE** [28]), the AGs serotonin (PDB IDs: **7WC4** [26])psilocin (the active metabolite of psilocybin, PDB ID: **7WC5** [26]), lisuride (PDB ID: **7WC7** [26]), and FAs lumateperone (PDB ID: **7WC8** [26]), and the nonhallucinogenic psychedelic analog IHCH-7113 (PDB ID: **7WC9** [26]).

The 5-HT_{2B}R ligands were AGs ergotamine (PDB IDs: **4IB4** [29], **4NC3** [30] and **5TUD** [31]), LSD (PDB IDs: **5TVN** [31], **7SRR** [32] and **7SRS** [32]), the agonists *N*,*N*-diethyl-*N'*-[(α)-6-methyl-9,10-didehydroergolin-8-yl]urea (PDB ID: **6DRX** [33]), (8 β)-*N*-[(25)-1-hydroxybutan-2-yl]-6-methyl-9,10-didehydroergoline-8-carboxamide (PDB ID: **6DRY** [33]), (8 α)-*N*-[(25)-1-hydroxybutan-2-yl]-1,6-dimethyl-9,10-didehydroergoline-8-carboxamide (PDB ID: **6DRY** [33]), (8 α)-*N*-[(25)-1-hydroxybutan-2-yl]-1,6-dimethyl-9,10-didehydroergoline-8-carboxamide (PDB ID: **6DRZ** [33]), as well as FA (15)-1-[(2-chloro-3,4-dimethoxyphenyl)methyl]-6-methyl-2,3,4,9-tetrahydro-1*H*-beta-carboline (PDB ID: **6DS0** [33]).

2.2. Literature Datasets Set Compilation

The **SCs** as 5-HT_{2A}R ligands were retrieved from the literature to compile a training set (TR) (Table 2) [21,34–45], whereas the test set (TS) was compiled from listed clinically approved drugs (Table 3) [46–62] with known affinities for 5-HT_{2A}R, but with unknown binding modes for all compounds except **25** (found within the **7VOE** protein [28]). For either TR or TS compounds, analysis of the available biological data revealed a homogeneous association with potencies described as pK_{iS} (-log K_{i}). Thus, the TR included **Cathinone** (1) and its derivatives, **Flephedrone** (2), **Mephedrone** (3) (the most commonly abused cathinone, non-selective monoamine uptake inhibitor [34,35]), and **Methcathinone** (4), as likely AGs and psychedelic compounds, as well as FAs and rather antidepressive drugs **4-Bromomethcathinone** (5), **3-Bromomethcathinone** (6, [21]), **2-Fluoromethcathinone** (7), and **2-Trifluoromethoxy-methcathinone** (8), also known to act as preferential dopamine active transporter (DAT) and noradrenaline transporter (NAT) inhibitors and α_{1A} adrenoceptor agonists/antagonists [21,34].

The experimentally determined 5-HT_{2A}R IAs/FAs and non-psychostimulants pyrovalerone-based **SCs**, namely α -**PPP** (9 [21]), **4-Methyl-\alpha-PPP** (10 [21]), **4-Bromo-\alpha-PPP** (11), and **3-Bromo-\alpha-PPP** (12), were also included in the TR, alongside with **Naphyrone** (13), **MDPV** (14), **Pyrovalerone** (15), and **MDPPP** (16) as experimentally validated FAs, also known as norepinephrine and dopamine reuptake inhibitors (NRIs and DRIs, respectively) [36,37].

	Table 1. Names	, structure	es, and inf	hibition constants of co	-crystalized 5-HT2AR and 5-	HT2BR 1	igands.
PDB ID P (Mechanism) ^a	Compound's Structure	p <i>K</i> i	Ref.	PDB ID P (Mechanism) ^a	Compound's Structure	p <i>K</i> i	Ref.
	5-HT2AR ligand			7WC7 AG	HN HH	8.55	[26]
6A93 FA ª		8.16	[16]	7WC8 AG		9.27	[26]
6A94 FA		7.40	[16]	7WC9 AG		NA	[26]
6WGT 7WC6 AG	NH NH	8.63	[16] [26]		5-HT2BR ligand		
6WH4 IA	() () () () () () () () () () () () () (9.70	[25]	4NC3 4IB4 5TUD AG		8.88	[29] [29] [31]
6WHA PA		9.08	[25]	5TVN AG		NA	[31]
7RAN AG		NA ª	[27]	6DRX AG		8.88	[33]
7VOD FA		7.73	[28]	6DRY 7SRQ 7SRS 7SRR AG		9.33	[33] [32] [32] [32]
7VOE FA		8.47	[28]	6DRZ AG		10	[33]
7WC4 AG	HO THE	7.49	[26]	6DS0 FA		NA	[33]
7WC5 AG PA	OH CH	NA	[26]		,		

Table 1. Names,	, structures, and inhibition	constants of co-crystalized	5-HT2AR and 5-HT2BR ligands
		5	0

^a Pharmacology: AG-agonist, IA-inverse agonist, PA-partial agonist, FA-full antagonist

Name (Number) P (Mechanism) ª	Compound's Structure	р <i>К</i> і	Ref.	Name (Number) P (Mechanism) ª	Compound's Structure	р <i>К</i> і	Ref.
Cathinone ar	ıd its derivatives			Naphyrone (13) FA		4.96	[34]
Cathinone (1) AG ^a	NH ₂	6.00	[34]	MDPV (14) FA		4.88	[34]
Flephedrone (2) AG	F	6.00	[34]	Pyrovalerone (15) FA	N N	4.88	[34]
Mephedrone (3) AG	NH ₂	5.68	[34]	MDPPP (16) FA		4.20	[21]
Methcathinone (4) AG		5.23	[34]	Benzo[d]	Cs		
4-Bromomethcathinone (5) IA/FA	Br N	5.20	[21]	MDBD (17) AG		5.20	[34]
3-Bromomethcathinone (6) IA/FA		5.00	[21]	MDMA (18) AG	o H o N	5.11	[34]
2-Fluoromethcathinone (7) IA/FA		5.00	[21]	Butylone (19) AG		4.88	[34]
2-(Trifluoromethoxy) -methcathinone (8) IA/FA	MCF30 N	5.00	[21]	Ethylone (20) AG	ST T	4.88	[34]
Pyrovaler	one-based SCs			MDEA (21) AG	¢ to the second	4.88	MDEA AG (21)
α-PPP (9) ΙΑ/FA	O N	5.60	[21]	Methylone (22) AG	O T N	4.88	[34]
4-Methyl-α-PPP (10) ΙΑ/FΑ		5.50	[21]	5	5Cs ′ precursors		
4-Bromo-α-PPP (11) IA/FA	Br N	5.40	[21]	Amphetamine (23) AG	NH ₂	4.88	[34]
3-Bromo-α-PPP (12) IA/FA	Br	5.00	[21]	Methamphetamine (24) AG		4.88	[34]

Table 2. Names, structures, and inhibition constants of cathinones as human 5-HT_{2A}R ligands compiling the TR.

Pharmacology: AG-agonist, IA-inverse agonist, PA-partial agonist, FA-full antagonist.

Name (Number) P (Mechanism) ª	Compound's Structure	р <i>К</i> і	Ref.	Name (Number) P (Mechanism) ª	Compound's Structure	p <i>K</i> _i	Ref.
Aripiprazole (25) FA ª		8.57	[46]	Norfenfluramine (36) AG	F F NH ₂	6.82	[47]
BW-723C86 (26) AG	S C H H	7.2	[48]	Olanzapine (37) IA	N N N N N	8.88	[49]
Clozapine (27) FA		8.39	[50]	Quentiapine (38) FA		6.81	[50]
CP-809,101 (28) AG	CI CO N N NH	8.22	[51]	R060-0175 (39) IA		7.44	[48]
Ketanserin (29) FA		9.67	[52]	Risperidone (40) IA		9.69	[50]
Lorcaserin (30) AG	CI	6.95	[53]	RS-127,455 (41) FA	F C N NH2	6.03	[48]
MDL-100,907 (31) FA	P N P N	8.77	[54]	Saprogrelate (42) FA		8.52	[55]
Mesulergine (32) FA		7.34	[56]	SB-204,741 (43) FA	S H H K	5.00	[57]
Mianserin (33) FA		8.15	[58]	SB-206,553 (44) FA	N J O HN O N T T T N	5.64	[59]
Mirtazapine (34) IA	N N N	7.78	[60]	SB-242,084 (45) FA		6.07	[61]
Naftidrofuryl (35) IA	C C C C C C C C C C C C C C C C C C C	6.20	[55]	WAY-161,503 (46) AG		7.40	[62]

Table 3. Commercial names, structures, and inhibition constants of human 5-HT_{2A}R ligands compiling the TS.

^a Pharmacology: AG-agonist, IA-inverse agonist, PA-partial agonist, FA-full antagonist.

