ARTICLE OPEN Lasting dynamic effects of the psychedelic 2,5-dimethoxy-4-iodoamphetamine ((±)-DOI) on cognitive flexibility

Merima Šabanović $\mathbb{D}^{1,3}^{\mathbb{N}}$, Alberto Lazari², Marta Blanco-Pozo^{1,2,4}, Cristiana Tisca², Mohamed Tachrount², Aurea B. Martins-Bach², Jason P. Lerch², Mark E. Walton $\mathbb{D}^{1,2,5}^{\mathbb{N}}$ and David M. Bannerman $\mathbb{D}^{1,5}^{\mathbb{N}}$

© The Author(s) 2024

Psychedelic drugs can aid fast and lasting remission from various neuropsychiatric disorders, though the underlying mechanisms remain unclear. Preclinical studies suggest serotonergic psychedelics enhance neuronal plasticity, but whether neuroplastic changes can also be seen at cognitive and behavioural levels is unexplored. Here we show that a single dose of the psychedelic 2,5-dimethoxy-4-iodoamphetamine ((\pm)-DOI) affects structural brain plasticity and cognitive flexibility in young adult mice beyond the acute drug experience. Using ex vivo magnetic resonance imaging, we show increased volumes of several sensory and association areas one day after systemic administration of 2 mgkg⁻¹ (\pm)-DOI. We then demonstrate lasting effects of (\pm)-DOI on cognitive flexibility in a two-step probabilistic reversal learning task where 2 mgkg⁻¹ (\pm)-DOI improved the rate of adaptation to a novel reversal in task structure occurring one-week post-treatment. Strikingly, (\pm)-DOI-treated mice started learning from reward omissions, a unique strategy not typically seen in mice in this task, suggesting heightened sensitivity to previously overlooked cues. Crucially, further experiments revealed that (\pm)-DOI's effects on cognitive flexibility were contingent on the timing between drug treatment and the novel reversal, as well as on the nature of the intervening experience. (\pm)-DOI's facilitation of both cognitive adaptation and novel thinking strategies may contribute to the clinical benefits of psychedelic-assisted therapy, particularly in cases of perseverative behaviours and a resistance to change seen in depression, anxiety, or addiction. Furthermore, our findings highlight the crucial role of time-dependent neuroplasticity and the influence of experiential factors in shaping the therapeutic potential of psychedelic interventions for impaired cognitive flexibility.

Molecular Psychiatry; https://doi.org/10.1038/s41380-024-02439-2

INTRODUCTION

Serotonergic psychedelic drugs are psychoactive substances that induce acute changes in the perception of self, environment, and time, causing a non-ordinary state of consciousness, while also promoting long-term improvements in mood and psychological wellbeing [1, 2]. Growing evidence supports the lasting therapeutic effects of psychedelic-assisted psychotherapy for various conditions, including depression, anxiety, addictions, and personality disorders [3–10]. Healthy individuals also report higher positive affect and better wellbeing, effects that can persist for months [11] or up to a year following a double [12] or even a single [13] treatment course, but the underlying mechanisms of these rapid and long-lasting behavioural changes remain unclear.

Psychedelics are capable of rapidly promoting structural and functional neuroplasticity shortly after administration [14]. Significant epigenetic and gene expression changes occur within hours [15–17], followed by a striking increase in dendritogenesis and spinogenesis that peak within 72 h and decline over a week [17–21]. Although these effects diminish over time, some structural and functional adaptations that have occurred in this period can potentially persist for weeks after [18]. The emerging

dominant theory suggests that these psychedelic-induced neuroplastic adaptations can lead to long-lasting changes in mood and learning [2]. The psychedelic-induced window of plasticity may not be the sole catalyst for behavioural shifts, but instead could be acting as a gateway that improves learning or adaptability in conjunction with the heightened influence of environmental factors [2, 22, 23]. However, despite extensive and well-replicated research on the neuronal plasticity effects of psychedelics [24–30], the long-term impact of psychedelics on cognitive and behavioural plasticity, and their interaction with environmental factors, remains unclear.

