# Discovery of novel 5-HT2A receptor modulators for the treatment of mood disorders

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# Objective

Treatment-resistant depression impacts approximately 30% of people with major depressive disorder, and therapeutic approaches with robust and sustained efficacy remain a significant medical need [18].

Psilocybin, and its active metabolite psilocin, are naturally-occurring psychedelic compounds found in hundreds of species of hallucinogenic mushrooms with an extensive history of use in humans. These compounds exert functional activity at a variety of central nervous system receptors, including serotonin receptors, of which agonism at 5-HT2A receptors is believed to mediate the psychedelic effects [15].

Accumulating clinical research indicates that psilocybin demonstrates rapid and lasting antidepressant efficacy following single administration, including in treatment-resistant patients [7,9,10]. 5-HT2A receptor activation may play a role in the mood-improving effects of psilocybin [13]. Preclinical research also supports the therapeutic potential of psilocybin and psilocin, based on neuroplasticity-promoting and antidepressantlike behavioral effects [8,11,12,14,16,17]. Interestingly, some studies suggest 5-HT2A receptor activation-induced hallucinogenic activity may not be required for therapeutic-like effects.

A goal of Entheogenix Biosciences (EGX) research is to use a combination of artificial intelligence (AI)-based drug design, traditional medicinal chemistry and structure-based drug design to discover novel 5-HT2A receptor agonists with optimal CNS drug-like properties that show in vitro and in vivo pharmacological effects consistent with psilocybin/psilocin, including antidepressant-like activity.

# Methods

### **AI-Enabled Hit Identification Methods**

To generate initial hit molecules, we used our Ligand Design methodology, which uses a small molecule generator, Deriver [1], and assesses proposed molecules using MatchMaker [2] to select those predicted to preferentially bind targets over anti-targets. Briefly, MatchMaker is a deep learning model that predicts binding between a small molecule drug/binding site pair by using paired structural features of the small molecule with the 3D structural features of the protein binding sites. MatchMaker is trained with positive example complexes of a molecule within a pocket by threading drug-target interaction (DTI) data onto 3D structures of protein-ligand binding sites obtained from the Protein DataBank and SwissModel. Negative data is simulated by shuffling positive DTI pairs and designating them alternative proteins to avoid any small molecule structural bias.

To employ this methodology, we first collected protein structure models for all targets and anti-targets The lone target of interest was 5-HT2A, with anti-targets including 5-HT2B, DRD2/3, and HRH1. Both homology models and crystal structures were explored for each of the targets under consideration. For 5-HT2A, at the time of the study the PDB structures available (6A93, 6A94) were both co-crystallized with antagonist molecules, with these sites selected to represent 5-HT2A. It was deemed that this was an acceptable site given that this same site would accommodate agonists (a later paper would confirm agonists binding [3]). In the end, while several anti-targets were used in preliminary test runs, we elected to focus on 5-HT2B as the major anti-target, utilizing structure models already embedded in our pocketome (i.e., the proteins used within training) as well as several picked specifically with co-crystal structure (6DRX, 6DRY, 6DRZ).

With targets and anti-target sites selected, we ran Ligand Design to explore chemistry within the Enamine REAL Space. Initial generations used random combinations of synthons, with subsequent generations selecting molecules as parents for the next generation based on a weighted scoring function for target over anti-target. The method was run until convergence, which was defined as 2 consecutive generations where no new top scoring compounds were found. Chemistry explored was limited to those that had aliphatic amines, to bias selection for a well-established pharmacophore. Molecules were selected by balancing activity for target and selectivity over anti-target.

#### In vitro pharmacology methods

Calcium flux assays were performed using human 5-HT receptor subtype GPCR Biosensor Assays in agonist mode. Gq-mediated secondary messenger signaling of calcium mobilization is monitored with a calcium-sensitive dye and is used as a readout for GPCR activation. Stably-transfected cell lines (U2OS) expressing human 5-HT2A and 5-HT2C receptors were loaded with the calcium-sensitive dye in exchange of culture media prior to drug treatments. Reference and test compound agonist activity was measured on a FLIPR Tetra (MDS) via fluorescence detection of the calcium-sensitive dye. 5-HT was used as the assay reference agonist. Data were normalized to the maximal and minimal response observed in the presence of control ligand and vehicle.