Benzo[d][1,3]dioxole-based SCs, MBDB (17), MDMA (ecstasy, 18), Butylone (19), Ethylone (20), MDEA (21), and Methylone (22) were also listed in the TRs as examples of SCs with the ability to directly bind 5-HT₂AR most likely as AGs and psychostimulants, resulting in the release of 5-HT. Of these, 18 induces excitation and hallucinogenic-like perceptual changes at higher doses [38–40], while 19, 20, and 22 are known as non-selective monoamine uptake inhibitors [33–36]. The precursors of SCs, amphetamine (23) and methamphetamine ("crystal meth", 24), likewise considered to be AGs, completed the TR compilation. Binding to 5-HT₂AR, 23 and 24 induce behavioral effects opposite to those induced by stimulation of 5-HT₁AR (5-HT₂AR-mediated depolarization vs. the 5-HT₁ARmediated hyperpolarization) [18,41]. Since the quantitative parameters for psychedelic or hallucinogenic effects, such as the onset of action (OA) and duration of action (DA), are known for only a few compounds (1–8 [35,43–45], 13, 14, and 16 [36,37], and 23 and 24 [34], Table S1, Supplementary Materials), it is not possible to derive a robust quantitative psychoactivity relationship model. Therefore, the pKis of the SCs (Table 2) were correlated with the SB bioactive conformations of their 5-HT_{2A}Rs using 3-D QSAR models, whose predictive abilities were externally validated by the compiled TS.

2.3. Definition of Optimal Protocol for the Alignment of 5-HT2AR Ligands

In the development of the CoMFA-like 3-D QSAR models, a crucial step is represented by the alignment rules [63]. Therefore, considering the lack of **SCs** co-crystallized with 5-HT_{2A}R (Table 2), their bioactive conformations were modeled using as much experimentally available structural data as possible on 5-HT_{2A}Rs and 5-HT_{2B}Rs crystallized in complexes with different ligands (Table 1) [16,25–33,64]. Attention was initially focused on lysergic acid diethylamide (LSD), the prototypical human hallucinogen, one of the most potent psychoactive (and recreational) drugs [31], and an experimentally confirmed agonist for both 5-HT_{2A}R (PDB IDs: **6WGT** and **7WC6**, [25,26] and 5-HT_{2B}R (PDB IDs: **5TVN** [31], **6DRX** [33], **7SRR** [32], and **7SRS** [32]) isoforms [64].

Regardless of the active site, LSD showed an almost constant binding conformation with the lowest root mean square deviation (RMSD) (Table 4). Sequence and active site similarities of 5-HT_{2A}R and 5-HT_{2B}R were approximately 40% and 60%, respectively (Figure 2), therefore both targets were used to establish a protocol for the alignment of **SCs** in the 5-HT_{2A}R. To this end, an alignment evaluation of ligands co-crystallized in either 5-HT_{2A}R (Figure 3a, Table 4) [16,25–28] or 5-HT_{2B}R (Figure 3b, Table 5) [29,30,32,33] was performed to establish the alignment rules to define the binding modes of TR and TS compounds. The quality of alignment was evaluated by SB 3-D QSAR models in terms of q^2 value [65].

P28223 5HT2A HUMAN P41595 5HT2B_HUMAN	MDILCEENTSLSSTTNSLMQLNDDTRLYSNDFNSGEANTSDAFNMTVDSENRTNLSCEGC MALSYRVSEL-QSTIPEHILQSTFVHVISSNNSGLQTESI ::::::::::::::::::::::::::::::::::::	60 39
P28223 5HT2A HUMAN	L-SPSCLSLLHLQEKNNSALLTAVVIILTIAGNILVIMAVSLEKKLQNATNYFLMSLAIA	119
P41595 5HT2B_HUMAN	PEEMKQIVEEQGNKLHWAALLILMVIIPTIGGNTLVILAVSLEKKLQVATNYFLMSLAVA	99
P28223 5HT2A HUMAN	DMLLGFLVMPVSHLTILYGYRNPLPSKLCAVNIYLDVLFSTASINHLCAISLDRYVAIQN	179
P41595 5HT2B_HUMAN	DLLVGLFVMPIALLTIMFEAHNPLPLVLCPANLFLDVLFSTASINHLCAISVDRYIAIKK	159
P28223 5HT2A HUMAN	PIHHSRFNSRTKAFLKIIAWHTISVGISMPIPVFGLQDOSKVFKEGSCLLADDNFVL	236
P41595 5HT2B_HUMAN	PIQANQYNSRATAFIKITVWHISIGIAIPVPIKGIETDVDNPNNITCVLTKERFGDFHL	219
P28223 5HT2A HUMAN	IGSFVSFFIPLTIHVITYFLTIKSLQKEATLCVSDLGTRAKLASFSFLPQSSLS	290
P41595 5HT2B_HUMAN	FGSLAAFFTPLAINIVTYFLTIHALQKKAYLVKNKPPQRLTNLTVSTVFQRDETPCSSPE	279
P28223 5HT2A HUMAN P41595 5HT2B_HUMAN	SEKLFQRS	338 339
P28223 5HT2A HUMAN	FFITNIMAVICKESCNEDVIGALLNVFVWIGYLSSAVNPLVYTLFNKTYRSAFSRYIQCQ	398
P41595 5HT2B_HUMAN	FFITNITLVLCD-SCNQTTLQHLLEIFVWIGYVSSGVMPLVYTLFNKTFRDAFGRYITCN	398
P28223 5HT2A_HUMAN P41595 5HT2B_HUMAN	YKENKKPLQLILUNTIPALAYKSSQLQMGQKKNSKQDAKTTDNDCSM YRATKSVKTLRKRSSKIYFRNPMAENSKFFKKHGIRNGINPAHYQSPMRLRSSTIQSSSI : : : : : : : : : : : : : : : : : : :	445 458
P28223 5HT2A HUMAN P41595 5HT2B_HUMAN	VALGKQHSEEASKDNSDGVNEKVSCV 471 ILLDTLLLTENEGDKTEEQVSVV 481 : :::::* .:*:**	

Figure 2. Sequence alignment between human 5-HT₂AR (Uniprot entry P28223) and 5-HT₂BR (Uni-Prot entry P41596) performed by Clustal Omega [66]. Special characters meanings: * (Asterix) positions with a single, fully conserved residue; ":" (colon) positions with conservation between amino acid groups of similar properties; "." (period) positions with conservation between amino acid groups of weakly similar properties.



Figure 3. The docking assessment of LSD co-crystallized into 5-HT_{2A}R (the **6WGT** crystal [16]), EC conformation in pink, ECRD conformation in blue, RCRD conformation in green, ECCD conformation in red, and RCCD conformation in yellow (**a**); LSD co-crystallized into 5-HT_{2B}R (the **5VNT** crystal [31]), EC conformation in pink, ECRD conformation in blue, RCRD conformation in green, ECCD conformation in red, and RCCD conformation in yellow (**b**).

Table 4. The RMSD matrix of either 5-HT2AR or 5-HT2BR proteins bound to LSD.

	5TVN	6DRX	6WGT	7SRR	7WC6
5TVN	0.000	1.012	0.731	1.154	1.077
6DRX	1.012	0.000	0.795	1.135	1.165
6WGT	0.731	0.795	0.000	0.765	0.727
7SRR	1.154	1.135	0.765	0.000	1.195
7WC6	1.077	1.165	0.765	1.195	0.000

	R ligands within the RCCD stage.	essment of 5-HT2AR ligation	Table 5. Structure-based alignment
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Code	AutoDock	Vina		SMINA		DOCK]	PLANTS		Ref.
SF ^a			Vina	Vinardo	ad4		chemplp	plp	plp95	
			Randor	nized Conf	ormation	Cross-Doc	king (RCCD)		
6A93 ^b	2.784 °	2.843	2.742	2.563	3.563	3.231	2.573	2.742	2.746	[16]
6A94	2.657	2.224	3.241	3.431	3.431	3.422	2.991	2.664	2.561	[16]
6WGT	2.943	1.943	2.941	2.567	2.567	2.993	2.892	3.245	2.993	[16]
6WH4	2.995	1.971	2.518	2.783	2.783	2.961	2.973	2.835	3.762	[25]
6WHA	3.726	2.941	3.663	3.452	3.452	2.693	2.116	2.985	3.426	[25]
7RAN	3.651	2.365	2.632	2.954	3.954	3.652	2.639	2.954	3.624	[27]
7VOD	3.648	1.984	3.654	3.642	3.642	2.584	2.652	2.667	3.621	[28]
7VOE	6.257	1.965	2.548	2.984	2.984	2.524	2.547	2.647	2.457	[28]
7WC4	3.658	2.695	2.458	2.658	2.658	3.632	3.698	3.965	3.621	[26]
7WC5	2.398	2.657	2.654	2.984	2.984	3.324	3.258	3.541	2.514	[26]
7WC6	3.695	3.625	3.254	3.652	3.652	2.659	2.987	2.564	2.558	[26]
7WC7	2.698	3.954	2.698	2.874	2.874	2.584	2.898	2.842	2.774	[26]
7WC8	3.654	3.625	2.548	2.636	2.636	3.395	2.235	2.665	2.664	[26]
7WC9	3.658	3.695	2.547	2.584	2.584	2.987	2.397	2.635	2.981	[26]
DA d	21.43%	50.00%	35.71%	35.71%	28.57%	28.57%	42.85%	42.85%	32.14%	

^a Scoring function; ^b Experimental conformation; ^c Root-Mean-Square-Deviation measured between the heavy atoms of the ligand's experimental and the ligand's re-/cross-aligned conformation; ^d Docking accuracy. Structure-Based Alignment Assessment

Either ligands/5-HT_{2A}R (Table 5) or ligands/5-HT_{2B}R (Table 6) experimentally resolved complexes were superimposed using 7WC8 [26,66] as a template, with the lowest resolution of 2.45 Å. For the SB alignment assessments (SBAAs) procedure [67], the best performing molecular docking algorithm/scoring function pair in reproducing the experimentally bound conformations of the ligands was investigated using ligands extracted from either 5-HT_{2A}R (Table 5) or 5-HT_{2B}R (Table 6) complexes (at the same time providing a basis for future cross-pharmacology in a discrete fashion) [67]. The following protocol was established: first, any ligand was subjected to SBAA [67] using free or open-source molecular docking programs: AutoDock [68], AutoDock Vina (hereafter Vina) [69], DOCK [70], SMINA [71], and PLANTS [72], with all available scoring function (SF) variants. As previously described, the SBAA protocol [67] was investigated at four levels of difficulty: experimental or randomized ligand conformation (EC and RC, respectively), re-docking (RD) (ECRD and RCRD, respectively), and cross-docking (CD) (ECCD and RCCD, respectively). While the RMSD data associated with ECRD, RCRD, and ECCD are reported as Supplementary Materials (Tables S2 and S3), the RCCD-related RMSD values, which describe the docking programs' abilities in reproducing experimental binding modes from initial random ligand conformations into a never-seen protein environment (the most difficult scenario), are reported for either 5-HT2AR or 5-HT2BR as Tables 5 and 6, respectively.