Putative effects of psychedelics on cognition are particularly relevant considering that the psychedelics' therapeutic effects have been shown across various mental disorders characterised by rigid cognitive and behavioural patterns and compulsive traits. Examples include rumination and negative cognition in anxiety and depression [31], difficulties in attentional switching in post-traumatic stress disorder [32], and compulsive rituals in eating disorders, addiction, and obsessive-compulsive disorder [33, 34]. In all these cases, impairments in cognitive flexibility are indicated by the persistence of a maladaptive response and a limited

¹Department of Experimental Psychology, University of Oxford, OX1 3SR Oxford, UK. ²Wellcome Centre for Integrative Neuroimaging, University of Oxford, OX3 9DU Oxford, UK. ³Present address: Department of Psychiatry, Weill Cornell Medicine, New York, NY 10065, USA. ⁴Present address: Department of Biology, Stanford University, Stanford, CA 94305, USA. ⁵These authors jointly supervised this work: Mark E. Walton, David M. Bannerman. ^{Sem}email: mes4023@med.cornell.edu; mark.walton@psy.ox.ac.uk; david.bannerman@psy.ox.ac.uk

exploration of novel response strategies. Cognitive flexibility, which enables adaptation of beliefs or thoughts when they are no longer optimal [35], has been associated with greater resilience to negative life events and stress [36], suggesting that enhancing cognitive flexibility may have a protective and remedial effect on maladaptive stress responses. Yet, despite the suggested benefits of psychedelics on cognitive flexibility [2, 37–39], such effects have not been thoroughly investigated.

Existing evidence has produced mixed results, with studies suggesting both improvements [40–45] and deficits [45, 46] in cognitive flexibility following psychedelic administration, while others have found no discernible effects [47]. However, most studies to date have primarily focused on simple compulsivity tasks and serial reversals, testing only in the acute or sub-acute drug phase, despite the evidence that response inhibition [48] and working memory [49–51] are diminished under the influence of psychedelics. This approach overlooks the enduring behavioural changes that characterise the unique therapeutic effects of psychedelics. Therefore, there is a pressing need to investigate cognitive changes that manifest in the days and weeks following psychedelic treatment to begin uncovering the lasting consequences of psychedelic intervention.

To understand how structural and functional changes in individual neurons could translate to changes in mood and behaviour, our focus was on exploring the critical knowledge gap of psychedelic-induced plasticity at higher levels of analysis. Our primary objectives were, first, to confirm the structural plasticity effects of psychedelics at the level of whole-brain regions, and, second, to test any putative improvement in cognitive flexibility. We combined a single dosing regimen of a psychedelic substituted amphetamine, 2,5-dimethoxy-4-iodoamphetamine ((±)-DOI), with a multi-step reversal learning task and brain imaging in the post-acute phase of drug action. We hypothesised that the previously reported neuronal plasticity effects of psychedelics would be robust enough to result in observable changes in regional brain volumes, as measured by magnetic resonance imaging (MRI) during the period of highest neuronal plasticity. Furthermore, we expected that the rich synaptic landscape created by psychedelic-induced plasticity would facilitate enhanced speed and/or accuracy of reversal learning following (±)-DOI treatment, as assessed by adaptation to rule changes in a decision-making task. By investigating enduring structural and cognitive effects of psychedelics, we aimed to shed light on the long-term consequences of psychedelic-induced neuronal plasticity, providing valuable insights into the potential therapeutic applications of these substances.

METHODS

See Supplementary Information for detailed methods.

Animals

All experiments were conducted under the UK Animal (Scientific Procedures) Act 1986 and the Local Ethical Review Committee at the University of Oxford. Adult male C57BL/6J mice (Charles River, Kent, UK) were used for all experiments, randomly assigned to either the control or drug condition prior to starting experiments. Food and water were available *ad libitum* unless the animals were under water restriction for behavioural testing (Supplementary Information).