β-Arrestin activity was determined using a stably-transfected cell line (U2OS) expressing human 5-HT2A receptors with the PathHunter assay (Eurofins DiscoverX), which utilizes an Enzyme Fragment Complementation technology with β-galactosidase as the functional reporter. The enzyme is split into two inactive complementary portions expressed as fusion proteins in the cell. Upon 5-HT2A activation and β-Arrestin recruitment, complementation occurs, restoring β-galactosidase activity. Cells were incubated with reference or test compound, with 5-HT as the reference agonist, and β-Arrestin recruitment, via 5-HT2A receptor activation and β-galactosidase complementation was measured using chemiluminescent PathHunter Detection Reagents. Data were normalized to the maximal and minimal response observed in the presence of control ligand and vehicle.

IPOne assays were performed using stably-transfected cell lines (CHO-K1) expressing human 5-HT2A or 5-HT2B receptors. Upon activation of these receptors, Gq-mediated myo-Inositol 1 phosphate (IP1) production is detected by a Homogeneous Time-Resolved Fluorescence (HTRF) competitive immunoassay, whereby an IP1 analog coupled to a fluorophore (acceptor) competes with endogenous IP1 for binding to a labeled anti-IP1 antibody (donor). The resulting signal is inversely proportional to the concentration of IP1 in the sample. Cells were incubated with an IP1 inhibitor (to prevent degradation and allow detection) and either reference compound or test compound. α-Me-5-HT was used as the assay reference agonist. Activation of 5-HT2A or 5-HT2B receptors was measured via accumulation of IP1 detected by HTRF. Agonist activity of test compounds was expressed as a percentage of the activity of the reference agonist at its EC100 concentration.

#### In Vivo Pharmacology Methods

Mouse Head Twitch Response (HTR). Male C57BL/6J mice at 6-8 weeks (Jackson Laboratories) were group housed in a vivarium at UCSD. The room was operated on a reverse light cycle (1900h on; 0700h off) with food and water available ad libitum, except during testing. All testing was conducted between 1000h and 1800h. Mice were surgically implanted with a small neodymium magnet attached to the cranium and fixed with dental cement. After a minimum 2-week recovery period, the mice were injected intraperitoneally with drug or vehicle and immediately placed in a glass cylinder surrounded by a magnetometer coil and activity was recorded during a 30 min test [4]. Coil voltage was amplified, low pass filtered (2 kHz cutoff), and digitized (20 kHz sampling rate). Head twitches were identified in the recordings using a validated technique based on artificial intelligence [5]. Data were plotted as the average number of HTR recorded during the test for each treatment group and analyzed using a 1-way Analysis of Variance (ANOVA; GraphPad Prism). If there was a significant overall effect of treatment at the p<0.05 level, then a Dunnett's post hoc test was performed to compare each treatment group to the vehicle condition.

Rat Forced Swim Test (FST). Male adult Sprague Dawley rats were used for FST experiments. Animals were grouped 3/cage and housed in a room operated on a light cycle (1900h off; 0700h on) with food and water available ad libitum, except during testing. Rats were handled daily for a minimum of 3 days prior to testing. On Day 1 following a 1 hr acclimation to the testing room, rats were subjected to a 15 min pre-swim in 24 ± 1°C water. Once dried, rats were administered vehicle, ketamine or imipramine, and EGX compounds. Eight hours following the pre-swim, rats received a second administration of test articles except for ketamine. A final third administration of test articles except for ketamine was given 15 or 30 min prior to the 5 min FST on Day 2. Data were plotted as the average % of vehicle response for frequency or duration of immobility recorded during the test for each treatment group and analyzed using a 1-way Analysis of Variance (ANOVA; GraphPad Prism). If there was a significant overall effect of treatment at the p<0.05 level, then a Dunnett's post hoc test was performed to compare each treatment group to the vehicle condition.

D., Daskalakis, Z. J., and Blumberger, D. M. (2020). Management of treatment-resistant depression: Challenges and strategies. Neuropsychiatr Dis Treat 16, 221-234. 19. Ghosh, E., Kumari, P., Jaiman, D., and Shukla, A.K. (2015). Methodological advances: the unsung heroes