Code	AutoDock	Vina		SMINA		DOCK	I	PLANTS		Ref.
SF a			Vina	Vinardo	ad4		chemplp	plp	plp95	
			Randor	nized Confo	ormation (Cross-Dock	ing (RCCD)			
4NC3 ^b	4.454 °	2.785	2.986	2.784	2.984	4.313	3.125	2.742	3.421	[29]
4IB4	3.431	2.895	4.124	3.984	2.634	3.453	3.784	2.563	2.741	[29]
5TUD	3.625	2.748	2.642	3.614	3.569	3.695	2.539	2.597	3.625	[57]
5TVN	2.895	1.993	1.963	1.943	3.964	3.241	2.431	3.254	2.346	[31]
6DRX	2.674	2.864	2.424	2.435	2.874	3.254	2.964	3.541	2.758	[33]
6DRY	2.895	2.998	3.894	3.784	2.695	2.451	2.531	2.431	2.321	[33]
6DRZ	2.992	2.674	3.431	3.895	3.624	2.563	2.728	3.522	2.462	[33]
6DS0	2.567	1.864	2.974	2.983	2.874	2.451	2.351	2.214	3.325	[33]
7SQR	2.517	2.957	2.987	2.524	2.595	3.648	2.487	2.845	2.635	[32]
7SRS	2.698	1.997	1.987	1.987	2.749	2.874	2.228	2.457	3.984	[32]
7SRR	3.624	2.487	2.964	1.987	2.996	3.625	2.487	2.625	3.635	[32]
DA ^d	31.82%	63.64%	45.45%	45.45%	36.36%	18.18%	40.91%	36.36%	31.82%	

Table 6. Structure-based alignment assessment of 5-HT_{2B}R ligands.

^a Scoring function; ^b Experimental conformation; ^c Root-Mean-Square-Deviation measured between the heavy atoms of the ligand's experimental and the ligand's re-/cross-aligned conformation; ^d Docking accuracy.

Regarding the reproduction of co-crystallized ligand conformations in 5-HT_{2A}R (Table 5, Figure 3a), in the ECRD phase (Table S2, Supplementary Materials), all available docking algorithms/SFs pairs, except those implemented in AutoDock and DOCK, showed a high level of docking accuracy (DA) [67,73,74]. Among the most accurate, Vina was found to be the best, with a DA value of 89.28%, while SMINA, with either vina [69], vinardo [75], or ad4 [68] SFs, showed DA ranging from 75.00% (SMINA/vina) to 78.57% (SMINA/vinardo). The PLANTS/plp pair (DA = 82.14%) almost reached the accuracy of Vina, while either PLANTS/chemplp or PLANTS/lp95 gave DA values close to SMINA/vinardo. At the RCRD stage (Table S2, Supplementary Material), Vina maintained a DA value of more than 80%, with a physiological decrease of about 7% compared to ECRD, while each SMINA/SF pair-associated DA was less than 75%. The ability of PLANTS/plp to reposition 5-HT_{2A}R' ligand conformations showed a 5% decrease in DA, while PLANTS/chemplp remained as accurate as SMINA/vinardo. In the ECCD evaluation phase (Table S2, Supplementary Materials), Vina remained the most accurate (DA equal to 75%), followed by SMINA/vina and SMINA/vinardo (DA ~ 72%), while the SMINA/ad4 and PLANTS pairs, plp and plp95, were 50–60% accurate. At the last and most difficult level, the RCCD stage (Table 5), Vina proved to be the docking program with the highest DA (50%).

As for the docking evaluation for ligands co-crystallized in 5-HT_{2B}R (Table 6, Figure 3b), all docking algorithms/SF pairs showed DAs higher than 50% during the ECRD phase (Table S3, Supplementary Materials). In particular, Vina and SMINA/vina/vinardo showed perfect DAs (100%), followed by SMINA/ad4 (DA higher than 80%), while for AutoDock, DOCK, and PLANTS, the DAs ranged between approximately 59% (DOCK) and 73% (PLANTS/chemplp/plp). In the RCRD assessment (Table S3, Supplementary Materials), Vina retained the highest DA (86.36%), while SMINA was associated with DAs of approximately 68% and 73%. A decreasing trend was also observed for AutoDock, DOCK, and PLANTS (chemplp and plp SFs) with DA values equal to or greater than 50% but not exceeding 65%. At the ECCD level (Table S3, Supplementary Materials), Vina and SMINA/vina/vinardo/ad4 were the only ones able to cross-dock 5-HT_{2B}R ligands with acceptable DA values of 72.73, 63.64, 54.00, and 50.00%, respectively, while AutoDock, DOCK, and all PLANTS SFs suffered from the initial conformation with low DA values. Finally, during the RCCD (Table 4), as in the case of 5-HT₂AR, Vina was confirmed as the program that was able to reproduce the experimental binding conformations with the least error (DA = 63.64%).

2.4. SCs' Binding Mode Analysis into 5-HT2A-DPPC and 3-D QSAR Models Interpretation

Based on the above SB assessments, Vina was selected as an SB tool to investigate the binding modes of either TR or TS molecules. SCs were cross-docked into the 6A93 [16] crystal of 5-HT₂AR, previously immersed in the dipalmitoylphosphatidylcholine (DPPC) membrane system (5-HT_{2A}R-DPPC, https://opm.phar.umich.edu/, entry: 4282, accessed on 2 December 2022), and co-aligned with the 5-HT₂AR and 5-HT₂BR crystals used for SBAAs (Tables 3 and 4) to elaborate their binding modes, simulating a cell-like environment. TR compounds thus adopted a binding mode similar to that of LSD and were found in the vicinity of extracellular loop 2 (EL2) and the extracellular space, which forms a narrow cleft lined mainly by hydrophobic side chains of residues in transmembrane (TM) helices TM3, TM5, TM6, and TM7, as well as near the laterally extended cavity surrounded by hydrophobic residues of TM3, TM4, TM5, and ECL2, to connect the binding site to the plasma membrane near the lower hydrophobic cleft [16]. None of the compounds occupied the orthosteric region in front of the hydrophobic cleft [16]. Upon deeper analysis, SCs were observed to establish only electrostatic interactions with TM3 Asp155, instead of a hydrogen bond (HB) established by LSD, which has been identified as a crucial interaction for the drug's psychotic behavior at the 5-HT2AR level [76]. To quantitatively support the observed SB overlap, 3-D QSAR models were built using the TR docked conformations proposed by Vina. The 3-D QSAR models were generated using Open3DQSAR software [77] with multiple probes (Table 7), and the corresponding CoMFA-like maps were analyzed. The final models were obtained with the fractional factorial design (FFD) feature selection applied to the model preoptimized with the variable pretreatment optimization (VPO) protocols by varying the lattice spacing and lattice extension [78].

Probe	Field	GS a	PC ^b	CO c	Z d	SD e	1 ^{2 f}	q^{2} LOO ^g	q^{2} LSO ^h	r^2 YS ⁱ	q^{2} YS LOO ^j	q^{2} YS LSO ^k
CR	STE	1	5	4	0.05	0.01	0.932	0.552	0.476	0.864	-0.217	-0.264
	ELE	1	5	4	0.05	0.01	0.956	0.476	0.411	0.812	-0.231	-0.284
	BOTH	1	5	4	0.05	0.01	0.961	0.512	0.417	0.856	-0.231	-0.246
CB	STE	1	4	4	0.01	0.01	0.943	0.473	0.442	0.836	-0.251	-0.256
	ELE	1	4	4	0.01	0.01	0.967	0.414	0.412	0.822	-0.236	-0.238
	BOTH	1	4	4	0.01	0.01	0.934	0.486	0.446	0.821	-0.245	-0.217
NC=O	STE	1	5	3	0.02	0.04	0.951	0.536	0.498	0.861	-0.236	-0.284
	ELE	1	5	3	0.02	0.04	0.931	0.254	0.436	0.856	-0.258	-0.264
	BOTH	1	5	3	0.02	0.04	0.962	0.521	0.432	0.754	-0.312	-0.157
NR	STE	1	4	5	0.03	0.01	0.943	0.484	0.461	0.814	-0.264	-0.264
	ELE	1	4	5	0.03	0.01	0.945	0.512	0.421	0.806	-0.254	-0.235
	BOTH	1	4	5	0.03	0.01	0.952	0.504	0.412	0.825	-0.147	-0.135
O=C	STE	1	3	5	0.05	0.02	0.912	0.501	0.495	0.841	-0.264	-0.244
	ELE	1	3	5	0.05	0.02	0.925	0.482	0.472	0.822	-0.254	-0.251
	BOTH	1	3	5	0.05	0.02	0.976	0.498	0.426	0.734	-0.137	-0.146
OH2	STE	1	5	5	0.05	0.02	0.973	0.684	0.594	0.845	-0.264	-0.241
	ELE	1	5	5	0.05	0.02	0.981	0.562	0.534	0.824	-0.247	-0.224
	BOTH	1	5	5	0.05	0.02	0.971	0.671	0.316	0.842	-0.145	-0.321

 Table 7. Statistical results of the best Open3DQSAR models derived after VPO and FFD optimization.