Drug

(±)-DOI hydrochloride (Sigma-Aldrich, D101-10MG) was dissolved in 0.9% saline (Aqupharm[®] No. 1), the vehicle control in all experiments. Each animal received only one injection, administered intraperitoneally at 5 mlkg⁻¹. A 2 mgkg⁻¹ dose of (±)-DOI was used for all experiments as it resulted in near-peak acute psychedelic effects when administered in a novel testing environment (Supplementary Fig. S1).

Ex vivo MRI

The sample preparation procedure was adapted from previous reports (Supplementary Information) [52]. Images were acquired with a 7T field strength Bruker BioSpec[®] 70/20 USR multipurpose high field MR scanner using an 86 mm transmit and a 2×2 receive-only CryoProbe (Bruker BioSpin) coil. T2-weighted Rapid Acquisition with Relaxation Enhancement (RARE) sequence parameters were: TR/TE = 350/36 (12 ms echo spacing and 6 RARE factor), BW = 60 kHz, 400 × 160 × 200 matrix, 60 µm isotropic voxels, imaging time 33 min.

Image analysis and visualisation were performed using the RMINC and MRIcrotome toolkits in R [53]. An analysis of variance (ANOVA) for the main effect of the drug was computed across the whole brain, either at every voxel or every region of interest (ROI). To assess the relative differences across groups, t-tests were computed at every voxel/ROI comparing samples from (±)-DOI- and vehicle-treated mice. False discovery rate (FDR) was set at an explorative 20% to maximise discovery rate for unbiased whole-brain analyses.

Two-step reversal learning task

Mice were trained on a two-step probabilistic reversal learning task, as described previously [54] (training timeline in Supplementary Table S1). The task required water-restricted mice to initiate a trial by poking a central port and then choose between two possible step 1 ports (left/right) to access a water reward at one of the two step 2 ports (up/down). In step 2, one of the up/down reward ports lit up for the animal to poke and water reward was delivered according to a probabilistic schedule. Reward probabilities were anticorrelated - i.e., when reward probability was high (80%) for one port, it was low (20%) for the other – and reversed serially in each session. Each step 1 choice was associated with a common transition (80% of trials) to one step 2 reward port and a rare transition (20% of trials) to the other. Transitions were initially fixed for each mouse (counterbalanced across animals). During post-drug testing, a single transition reversal was implemented, either one week (Two-step Experiments 1 & 3) or one day (Two-step Experiment 2) after drug treatment (Supplementary Fig. S2), making the previously common transitions rare, and vice versa.

Data analysis

General task performance was quantified as the mean number of trials, correct choices, and reward reversals completed in one session. Trial-totrial learning was assessed using a logistic regression model (Supplementary Information) predicting the likelihood of repeating a choice based on the earlier trial events (type of transition and outcome). We also implemented a second logistic regression that evaluated the effect of transition type on rewards and omissions separately. Significance of individual predictors was determined by one sample *t*-tests (or Wilcoxon signed-rank) against zero. Pre-drug performances were compared via unpaired *t*-tests, or two-way repeated measures (RM) ANOVA for preversus post-drug comparisons, supplemented by Bayesian equivalents.

Adaptation of choice strategies to reward reversals was assessed by calculating average choice probability in the first 20 post-reversal freechoice trials, averaging across individual subjects, and comparing across groups with a permutation test (Supplementary Information).

Adaptation of choice strategies to the transition reversal was assessed with the logistic regression models applied across three concatenated sessions to supply enough trials for accurate model fits. Time series of regression coefficients were then fitted using nonlinear regression. First, best-fit models (horizontal line, line, or one-phase association) were found for (\pm)-DOI and control datasets separately. The drug effect was considered significant if best-fit models differed across datasets, *or* if separate fits for the same best-fit model were preferred over a global fit across both datasets. The same approach was used to compare post-reversal general task performance over time. Detailed analysis methods are in Supplementary Information.

RESULTS

See figure legends for detailed statistical results.