## References

Feb 14. 5. Halberstadt, AL. Automated detection of the head-twitch response using wavelet scalograms and a deep convolutional neural network. 2020 May:10(1):8344. doi: 10.1038/s41598-020-65264-x. 6. Klein, AK., Chatha, M., Laskowski, LJ., Anderson, El., Brandt, SD. Chapman, SJ., McCorvy, JD., Halberstadt, AL. Investigation of the structure-activity relationships of psilocybin analogues. 2020 Dec:4(2):533-542. doi: 10.1021/acsptsci.0c00176. 7. Carhart-Harris, R. L., Roseman, L., Bolstridge, M., Demetriou, L., Pannekoek, J. N., Wall, M. B., Tanner, M., Kaelen, M., McGonigle, J., Murphy, K., Leech, R., Curran, H. V., and Nutt, D. J. (2017). Psilocybin for treatment-resistant depression: fMRI-measured brain mechanisms. Scientific Reports 7, 13187. DOI:10.1038/s41598-017-13282-7 8. Catlow, B. J., Song, S., Paredes, D. A., Kirstein, C. L, and Sanchez-Ramos, J. (2013). Effects of psilocybin on hippocampal neurogenesis and extinction of trace fear conditioning. Exp Brain Res DOI 10.1007/s00221-013-3579-0 9. Compass Pathways Nov 9, 2021, press release https://ir.compasspathways. com/news-releases/news-release-details/compass-pathways-announces-positive-topline-results: 10. Griffiths, R. R., Johnson, M. W., Carducci, M. A., Richards, W. A., Richards, B. D., Cosimano, M. P., and Klinedinst, M. A. (2016), Psilocybin produces substantial and sustained decreases in depression and anxiety in patients with life-threatening cancer: A randomized double-blind trial. J. Psychopharmacol 30(12), 1181-1197. 11. Hesselgrave, N., Troppoli, T. A., Wulff, A. B., Cole, A. B., and Thompson, S. M. (2021). Harnessing psilocybin: antidepressant-like behavioral and synaptic actions of psilocybin are independent of 5-HT2R activation in mice. PNAS 118(17), e2022489118. doi.org/10.1073/pnas.2022489118 12. Hibicke, M., Landry, A. N., Kramer, H. M., Talman, Z. K., and Nichols, C. D. (2020). Psychedelics, but not ketamine, produce persistent antidepressant-like effects in a rodent experimental system for the study of depression. ACS Chem Neurosci 11, 864-871. 13. Kometer, M., Schmidt, A., Bachmann, R., Studerus, E., Seifritz, E., and Vollenweider, F. X. (2012). Psilocybin

of the GPCR structural revolution. Nat. Rev. Mol. Cell Biol. 16, 69-81.

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1. Reeves, S. et al. Assessing methods and obstacles in chemical space exploration. Applied AI Lett 1, e17(2020). https://doi.org/10.1002/ail2.17 2. Sugiyama, M.G., Cui, H., Redka, D.S. et al. Multiscale interactome analysis coupled with off-target drug predictions reveals drug repurposing candidates for human coronavirus disease. Sci Rep 11, 23315 (2021). https://doi.org/10.1038/s41598-021-02432-7 3. Kim, K. et al. Structure of a Hallucinogen-Activated Gq-Coupled 5-HT2A Serotonin Receptor. Cell 182, 1574 (2020). https://doi.org/10.1016/j. cell.2020.08.024 4. Halberstadt, AL., Geyer, MA. Characterization of the head-twitch response induced by hallucinogens in mice: detection of the behavior based on the dynamics of head movement. 2013 Jun:227(4):727-39. doi: 10.1007/s00213-013-3006-z. Epub 2013 biases facial recognition, goal-directed behavior, and mood state toward positive relative to negative emotions through different serotonergic subreceptors. Biol Psychiatry 72(11), 898-906. 14. Ly, C., Greb, A. C., Cameron, L. P., Wong, J. M., Barragan, E. V., Wilson, P. C. Burbach, K. F., Zarandi, S. S., Sood, A., Paddy, M. R., Duim, W. C., Dennis, M. Y., McAllister, A. K., Ori-McKenney, K. M., Gray, J. A., and Olson, D. E. (2018). Psychedelics promote structural and functional neural plasticity. Cell Reports 23, 3170-3182. 15. Nichols, D. E. (2016). Psychedelics. Pharmacol Rev 68, 264-355. 16. Raval, N. R., Johansen, A., Donovan, L. L., Ros, N. F., Ozenne, B., Hansen, H. D., and Knudsen, G. M. (2021). A single dose of psilocybin increases synaptic density and decreases 5-HT2A receptor density in the pig brain. Int J Mol Sci 22, 835. doi.org/10.3390/ijms22020835 17. Shao, L-X., Liao, C., Gregg, I., Davoudian, P. A., Savalia, N. K., Delagarza, K., and Kwan, A. C. (2021). Psilocybin induces rapid and persistent growth of dendritic spines in frontal cortex in vivo. Neuron 109, 2535-2544. 18. Voineskos,