^a Grid spacing (in Å); ^b Optimal number of principal components/latent variables; ^cCutOff values ± interval in kcal/mol; ^d Zeroing values in kcal/mol; ^eStandard deviation; ^fConventional square-correlation coefficient; ^gCross-validation correlation coefficient using the leave-one-out method; ^hCross-validation correlation coefficient using the leave-some-out (LSO) method with 5 random groups; ⁱ Average square correlation coefficient obtained after Y-scrambling process. ^j Average cross-validation correlation coefficient using the leave-one-out (LOO) method obtained after Y-scrambling process. ^k Average cross-validation correlation coefficient using the leave-some-out (LSO) method with five random groups obtained after Y-scrambling process.

The best models were obtained with the OH2 probe, with associated q^2 values of 0.684, 0.562, and 0.671 with steric (STE), electrostatic (ELE), and both fields (BOTH or STE + ELE), respectively (Table 7, Figure 4). Although the OH2 probe STE model was statistically superior to the model derived with either field (BOTH), for the sake of completeness, the final model interpretation was performed using the OH2 probe-based PLS-coefficients (OH2_{PLS-coefficients} maps) obtained with the BOTH field model. Thus, in a CoMFA-like fashion, the positive STE OH2_{PLS-coefficients} (green isocontours) cover the regions of the molecules where the bulky substituents would increase the activity, while the negative STE OH2PLScoefficients (shown as yellow isopleths) indicate the regions where the bulky substituents decrease the activity. Positive ELE OH2_{PLS-coefficients} (red polyhedra) indicate regions where positively charged functions and hydrogen bond donors (HBDs) are positively correlated with activity, while negative ELE OH2_{PLS}-coefficients (blue maps) indicate regions where negatively charged functions and hydrogen bond acceptors (HBAs) are positively correlated with potency. Despite the intrinsic limitations of the generated OH2-based STE, ELE, and BOTH models (limited TR chemical diversity), the low error of the cross-validated absolute error of prediction for either TR or TS and TSCRY activities (Tables S4–S6, Supplementary Materials) enabled the model as a tool to predict the activities of yet-untested SCs analogs or similar compounds (see further discussion).



Figure 4. Experimental versus recalculated (blue circles) and predicted (red circles) pKis for TR using OH2 probe BOTH (STE + ELE) LOO model at 5 PCs (**a**); OH2 probe BOTH (STE + ELE) LSO model at 5 PCs (**b**).

2.4.1. The Cathinones' Benzene Ring and Its Substituents' Contribution

The benzene ring (**Ph**) of the **SCs** can be considered as a first pharmacophoric feature. Thus, the unsubstituted **Ph** (found in AGs **1**, Figure 5a,b; **4**, Figure 6a,b; **23**, S1a and S1b, and **24**, S2a and S2b, as well as within an IA **9**, Figure 6c,d; Supplementary Materials, Table S2) was placed at the bottom of the hydrophobic cleft. Within the listed **SCs**, the **Ph**'s *ortho*-positions proximal to the β -carbonyl group (β -**CO**) orientation (see further discussion), according to the positive STE OH2*PLS-coefficients* maps, formed favorable steric interactions with Ser159, Thr160, and Ser242 side chains, implying that the additional bulkiness would be preferable for the agonistic pharmacology and likely the hallucinogenic effects. In contrast, the yellow STE OH2*PLS-coefficients* maps emphasized the unfavorable T-shaped (i.e., edge-to-face) van der Waals interactions of the opposite-side *o*-positions with the benzyl part of Trp336's indole ring, as well as with Phe340, toward which bulkiness should be reduced, perhaps endowing lower psychostimulation.

On the other hand, the *m*-positions on the β -CO side interacted with Ile163, where the negative steric 3-D QSAR maps indicated repulsive interactions with the *sec*-methyl group of Ile163, while the positive STE OH2_{PLS}-coefficients maps indicated the favorable attraction with the pentanoic acid-based side chain of the residue, as well as with the indole ring of Trp164. The *m*-carbon atoms were observed in favorable T-shaped steric interactions with the indole ring nitrogen of Trp336 (the green STE OH2_{PLS}-coefficients maps as evidence).

Finally, the *p*-positions could mainly establish van der Waals contacts with Phe332, Val333, and Phe340 in a T-shaped manner, as well as with Phe243 via parallel displaced interactions, described with either positive or negative steric 3-D QSAR maps. The slightly larger extent of the negative steric 3-D QSAR maps can probably be associated with a repulsive character.



Figure 5. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based *PLS-coefficients* (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for **1** (**a**,**b**); **2** (**c**,**d**); **17** (**e**,**f**). For the clarity of presentation, DPPC was omitted.



Figure 6. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based *PLS-coefficients* (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for **4** (**a**,**b**), **9** (**c**,**d**), and **18** (**e**,**f**). For the clarity of presentation, DPPC was omitted.

In addition, upon the *p*-substitution of **Ph** with a halogen moiety (leading to the agonism of **2**, Figure 5c,d; full antagonism of **5**, Figure S2c,d, and inverse agonism of **11**, Figure S1c,d, Supplementary Materials), the *p*-halogen likely established induced dipole interactions with Phe332 and the surrounding residues, according to the negative ELE OH2_{*PLS-coefficients*} maps. The slight decrease in electronegativity (and increase in bulkiness) upon *p*-Br incorporation, as in **11** or **5**, resulted in reduced inhibition constants and likely inverse agonism/full antagonism. Moreover, concerning **2**, both **11** and **5** were slightly rotated towards Trp336, overlapping the *m*-position of the unsubstituted benzene ring. Therefore, according to the positive ELE OH2_{*PLS-coefficients*} fields, as with HBA, the *p*-Br was not well tolerated by the indole moiety of Trp336, which probably prefers an HBD at the *m*-position while interfering with **SC**; according to the alignment of the positive STE OH2_{*PLS-coefficients* contours, certain HBD could be of increased steric hindrance.}

The *p*- to *m*-halogen position shift, i.e., *p*-Br to *m*-Br, as seen in **12** (Figure S3a,b, Supplementary Materials) or **6** (Figure S3e,f, Supplementary Materials), in which the *m*-Br

pointed toward Phe332 and Trp336, likely contributed to the reduced binding potency, full antagonism, and the exertion of antidepressive effects. Nevertheless, the model also indicated that a double *m*-halogen substitution could contribute to an additional decrease in the binding potency of **SC**.

A decrease in potency is observed when the halogen position is changed from *para* to *ortho*, as seen in FAs and non-psychostimulants/antidepressives **7** (Figure S4a,b, Supplementary Materials) and similarly in **8** (Figure S4e,f, Supplementary Materials). The *o*-F moiety of **7** established unfavorable steric interactions (negative STE OH2*PLS-coefficients* contours) with the Trp336 side-chain benzene. At the same time, the positive ELE OH2*PLS-coefficients* isocontours indicated that an *o*-HDB within the structure of **SC** is preferred by Trp336 instead of *o*-F as HBA. The **8**'s *o*-OCF₃ as a bulkier and more electronegative scaffold led to an unwanted steric clash (negative STE OH2*PLS-coefficients* contours as evidence) with Ile163 and Trp164, although the positive ELE OH2*PLS-coefficients*/negative ELE OH2*PLS-coefficients* isocontours alignment implied that more of the HBD character is needed for Trp164 engagement.

Replacement of the *p*-halogen with a hydrophobic moiety such as the methyl of an AG **3** (Figure S5a,b, Supplementary Materials), as well as IAs/FAs **10** (Figure S5e,f, Supplementary Materials) and **15** (Figure S6a,b, Supplementary Materials), resulted in a ~15° rotation of the central aromatic ring, leading to the overlap of the *p*-CH₃ function with the *p*-Br or *m*-Br, respectively. The increased bulkiness at the bottom of the hydrophobic cleft reduced the potency, as verified by the incorporation of 1,3-dioxolane at the *m*- and *p*-carbons of the phenyl ring, respectively (i.e., benzo[d][1,3]dioxole formation), as in derivatives **14** (Figure S4c,d, Supplementary Materials) and **16–22** (Figures 5, 6, S3–S8, Supplementary Materials), or fused benzene as the naphthyl moiety in **13** (Figure S6e,f, Supplementary Materials), contributing to inverse agonism/full antagonism (**14** and **15**).