Grey matter volume changes one day after (±)-DOI

We first wanted to examine whether the previously reported (\pm) -DOI-induced increases in dendritic branching and spinogenesis [17, 19, 20] would be reflected in discernible changes in regional grey matter volume. We injected mice with either



Fig. 1 (±)-DOI increased the volume of several sensory and association cortical areas within one day. A Experiment timeline. The brains were collected one day after an injection of either 2 mgkg^{-1} (±)-DOI or saline vehicle. **B**–**E** The False Discovery Rate (FDR) correction at an explorative 20% resulted in the marginal *t*-statistic = 3.49 (linear model $F_{1,14} = 12.19$). Significant increases were in primary somatosensory (S1) shoulder (t = 4.25) and trunk (t = 4.15) areas, retrosplenial agranular area (RSA, t = 3.68), lateral parietal association area (LPtA, t = 3.61), ventral secondary auditory area (AuV, t = 3.53), and lateral secondary visual cortex (V2L, t = 3.49). Volume increases in the primary visual area (V1, t = 5.75) and temporal association area (TeA, t = 4.83) survived the strict 5% FDR ($F_{1,14} = 23.30$, marginal *t*-statistic =4.83). $n_{group} = 8$. D: dorsal. V: ventral. L: left. R: right.

2 mgkg⁻¹ (±)-DOI or saline vehicle and collected their brains 24–36 h later (Fig. 1A, $n_{\text{group}} = 8$). At an explorative 20% FDR threshold, hierarchical unbiased ROI-wise ex vivo MRI analysis returned significant enlargements of several sensory areas (Fig. 1B-E, Supplementary Fig. S3): primary and lateral secondary visual areas (V1 and V2L, respectively), ventral secondary auditory cortex (AuV), and parts of primary somatosensory cortex (S1). Additionally, transmodal association regions such as temporal association area (TeA), lateral parietal association area (LPtA), and retrosplenial agranular area (RSA) were significantly larger in (±)-DOI-treated samples. V1 (q = 0.016) and TeA (q = 0.043) survived the conservative 5% FDR threshold. Volume enlargements ranged from $16.4 \pm 3.9\%$ (mean \pm SEM) in the shoulder region of left S1 to $6.6 \pm 1.8\%$ in the left RSA (Supplementary Table S2). In each ROI, the left hemisphere was the one showing statistically significant differences, with the right hemisphere volumes not crossing the significance threshold.

To further understand the spatial distribution of volume changes, we determined local volume differences with a more detailed, voxel-wise analysis. Significant enlargements at the 20% FDR threshold were also detected in parts of the right hemisphere V1, V2L, and S1 (Supplementary Fig. S4). Significant voxel-wise differences were found in regions other than those highlighted in the ROI-wise analysis. Some of these were bilateral (e.g., lateral posterior thalamic and caudal pontine reticular nuclei), while

others were restricted to the left (e.g., motor cortex and CA1) or right (e.g., anterior olfactory and amygdaloid areas, entorhinal cortex) hemisphere only. Taken together, these data demonstrate that (\pm) -DOI induced post-acute grey matter structural changes across cortical and subcortical areas.

Pre-drug cognitive strategies in the two-step task

Given the suggested relationship between psychedelics and neuronal plasticity [17–21], we hypothesised that (\pm)-DOI could shape the synaptic landscape to be conducive to improved learning and cognitive flexibility [2, 38]. We explored the potential impact of (\pm)-DOI on cognitive flexibility by training young adult water-restricted mice (N = 82) on a two-step reversal learning task in which subjects made a left/right choice in step 1 to access an up/down port in step 2 which delivers water reward on a probabilistic schedule (Fig. 2A, B). To maximise reward rate, mice had to track the reward probabilities at up/down ports, which were anticorrelated and reversed in series, and the transition probabilities, determining the likelihood of an initial left/right choice leading to a particular up/down state, which were fixed (Fig. 2B, C).