## Results





compounds with activity greater than psilocin. (Right panel) Representative concentration response curves of compound activity at 5-HT2A, 5-HT2B, and 5-HT2C receptors in the indicated assays (Ca++ (calcium flux), β-Arrestin recruitment, and IPOne (inositol phosphate (IP) 1 accumulation via IP3 stimulation)). Compound activity preference determined by comparing relative agonism (log(Emax/EC50), normalized to assay reference agonist). The reference agonist for each receptor/assay is indicated as either 5-HT or α-Me-5-HT. B. EGX compounds rank-ordered by relative agonist selectivity for 5-HT2A over 5-HT2B receptors (ΔΔlog(Emax/EC50); IPOne assay). Square symbols, compounds with selectivity ratio > 30,000. Assay reference ( $\alpha$ -Me-5-HT) used for normalization at each receptor (5-HT2A/5-HT2B selectivity = 1).

# Summary table

Table 1: In vitro and in vivo profiles of hallucinogenic and non-hallucinogenic EGX compounds											
		in vitro profile					in vivo profile				
		5-HT2A EC50 (nM)			5-HT2B EC50 (nM)	5-HT2C EC50 (nM)	Mean HTR at Max Active or Tested Dose	HTR Min Effective Dose (mg/kg, IP)	HTR ED50 (mg/kg, IP)	Mean Mouse Brain/Plasma Ratio (IP)	Mean Rat Brain/Plasma Ratio (IP)
		Ca++	β-Arr	IPOne	IPOne	Ca++					
Hallucinogenic	Psilocin[6]	51.0	28.0	18.2	21.6	1.1	39	0.3	0.15	12	NA
	EGX-1	7,700	4,200	NA	NA	>10,000	62*	30*	17*	NA	NA
	EGX-A	4.2	17.2	2.8	34.7	42.2	50	3	1.7	4.4	3.4
	EGX-B	9.0	25.8	9.2	81.1	73.52	41	10	3.4	5.7	3.8
Non-hallucinogenic	EGX-C	2.4	4.5	<1.0	19.3	280.0	5	>30	>30	2.6	NA
	EGX-D	3.0	0.7	1.1	143.0	70.0	8	>60	>60	4.6*	8.8

\*Subcutaneous administratio NA: not available





Figure 4. Effect of pro-hallucinogenic EGX compounds (HTR positive) on immobility during FST. Left: Illustration of the FST. Center: EGX-A (3, 10, and 30 mg/kg, i.p.) was dosed 3 times at 23.5, 16, and 0.5h before FST, and ketamine (10 mg/kg, i.p.) was dosed once at 23.5h before FST. Right: EGX-B (10, 30, 60 mg/kg, i.p.) and imipramine (30 mg/kg, i.p.) were dosed 3 times at 23.5, 16, and 0.25h before FST. \* p<0.05, \*\* p<0.01, \*\*\*\* p<0.0001 difference from vehicle, Dunnett's post hoc test.

# Summary

- drug-like properties.
- psilocin.
- psilocybin/psilocin.



Chi EntheogeniX

Presentation Number: 147.02



Al-enabled drug design, followed by traditional medicinal chemistry and structure-based drug design, led to the discovery of two novel chemical series with potent 5-HT2A receptor agonism and optimal CNS

Novel compounds exhibited potent human 5-HT2A receptor activation of G protein-dependent and independent signaling, consistent with the in vitro functional activity profile of psilocin. In addition, compounds showed improved selectivity for 5-HT2A versus 5-HT2B receptor activation relative to

Novel compounds also induced HTR in mice with lower hallucinogenic potency than psilocin, as well as antidepressant-like activity in the rat FST. Studies are in progress to evaluate the activity of selected compounds in a rat model of treatment-resistant depression.

These results demonstrate the potential for the discovery of novel, potent, small molecule 5-HT2A receptor agonists for the treatment of mood disorders with improved safety profiles relative to

As it remains unclear if a hallucinogenic subjective experience is necessary for antidepressant effects, novel non-hallucinogenic 5-HT2A receptor agonists currently are being explored for antidepressant-like activity as potential therapeutics that may offer more convenient dosing to a broader patient population.