2.4.2. The Cathinones' β-Carbonyl Group Contribution

The orientation of the unsubstituted or substituted **Ph** within the structures of **SCs** strongly influenced the behavior of β -CO and vice versa. This group can be considered as a second pharmacophoric feature, as in 1 (Figure 5a,b) and 4 (Figure 6a,b). The β -CO formed a strong HB with the side-chain hydroxyl portion of Thr160 (β-CO----HO-Thr160, O-O distance of 2.636 and 2.464 Å, respectively), characterized by negative ELE OH2PLScoefficients isocontours, thus contributing to the agonistic pharmacology and psychedelic effects. With the incorporation of *p*-F (**2**, Figure 5c,d), the β -CO has shifted away from preventing the optimal β -CO----HO-Thr160 O-O distance toward attractive electrostatic interactions (*p*-F likely compensated for the lack of HB to maintain the high potency of **2** as an AG and psychostimulant). However, with the introduction of the *p*-Br, as in **11** and **5** (Figures S1c,d and S2c,d, respectively, Supplementary Materials), the β -CO----HO-Thr160 hydrogen bonding distance was restored due to the ~15° in-plane rotation of CSs concerning 2 (O-O distance of 3.396 and 3.238 Å for 11 and 5, respectively), proving the value for IAs/FAs as well. The *p*-substitution with a methyl group (3, 10, and 15, Figures S5a,b, S5e,f, and S6a,b, respectively, Supplementary Materials), together with both *p*- and *m*-substitution with 1,3-dioxolane or benzene (13, 14, 16–22, and Figures 5, 6, S2–S6, Supplementary Materials), also forced the β -CO----HO-Thr160 HB formation (O-O distance of 2. 728, 3.360, 2.835, 3.321, 3.229, 2.989, 2.892, 3.119, and 3.217 Å, respectively).

However, the *p*-Br to *m*-Br switch, as in **12** (Figure S3a,b, Supplementary Materials) and **6** (Figure S3e,f, Supplementary Materials), or the *p*-F to *o*-F switch, as in **7** (Figure S4a,b, Supplementary Materials), all inverse agonists/full antagonists, resulted in the alternative β -CO----HO-Ser159 HB formation (O-O distances of 2.585 Å, 3.245 Å, and 3.396 Å, respectively), for which relatively high potency was retained. The β -CO----HO-Ser159 HB (O-O distance = 2.971 Å) was retained even when the bulkier **8**'s *o*-fluoromethoxy moiety (Figure S6e,f, Supplementary Materials) formed an additional HB with Thr160 (O-O distance = 2.288 Å), also covered by negative ELE OH2_{PLS-coefficients} isocontours, or when **Ph** was unsubstituted (**9**, Figure 6c,d, *d*_{HB} = 2.971 Å). The absence of β -CO (14 and 16–22, and

23 and **24**, Figures 5, 6, and S1–S6, Supplementary Materials) resulted in the lowest potencies, which were partially compensated by the benzo[*d*][1,3]dioxole (**14** and **16–22**) or **Ph** (**23–24**) alone.

2.4.3. The Cathinones' Methylene Group and Methylene Group' Substituents Contribution

Here, we focused on the importance of alkyl-substituted methylene fragments (i.e., -CH₂-Rs, either methyl- [-CH₂-CH₃], ethyl- [-CH₂ CH₃] substituted) located between either substituted/non-substituted Ph-β-CO or benzyl $(Bn, in the absence of \beta-CO)$ moieties and substituted/non-substituted terminal amines (-NH₂) (Table 1). Therefore, the orientations of the -CH₂-CH₃ fragments were almost conserved and the correct SB correlation to the surrounding groups was difficult to establish. Thus, between either **Ph-\beta-CO**----HO-Thr160 HB and -**NH**₂ or -**NH**CH₃ (**1**, Figures 4a and 5b, and 4, Figure 6a,b, respectively) or Bn and -NH2 or -NHCH3 (23, Figure S1a,b: 24, Figure S2a,b, Supplementary Materials), the -CH2-CH3 was involved in the attractive steric interactions with Val156 (see the STE OH2PLS-coefficients maps) that enhanced the agonistic and hallucinogen effects of compounds. Nevertheless, the -CH₂-CH₃ contribution was not critical for the SCs, as it was the loss of β -CO that directly affected the potency reduction from the highest (1) to the lowest (23 and 24). The conversion of -NH₂ to pyrrolidine (9, Figure 6c,d) directed the substituent methyl group toward favorable interactions with Phe339 and Phe340 (as evidenced by positive STE OH2PLS-coefficients maps), but also contributed to inverse agonist/full antagonist pharmacology. Interestingly, a similar orientation of the -CH2-CH3 moiety (accompanied by a further decrease in potency) was observed with *m*-Br-**Ph-β-CO**----HO-Ser159 HB and pyrrolidine (**12**, Figure S3a,b, Supplementary Materials), as well as with *o*-OCF₃-**Ph**-β-CO----HO-Ser159 HB and -NHCH₃ (8, Figure S4e,f, Supplementary Materials). In addition, both -CH2-CH3 (22, Figure S5c,d; 20, Figure S2e,f, Supplementary Materials) and -CH2-CH2-CH3 (19, Figure S1e,f, Supplementary Materials) indicated that Phe339 and Phe340 were bound by 1,3-dioxolane-Ph-β-CO----Thr160 HB and either -NHCH3 or -NH-Et.

The potency remained relatively high (above the 5 pK_i units), with the **-CH**₂-CH₃ surrounded by *p*-X-**Ph-** β -**CO**----HO-Thr160 HB and either **-NH**CH₃ (**2**, X=F, Figure 5c,d; **5**, X=Br, Figure S4c,d, Supplementary Materials) or pyrrolidine (**11**, X=Br, Figure S1c,d, Supplementary Materials), and by *p*-Me-**Ph-** β -**CO**----HO-Thr160 HB and pyrrolidine (**3**, Figure S3a,b; **10**, Figure S5a,b Supplementary Materials), which further directed the targeted functional group towards the T-shaped steric interaction with the indole ring of Trp336, where a larger portion of negative STE OH2_{PLS-coefficients} contours relative to positive ones indicated that further bulkiness increase towards Trp336 would lead to inverse agonism/partial agonism and would thus be detrimental for the psychedelic influence of **SC**, whereas positive/negative ELE OH2_{PLS-coefficients} maps indicated that methyl group replacement by HBD/HBA would be beneficial for agonistic behavior and psychedelic effects.

In contrast, either *m*-Br-**Ph-** β -**CO**----HO-Ser159 HB (6, Figure S3e,f, Supplementary Materials) or *o*-F-**Ph-** β -**CO** (7, Figure S4a,b, Supplementary Materials) next to -**NH**CH₃ forced the -**CH**₂-CH₃ to have unproductive (note negative STE OH2_{PLS-coefficients} contours) van der Waals interactions with Val156 and Ser242, which was reflected in inverse agonism/partial agonism pharmacology. The similar interactions of -**CH**₂-CH₃ were observed to be surrounded by 1,3-dioxolane-**Ph-** β -**CO**----Thr160 HB and pyrrolidine (16, Figure S6c,d, Supplementary Materials), as well as by 1,3-dioxolane-**Bn**-and-**NH**CH₃ (18, Figure 6e,f; **21**, Figure S3c,d, Supplementary Materials), but not for -**CH**₂-CH₂-CH₃ (17, Figure 5e,f), which remained bound to Phe340. However, the incorporation of the propyl group was accompanied by either naphthalene- β -**CO**----HO-Thr160 HB (13, Figure S6e,f, Supplementary Materials), 1,3-dioxolane-**Ph-** β -**CO**----HO-Thr160 HB (14, Figure S4c,d, Supplementary Materials), or *p*-Me-**Ph-** β -**CO**----HO-Thr160 HB (15, Figure S4a,b, Supplementary Materials), and pyrrolidine turned the -**CH**₂-CH₂-CH₃ towards Trp151 and Val156, defining the boundary for Phe340 steric clash tolerance.

2.4.4. The Cathinones' Amine Nitrogen Contribution

The affinities of **SCs** to 5-HT_{2A}R and their psychedelic behavior can also be attributed to their interactions with Asp155 via the terminal primary, secondary, or tertiary nitrogen. Thus, the primary amine, as in AGs **1** (Figure 5a,b), **3** (Figure S5a,b, Supplementary Materials) and **23** (Figure S1a,b, Supplementary Materials), provided a salt bridge with Asp155 instead of HB (d = 4.772 and 5.853 Å, respectively, and the strongest interaction could have contributed to the highest potency of **1**), despite being characterized with positive ELE OH2_{PLS-coefficients} maps. The absence of hydrogen bond between the -NH₂ and Asp155 is likely the reason for lower psychedelic activities of **SCs** compared to LSD [25,26,31,32]. Nevertheless, distinct interactions were characterized by negative STE OH2_{PLS-coefficients} isocontours, indicating that the increase in bulkiness at the -NH₂ level would reduce the potency of **SCs** and convert AGs into IAs/FAs, i.e., psychostimulants into non-psychostimulants.

The above hypothesis was (in part) supported by the analysis of the secondary, i.e., either *N*-methyl substituted, as in **2**, **4–8**, **17–19**, **22**, and **24** (Figures 5, 6 and S1–S6, Supplementary Materials), or *N*-ethyl substituted, as in **20** and **21** (Figures S4e,f and S5c,d, respectively, Supplementary Materials) amines . The listed **SCs** also formed a salt bridge with Asp155 via the -*N*-H part (highlighted by positive ELE OH2_{PLS-coefficients} isocontours), strongly conditioned by the alignment of the *N*-methyl/*N*-ethyl groups with one of the two subregions bounded by Leu228, Val336, Phe339, Trp336, and Tyr370 (as for **5–7** and **20**), or Val156 alone (as for **4**, **8**, **17–19**, **21**, **22** and **24**), described by simultaneous attractive/repulsive 3-D QSAR maps.