Pre-treatment, mice became proficient at the task in 27 ± 4 (mean \pm SD) training sessions, completing 388 ± 71 trials and 10 ± 3 reward reversals per session when fully trained. Analysing trial-by-trial choice strategies showed that mice repeated rewarded choices but, importantly, also exhibited sensitivity to the underlying transition structure (Fig. 2D, Transition X Outcome P < 0.001). The reinforcing effect of trial outcome depended on the common/rare transitions that preceded them (Fig. 2E, *Transition X Outcome* predictor P < 0.001). This effect persisted across multiple trials (Fig. 2F). This pattern indicates mice understood the task structure and tracked which step 1 action commonly led to a particular step 2 state.

Consistent with previous work using the same task [54], transition type affected stay/switch behaviour following rewards but not omissions (Fig. 2F). To verify this, we adapted the logistic regression analysis to evaluate the influence of transition type on rewarded and unrewarded trials separately (Fig. 2G). As predicted, we found that common transitions on rewarded trials promoted staying (*Reward by transition* predictor P < 0.001), but omission trials had no significant impact on stay/switch likelihood (*Omission by transition* predictor P = 0.411), demonstrating asymmetry in learning from different trial outcomes.

Unmasking the effects of (±)-DOI on cognitive flexibility

To evaluate post-acute effects of (±)-DOI on cognitive flexibility, in a first cohort (*Two-step Experiment 1*, N = 26, Supplementary Fig. S2), we injected fully trained mice with (±)-DOI or saline vehicle and, starting one day later, continued tracked their daily task performance over the course of one week (Fig. 3A, B). Compared to the pre-drug period, there were marginal increases in the number of trials (Supplementary Fig. S5A, Time P = 0.018, mean difference ± SEM = 16 ± 6 , Drug P = 0.391) and reward reversals per session (Fig. 3D, Time P = 0.048, mean difference = 0.7 ± 0.3 , Drug P = 0.160) in both (±)-DOI and vehicle treatment groups, but there was no significant improvement in the number of correct choices (Fig. 3C, Time P > 0.521, Drug P = 0.566), indicating that (±)-DOI did not enhance the animals' overall decision-making accuracy.

We next assessed how (±)-DOI affected choice performance specifically around the reward reversals. The speed of adaptation was comparable across all animals before drug treatment (Fig. 3E left, P > 0.671). However, post-drug, (±)-DOI-treated mice exhibited a faster switch in their choice probability trajectory than the controls (Fig. 3E centre, tau_{fast} P = 0.070, tau_{slow} P = 0.036, tau_{fast/slow} mix P = 0.046). To examine the basis of this effect, we directly compared within-subject choice trajectories pre- and post-drug. This highlighted that the aforementioned effect was driven







Example session С









Lagged logistic regression F

G Learning asymmetry



by the vehicle-treated mice being slower at reward reversals postdrug (tau_{fast} P = 0.059, tau_{slow} P = 0.018, tau_{fast/slow} mix P = 0.097), whereas the (±)-DOI group's performance, while marginally faster (tau_{fast} pre-drug 3.17 versus post-drug 1.28; tau_{slow} pre-drug 33.86

versus post-drug 24.79), was not statistically different post-drug (P > 0.088).

Next, to determine if (±)-DOI affects adaptation to previously unencountered challenges, we initiated a single novel reversal in