The effect of bulky substituents on the -**NH**² was further analyzed, starting from the tertiary nitrogen of **SCs** found in pyrrolidine, as in **9–16** (all IAs/FAs except **16**, Figures 6 and S1–S6, Supplementary Materials), which adopted three different conformations. Favorably attracted by Val156 (as in **9**, **10**, and **12**; the positive STE OH2_{PLS-coefficients} contours as evidence), the tertiary nitrogen provided good potency through moderate electrostatic interactions with Asp155 (distance over 6 Å, positive ELE OH2_{PLS-coefficients} maps as validation). On the other hand, the interactions with Phe339 (observed for **11** and **16**) moved the heterocycle away from Asp155 into a negative STE OH2_{PLS-coefficients} cloud, implying a need to maximally reduce bulkiness. Displacement of the heterocycle from Val156 towards Ser242 and Phe340, as in **13–15**, contributed more negatively than positively (a larger proportion of negative STE OH2_{PLS-coefficients} maps than positive ones observed) to the potency, with a lack of interactions with Asp155.

2.4.5. Generated 3-D QSAR Models' Predictive Abilities

The Vina-predicted conformations and OH2 probe-derived BOTH 3-D QSAR models were evaluated for predictivity on TS compounds (Table 3 and Table S3, Supplementary Materials; Figures 7, 8 and S9–S15, Supplementary Materials).

The binding modes for all compounds except **25** (co-crystalized within the **7VOE** protein [28]) were modeled for **SCs** and were associated with experimentally available p_{Ki} values. The p_{Ki} values of TSs were predicted with an average absolute error of prediction (AAEPs) of 0.61 and 1.29 with the LOO and LSO CVs optimized models, respectively (Table S3 Supplementary Materials), to which the associated predictive q^2 (q^2_{pred}) values were calculated to be 0.43 and 0.307, respectively, confirming the good predictive capabilities of the model [79]. Similar to the **SCs**, ten TS compounds, namely **26–28**, **30**, **32–34**, **36**, **39**, and **41** (Figures 8 and S7–S11d, respectively, Supplementary Materials), filled only the hydrophobic pocket of the 5-HT_{2A}R's active site and were predicted in potency with the absolute error of prediction (AEP) below 1. Among them, the best predicted one was **33**, with errors of prediction (EPs) after LOO and LSO CVs of 0.03 and 0.16 p_{Ki} units. The AEP was only 0.095 p_{Ki} units, while the worst was **32**, associated with LOO and LSO CVs AEPs of 0.37 and 0.97 p_{Ki} units, respectively. For the bipartite 5-HT_{2A}R ligands, the AEP was greater than 1. The remaining compounds that were SB aligned throughout both the orthosteric region and the hydrophobic pocket of the receptor's bipartisan active site. Within

the subset, only compound **37** (Figure S10a,b, Supplementary Materials) potency was predicted with tolerable accuracy (LOO and LSO CVs AEPs of 1.2 and 0.94 pK_i units, respectively), whereas the worst predicted compound was **29** (Figure S7c,d, Supplementary Materials) (LOO and LSO CVs AEPs of 1.83 and 2.24 pK_i units, respectively).



Figure 7. Experimental versus recalculated (green circles) and predicted (purple circles) p*K*_{is} for TS using OH2 probe BOTH (STE + ELE) LOO model at 5 PCs (**a**); OH2 probe BOTH (STE + ELE) LSO model at 5 PCs (**b**).

Previously published CoMFA/CoMSIA LB 3-D QSAR models based on dibenzazecines [80], 3-aminoethyl-1-tetralones, piperazines, benzothiazepines, pyrrolobenzazepines [81], and arylpiperazines [82], as well as the LB GRID/GOLPE models of (aminoalkyl)benzo and heterocycloalkanones [83], were also more accurate in predicting the potencies of compounds occupying the hydrophobic pocket. On the other hand, within the molecular docking-based SB GRID/GOLPE 3-D QSAR models generated on either butyrophenones [84], or lozapine, ziprasidone, and ChEMBL-listed analogues [84], the quality of the alignment within either the orthosteric area, the hydrophobic pocket, or both, was, as here, evaluated using the highest *q*² [63,85]. However, the universal SB 3-D QSAR model(s) defining the agonism/antagonism on the entire 5-HT_{2A}R active site remains to be generated, perhaps after increasing the number of K_i-associated co-crystallized 5-HT_{2A}R compounds to a minimum of 15 (and thus updating Table 1), using either Open3DQSAR [77], 3-D_QSAutogrid/R [78], or Py_CoMFA [31,86].



Figure 8. The structure-based alignment within 5-HT_{2A}R-DPPC and OH2 probe-based *PLS-coefficients* (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for **25** (**a**,**b**); **26** (**c**,**d**); **27** (**e**,**f**). For the clarity of presentation, DPPC was omitted.

2.5. Molecular Determinants for SCs

The pharmacodynamic profile obtained from the 3-D QSAR map analysis indicated some pharmacophoric features that may positively or negatively affect the potency of **SCs** as 5-HT_{2A}R ligands. Therefore, comprehensive 3-D structure–activity relationship (SAR) rules were derived for the **SCs** structure–activity relationship model [67] and are shown in Figure 1 as a template (Figure 9). This led to the derivation of a unique SAR as a tool that could be used to drive the virtual screening campaign of new cathinones and similar compounds as 5-HT_{2A}R ligands that could, as AGs, exert psychostimulant properties.



Figure 9. The SAR model for CSs as 5-HT2AR ligands and agonists is seen through 1.

Thus, the central benzene ring (**Ph**) of **SCs** may be either unsubstituted or o-substituted proximal to the β -carbonyl group (β -**CO**) with bulkier portions to sterically engage Ser159, Thr160, and Ser242, while the o-bulkiness increase towards Trp336 and Phe340 would not be tolerated and HDB portions should be forced. As for the *m*-position on the β -**CO** side towards Ile163 and Trp164, **Ph** should either remain unsubstituted or be heavily substituted by a highly electronegative electron withdrawing/HBA group, while Trp336 on the opposite side would tolerate bulkier moieties with an HBD character. The p-position of **Ph** before Phe243, Phe332, Val333, and Phe340 could accommodate moieties, providing minimal van der Waals contacts with or substituted by a highly electronegative electron withdrawing/HBA group.

The β -CO pharmacophoric feature is responsible for the formation of HBs with Thr160, mitigated by the presence of either *p*-electronegative groups/HBA or bulky substituents (or functional groups containing each of these features) at the same position. Nevertheless, the most electronegative functional groups incorporated at the *p*-position of **Ph** may prevent the β -CO----HO-Thr160 HB formation. On the other hand, the incorporation of *m*- or *o*-electronegative groups/HBA (or corresponding hybrid functional groups) leads to the formation of β -CO----HO-Ser159 HB. Since none of the **SCs** formed the HB with Asp155 (an interaction that leads to the hallucinogenic effect of LSD [31]), the β -CO or similar β -HBA bioisosteric scaffold remains preferred for **SCs** to ensure the H-bonding described above, since the absence of β -CO resulted in the lowest potencies.

The -CH₂- fragment substituted with a methyl group, located between the β -CO (or **Bn**) and -NH₂ (or -NHCH₃), seemed to be the best choice to establish attractive steric interactions with Val156. The substitution of -NH₂ with bulkier acyclic and cyclic aliphatic moieties could also direct the -CH₂-CH₃ moiety to favorable van der Waals interactions with Phe339 and Phe340. The *m*-HBA/o-HBA-Ph- β -CO····HO-Ser159 HB architecture also supported the alignment of -CH₂-CH₃ with Phe339 and Phe340 but could also direct the moiety to unfavorable steric hindrance with Ser242. The -CH₂-CH₃ moiety should not be properly lengthened or branched, as the further increase of van der Waals interactions towards the listed residues could lead to decreased potency. Either the *m*-HBA-Ph- β -CO----HO-Thr160 HB or *p*-Me-Ph- β -CO----HO-Thr160 construct could force the -CH₂-CH₃

toward more unfavorable steric interactions with Trp336, a residue that would be more tolerant of the **-CH**₂-HBD/HBA fraction.

The -**NH**² of the **SCs** should remain unsubstituted to maintain a salt bridge interaction with Asp155 and ensure high potency. Substitution with more voluminous moieties such as *N*-methyl/*N*-ethyl could be tolerated but could also result in penalizing van der Waals interactions with Leu228, Val336, Phe339, Trp336, and Tyr370, although not interfering with the -*N*-H moiety to form the required salt bridge. Finally, the tertiary nitrogen could provide attractive steric interactions with Val156 and interfere with Asp155, again resulting in lower potency.

2.6. External Validation of 3-D QSAR Models on Experimentally Determined 5-HT2AR Ligands

Finally, the suitability of the obtained 3D QSAR model to be used as a tool for virtual screening and potency prediction was evaluated on TSCRY (Table 1, Figure 10). Since the bioactive conformations of the TSCRY compounds were experimentally resolved, a deeper discussion in terms of their potency prediction was included concerning the TS compounds. Thus, the alignments of TSCRY compounds were not as conserved as those of TS compounds, where most of the main cores of TS compounds were aligned with **SCs**, and for some of the compounds, the remaining parts occupied the orthosteric region. Therefore, the AAEPs of TSCRYs' *pK*_i values were significantly higher for both LOO and LSO CVs optimized models, 1.12 and 1.49 (Table S5, Supplementary Materials), associated with q^{2}_{pred} of 0.33 and 0.28, respectively, confirming the above-described 3-D QSAR model as a useful tool [79] to discover potential new chemical entities as 5-HT2AR ligands to be studied as broad psychedelic agents.

Thus, the best-predicted activities were for the **6A94** (Figure 11a,b), **6WH4** (Figure 11c,d), and **6WHA** (Figure 11e,f) ligands that were found deeply buried in the hydrophobic pocket, with AEPs of only 0.72, 0.95, and 1.05 pK_i units after the LOO CV, and 0.86, 1.16, and 1.69 pK_i units after the LSO CV, respectively. Moreover, given that the **6WH4** crystal is one of the most potent 5-HT_{2A}R ligands known to date (Table 1), predicting its potency with acceptable error was very important for the present 3-D QSAR model, proving the model as capable of recognizing the highly potent ligands bound in a hydrophobic pocket. The main cores of **6WGT** (Figure S14a,b, Supplementary Materials), **7WC6** (Figure S14c,d, Supplementary Materials), and **7WC7** (Figure S14e,f, Supplementary Materials) were positioned at the top of the hydrophobic pocket, orthogonal to the SCs, and were within the scope of the 3-D QSAR *PLS-coefficients*, this time resulting in the LOO CV AEPs of 1.11 (for LSD) and 1.17 (for lisuride) pK_i units and LSO CV AEPs of 1.51 (for LSD) and 1.46 (for lisuride) pK_i units, respectively.



Figure 10. Experimental versus recalculated (green circles) and predicted (orange circles) pKis for TSCRY using OH2 probe BOTH (STE + ELE) LOO model at 5 PCs (**a**); OH2 probe BOTH (STE + ELE) LSO model at 5 PCs (**b**).

On the other hand, **6A93** (Figure S15a,b, Supplementary Materials), **7VOD** (Figure S15c,d, Supplementary Materials), and **7VOE** (Figure S15e,f, Supplementary Materials) crystals occupied both the orthosteric and hydrophobic pockets. The main core of **6A93** was superimposed by **SCs** and thus was the only part of the molecule covered by 3-D QSAR PLS-*coefficients*, as the rest filled the orthosteric cavity, for which the AEPs according to LOO and LSO CVs were 1.80 and 1.47 pKi units, respectively. In contrast, **7VOD** and **7VOE** crystals were positioned above the **SCs** and only the central molecular regions were included in the 3-D QSAR PLS-*coefficients*, resulting in AEPs of 0.76 and 1.65 pKi units after LOO cross-validation and 1.88 and 1.79 pKi units after LOO cross-validation.



Figure 11. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based *PLScoefficients* (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for **6A94** (**a**,**b**); **6WH4** (**c**,**d**); **6WHA** (**e**,**f**). For the clarity of presentation, DPPC was omitted.

3. Materials and Methods

3.1. Crystal Structures Preparation

All selected 5-HT_{2A}R and 5-HT_{2B}R complexes (Table 1) available from the Protein Data Bank (https://www.rcsb.org/, accessed on 1 December 2022) were loaded into the UCSF Chimera v1.10.1 software [87] and were visually inspected. Complexes were superimposed using 5TVN as a template (the best-resolved complex with a resolution of 1.6 Å) using the MatchMaker module and were then separated into chains using the command line implementation of the Chimera split command. Compared to other chains, chains A were complete with respect to the presence of antagonists and were retained. The antagonists were extracted from each chain A complex, completed by adding hydrogens appropriate for pH 7.4, and the AMBER parameters were calculated by Antechamber using a semi-empirical QM method. The protein parts of the stored monomers were improved by adding hydrogen atoms using the embedded leap module of the Amber 12 suite [88], after which the correct hydrogen atoms, appropriate for pH 7.4, were assigned to each amino acid residue. After preparation, the proteins were fused with the appropriate ligands and the complexes were energy minimized as follows. They were solvated by the Leap module with water molecules (TIP3P model, SOLVATEOCT Chimera command) in a box extending 10 Å in all directions, neutralized with either Na+ or Cl- ions, and refined by a single point minimization using the Sander module of the Amber suite with a maximum of 1000 steps of steepest descent energy minimization and a maximum of 4000 steps of conjugate gradient energy minimization, with an unbound cutoff of 5 Å. Minimized complexes were re-aligned (5TVN as a template), after which all ligands were extracted to compose the SB-aligned TR, ready to be used for the subsequent 3-D QSAR model building.

3.2. Alignment Assessment Rules

Structure-based alignment. Regarding SB alignment, a number of docking programs with all available scoring functions, free or open source for academic use, were evaluated to select the best one to reproduce the binding mode of 5-HT_{2A}R and 5-HT_{2B}R ligands. Namely, the programs were AutoDock [68], AutoDock Vina (hereafter referred to as Vina) [69], SMINA [71], DOCK [70], and PLANTS [72]. The entire SB procedure was evaluated using four levels of difficulty:

- 1. Experimental Conformation Re-Docking (ECRD): a procedure in which the experimental conformations (EC) are flexibly docked back into the corresponding protein, evaluating the program for its ability to reproduce the observed bound conformations.
- 2. Randomized Conformation Re-Docking (RCRD): a similar assessment to ECRD with the difference that the active site of protein is virtually occupied by conformations initially obtained from computational random optimization of corresponding cocrystallized molecules coordinates and positions. Thus, *ligands* were initially displaced from the active site and their experimental coordinates were changed by means of assigning new coordinates values: X = 0.000, Y = 0.000, Z = 0.000. Following that, allocated conformations were energy-minimized. Here the programs are evaluated for their ability to find the experimental pose, starting from the randomized minimized conformation.
- 3. Experimental Conformation Cross-Docking (ECCD): comparable to ECRD, but the molecular docking was performed on all the TR proteins except the corresponding natives. Here the programs are evaluated to find the ligand binding mode in the active site such as the native one by means of amino acid configuration but are different in terms of amino acids induced-fit conformations, mimicking discrete protein flexibility at the same time.
- 4. Randomized Conformation Cross-Docking (RCCD): same as the ECCD but using RCs as starting docking conformations. This is the highest level of difficulty since the

program is demanded to dock any given molecule into an ensemble of protein conformations not containing the native one. The outcome is considered as the most important ability of the docking program, as the most accurate scoring function in the RCCD experiment is subsequently applied to any TS molecules whose experimental binding mode is unknown. The related docking accuracy (DA) is a direct function of the program's probability to find a correct binding mode for an active molecule.

The alignment fitness was quantified through the evaluation of RMSD values and the subsequent docking accuracy (DA) values. As previously reported [31], DA can be used to test how the docking or alignment algorithms, respectively, are capable of predicting a ligand pose as close as possible to the experimentally observed and can be calculated by the following equation:

$$xA = f_{rmsd} \le a + 0.5 \ (f_{rmsd} \le b - f_{rmsd} \le a) \tag{1}$$

In particular, *xA* is equal to DA in the case of docking accuracy, whereas $f_{rmsd} \le a$ and $f_{rmsd} \le b$ represent the fraction of aligned ligands, showing an RMSD value less than 2 Å or equal to 2 Å (*a* coefficient) and less than 3 Å or equal to 3Å (*b* coefficient), respectively. The widely accepted standard is that the correctly docked/aligned conformations are those displaying an RMSD value lower than 2 Å on all heavy atoms from the crystallographic structure of the ligand conformation, as found in the inhibitor–enzyme complex. Structures with RMSD between 2 and 3 Å are considered partially docked/aligned, whereas those with a RMSD higher than 3 were mis-docked and were thus not considered in the DA calculation.

3.2.1. AutoDock Settings

For all ligands, the rigid root and rotatable bonds were defined using AutoDockTools. The docking was performed with AutoDock 4.2 by applying the cuboid docking grid coordinates, provided as follows: the xyz coordinates (in Ångströms) for the computation were Xmin/Xmax = -1.805/30.447, Ymin/Ymax = -12.113/9.482, Zmin/Zmax = 48.159/60.462. The coordinate setup was performed in a manner to embrace the minimized inhibitor, spanning 10 Å in all three dimensions. The Lamarckian Genetic Algorithm was used to generate orientations or conformations of ligands within the binding site. The procedure of the global optimization started with a sample of 200 randomly positioned individuals, a maximum of 1.0×10^6 energy evaluations, and a maximum of 27,000 generations. A total of 100 runs were performed with RMS Cluster Tolerance of 0.5 Å.

3.2.2. Vina Settings

The docking simulations were carried out with an energy range of 10 kcal/mol and exhaustiveness of 100 with RMS Cluster Tolerance of 0.5 Å, using the identical grid as for AutoDock4.2. The output comprised 20 different conformations for every receptor considered.

3.2.3. Smina Settings

As Smina is AutoDock Vina fork, an identical setup was used as for Vina for either vina [69], vinardo [75], or ad4 [68] scoring functions.

3.2.4. DOCK Settings

During the docking simulations with the DOCK program, the proteins were considered to be rigid while the inhibitors were regarded as flexible and were subjected to energy minimization. The solvent-accessible surface of each enzyme without hydrogen atoms was calculated using the DMS program [89], using a probe radius of 1.4 Å. The orientation of ligands was described using the SPHGEN and SPHERE_SELECTOR modules. A box around the binding site was constructed with the accessory module

SHOWBOX. The steric and electrostatic environment of the pocket was evaluated with the program Grid using a 0.3 Å of grid spacing. Selected spheres were within 8 Å from ligand heavy atoms of the crystal structure, and for computing, the energy grids an 8 Å box margin and 6–9 VDW exponents were used.

3.2.5. PLANTS Settings

The docking site was limited inside a 12 Å radius sphere, centered in the mass center of the crystallized ligand. Docking was performed by default settings using three different scoring functions: chemplp, plp, and plp95.

3.3. Generation of the TR and TS Designed Compounds

TR, TS, and designed compounds were modelled by applying the Chemaxon's msketch module [90] through molecular mechanic optimization, upon which the hydrogen atoms appropriate to pH 7.4 were assigned. Upon the generation of structures, compounds were uploaded into previously described SB to obtain the bioactive conformations.

3.4. Retrieval of 5-HT2AR-Lipid Bilayer Complex

The crystal structure of 5-hydroxytryptamine receptor 2A in complex with risperidone, deposited at PDB under the code: **6A93**, was found modeled in dipalmitoylphosphatidylcholine (DPPC) bilayer system and deposited as entry: 4282 at Orientations of Proteins in Membranes (OPM) database (https://opm.phar.umich.edu/, accessed on 2 December 2022). Upon retrieval, the 5-HT_{2A}R-DPPC complex was subjected to the same preparation protocol with UCSF Chimera, as described in Section 3.1.

3.5. Structure Alignment of LSD, TR, TS, and Designed Compounds within 5-HT2AR

The same relative coordinates were assigned to the 5-HT₂AR- DPPC system as for 5-HT₂BR, using the UCSF Chimera's MatchMaker module. Afterwards, either LSD, TR, TS, or designed compounds were docked into 5-HT₂AR-DPPC complex using the best performing algorithm/scoring function.

3.6. 3-D QSAR Models Generation

The herein Vina-based TR was submitted to Open3DQSAR procedure to generate partial least squares (PLS)-based 3-D QSAR models using eight probes, namely CR (alkyl carbon), CB (aromatic carbon), NC=O (amide nitrogen), NR (amine nitrogen), O=C (carbonyl oxygen), OH2 (oxygen in water), HNCO (amide hydrogen), and ELE (electrostatic field). The 3D QSAR models were built for each probe using a maximum of 5 principal components. Initially generated molecular interaction fields (MIFs) and PLS 3-D QSAR models were first optimized on 1 Å grid spacing using the standard pretreatment protocol (energy cutoff of ± 5 Kcal/mol, zeroing = 0.01 Kcal/mol, and minimum standard deviation = 0.05) and by storing the corresponding standard (r^2) and cross-validated (q^2) correlation coefficients. A second stage of optimization was achieved by a Variable Pretreatment Optimization (VPO) procedure using Leave-One-Out (LOO) and Leave-Some-Out (LSO) cross-validation while monitoring q^2 . Full pretreatment of the data derived from the MIFs calculations was performed by exploring the combinations of cutoff values from -5 to 5 kcal/mol with intervals between the cutoffs equal to 1, zero values from -0.005 to 0.05 kcal/mol with an interval of 0.005, and standard deviation values from -0.01 to 0.1 with an interval of 0.01. The final 3-D QSAR models (Table 7) were obtained by the fractional factorial design (FFD) feature selection procedure. The internal validation (robustness) of the 3-D QSAR models was evaluated by classical crossvalidation (CV) techniques (LOO and LSO), while the lack of random correlation was evaluated by CV and Y-scrambling combination (Table 7). The best 3D QSAR models were used to predict the activity of either co-crystalized TR compounds (Table 1) or SB-aligned TS compounds (Table 3).

4. Conclusions

The enclosed manuscript summarizes the efforts to define the pharmacodynamics of **SCs** available in the literature [21,34] as 5-HT₂AR ligands, namely agonists (i.e., psychedelic abusers) and IAs/PAs (i.e., non-psyshostimulants). The bioactive conformations of **SCs** were obtained using the AutoDock Vina [69] after exhaustive SB alignment evaluation on co-crystallized 5-HT₂AR and 5-HT₂BR ligands, while the crucial interactions leading to the inhibition constants and possible psychedelic effects for AGs were described by a statistically robust CoMFA-like 3-D QSAR model, as generated by Open3DQSAR [77], starting from the OH2 probe, using both steric and electrostatic fields. The obtained *PLS-coefficients* maps were summarized in a 3-D SAR model (i.e., molecular determinants), a useful tool for virtual screening campaigns in the search for new SCs with potential psychedelic effects with an etiology in the agonism of 5-HT₂AR. The applicability of the OH2 probe 3-D QSAR model as a predictive engine was evaluated on co-crystallized 5-HT₂AR ligands, showing satisfactory predictive properties, considering that none of the experimentally resolved 5-HT₂AR ligands were structural homologs of **SCs**.

Supplementary Materials: following The are available online at https://www.mdpi.com/article/10.3390/molecules28176236/s1, Table S1. Onsets and durations of actions of SCs 5-HT2AR ligands compiling the TR. Table S2. Structure-based alignment assessment of 5-HT_{2A}R ligands. Table S3. Structure-based alignment assessment of 5-HT_{2B}R ligands. Table S4. Best Open3DQSAR Models' (OH2 model at PC5) Predictive Abilities for TR. TableS5. Best Open3DQSAR Models' (OH2 model at PC5) Predictive Abilities for TS. TableS6. Best Open3DQSAR Models' (OH2 model at PC5) Predictive Abilities for TSCRY. Figure S1. The structure-based alignment within 5-HT2AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 23 (a,b); 11 (c,d); 19 (e,f). For the clarity of presentation, DPPC was omitted. Figure S2. The structure-based alignment within 5-HT_{2A}R-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 24 (a,b); 5 (c,d); 20 (e,f). For the clarity of presentation, DPPC was omitted. Figure S3. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 12 (a,b); 21 (c,d); 6 (e,f). For the clarity of presentation, DPPC was omitted. Figure S4. The structure-based alignment within 5-HT_{2A}R-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 7 (a,b); 14 (c,d); 8 (e,f). For the clarity of presentation, DPPC was omitted. Figure S5. The structure-based alignment within 5-HT2AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 3 (a,b); 22 (c,d); 10 (e,f). For the clarity of presentation, DPPC was omitted. Figure S6. The structure-based alignment within 5-HT2AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 15 (a,b); 16 (c,d); 13 (e,f). For the clarity of presentation, DPPC was omitted. Figure S7. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 28 (a,b); 29 (c,d); 30 (e,f). For the clarity of presentation, DPPC was omitted. Figure S8. The structure-based alignment within 5-HT2AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 31 (a,b); 32 (c,d); 33 (e,f). For the clarity of presentation,

DPPC was omitted. Figure S9. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 34 (a,b); 35 (c,d); 36 (e,f). For the clarity of presentation, DPPC was omitted. Figure S10. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 37 (a,b); 38 (c,d); 39 (e,f). For the clarity of presentation, DPPC was omitted. Figure S11. The structure-based alignment within 5-HT_{2A}R-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 40 (a,b); 41 (c,d); 42 (e,f). For the clarity of presentation, DPPC was omitted. Figure S12. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 43 (a,b); 44 (c,d). For the clarity of presentation, DPPC was omitted. Figure S13. The structure-based alignment within 5-HT2AR-DPPC and OH2 probebased PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 45 (a,b); 46 (c,d). For the clarity of presentation, DPPC was omitted. Figure S14. The structure-based alignment within 5-HT2AR-DPPC and OH2 probe-based PLScoefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 6WGT (a,b); 7WC6 (c,d); 7WC7 (e,f). For the clarity of presentation, DPPC was omitted. Figure S15. The structure-based alignment within 5-HT2AR-DPPC and OH2 probebased PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 6A93 (a,b); 7VOD (c,d); 7VOE (e,f). For the clarity of presentation, DPPC was omitted. Figure S16. The structure-based alignment within 5-HT₂AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 7WC4 (a,b); 7RAN (c,d); 7WC5 (e,f). For the clarity of presentation, DPPC was omitted. Figure S17. The structure-based alignment within 5-HT2AR-DPPC and OH2 probe-based PLS-coefficients (positive steric coefficients presented in green, negative steric coefficients depicted in yellow, positive electrostatic coefficients portrayed in red, negative electrostatic coefficients displayed in blue) for 7WC9 (a,b); 7WC8 (c,d). For the clarity of presentation, DPPC was omitted.

Author Contributions: Conceptualization, N.T., R.R. and M.M.; methodology, N.T., R.R. and M.M.; validation, M.V., E.K., V.R., B.A., S.L.M., M.B., R.F. and E.P., formal analysis, M.V., E.K., V.R., B.A., S.L.M., M.B., R.F. and E.P.; investigation, all authors; resources, all authors; a curation, all authors; writing—original draft preparation, N.T.; writing—review and editing, R.R. and M.M.; supervision, R.R. and M.M. All authors have read and agreed to the published version of the manuscript.

Funding: This work was supported by the Serbian Ministry of Science, Technological Development, and Innovation (Agreement Nos. 451-03-47/2023-01/200122 and 451-03-47/2023-01/200378), and supported by two grants from Progetti di Ricerca di Università 2015, Sapienza Università di Roma (C26A15RT82 and C26A15J3BB).

Informed Consent Statement: Not applicable.

Data Availability Statement: Complexes herein used to derive 3-D QSAR models and perform SB alignments assessments are available at Protein Data Bank (https://www.rcsb.org/). Structures of other training set and test set compounds are retrieved from literature. The obtained 3-D QSAR models are available upon request from Milan Mladenović (E-mail: milan.mladenovic@pmf.kg.ac.rs).

Conflicts of Interest: The authors declare no conflicts of interest.

Sample Availability: Not applicable.

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