Fig. 2 Choice performance on the two-step task prior to any drug treatment reflects the combined influence of outcomes and transition types. A Trial events. A mouse initiated the trial by poking the central port. In step 1, either both left/right ports lit up for the animals to choose which one they poke (free choice), or only the left or right port lit up to force the animal to explore that choice (forced choice, max. 25% of trials per session). Distinct auditory cues signalled active up or down port. A tone (identical to the up/down cues) or white noise would cue water reward delivery or omission, respectively. B The probabilistic structure of the task and the types of reversals. Reward probabilities of step 2 states reversed in blocks which could be non-neutral (reward probabilities switch between 80% and 20%) or neutral (both reward probabilities 50%). Reward reversals were triggered based on a behavioural criterion for non-neutral blocks (random interval of 5-15 trials after the exponential moving average across 8 previous free choices >75% correct) or after a random 20-30 trial interval for the neutral block. Animals were trained on serial reward reversals ("learned" adaptations). The transition structure was initially fixed until a single experimenter-directed transition reversal that occurred after drug treatment ("novel" adaptation). C Example sessions. Top: Transition and reward probabilities. Bottom: exponential moving average of choices (tau = 8 trials). Green lines represent reward blocks, and their y-position represents the correct choice (left, right, or neutral). D Stay probabilities for the step 1 choice were a function of subsequent common (C) and rare (R) transitions and reward (+), or omission (-), trial outcomes, as well as their interaction. RM two-way ANOVA (all P < 0.001, BF_{incl} $\gg 100$): *Transition* $F_{1,81} = 351.7$, $\eta_p^2 = 0.81$; *Outcome* $F_{1,81} = 43.9$, $\eta_p^2 = 0.35$; *Transition* X *Outcome* $F_{1,81} = 541.1$, $\eta_p^2 = 0.87$. Stars represent Bonferroni-corrected post-hoc comparisons. **E** Logistic regression analysis quantifying how transitions, outcomes, and their interaction predict repeating the same step 1 choice on the next trial. Correct and Choice predictors correct for cross-trial correlations and capture any side bias. One sample t-test or Wilcoxon signed rank tests against zero (all P < 0.001, BF₁₀ \gg 100): Correct $t_{81} = 19.8$, Cohen's d = 2.18; Choice V = 3402, Rank-Biserial Corr. = 1.00; Outcome V = 3286, Rank-Biserial Corr. = 0.93; Transition V = 3403, Rank-Biserial Corr. = 1.00; Transition X Outcome V = 3403, Rank-Biserial Corr. = 1.00. F Lagged regression analysis shows how the repeated step 1 choices were influenced by the trial history. Stars represent family-wise Bonferroni-corrected one sample t-tests or Wilcoxon signed rank tests against zero. G Mice exhibit asymmetry in how they learn from positive and negative feedback. The reinforcing value of rewards was modulated by the type of transition, but reward omissions did not contribute to trial-by-trial learning. One sample t-tests or Wilcoxon signed rank tests against zero: Reward by transition V = 3403, P < 0.001, Rank-Biserial Corr. = 1.00, BF₁₀ \gg 100; Omission by transition $t_{81} = 0.83$, P = 0.411, BF₁₀ = 0.17. Data shown as mean ± SEM. n = 82. *P < 0.05. **P < 0.01. ***P < 0.001.

the transition structure at the end of the first post-drug week (Fig. 2B, *transition reversal*, TR). As expected, there was a notable disruption in general task performance. Trial numbers remained intact (Supplementary Fig. S5A), but mice initially made fewer correct choices (Fig. 3C) and completed fewer reward reversals per session (Fig. 3D). The subsequent recovery of these measures to pre-drug performance levels over time was not influenced by (±)-DOI (Fig. 3C P = 0.804, Fig. 3D P = 0.896). (±)-DOI-treated mice still appeared quicker at reward reversal adaptation in the second post-TR week (Fig. 3E right), but the post-TR drop in general task performance confounded these measures, so the difference was no longer statistically significant (all P > 0.091).

To measure cognitive adaptation to the TR, we tracked the animals' trial-by-trial choice strategies across the two post-TR weeks, as measured by the logistic regression model (see Fig. 2E). While the Outcome and Transition predictors quantify the simple reinforcing effects of outcome and transition type (Supplementary Fig. S5B, C), the significantly positive interaction predictor, Transition X Outcome (Fig. 3F), reflects the animal's comprehension of the task's probabilistic structure wherein transitions and outcomes are interconnected. In the early post-reversal sessions, the significantly negative Transition and Transition X Outcome predictors signal that the animals were initially following the original transition structure. As animals learned the new structure, predictor loadings shifted back towards positive values, allowing us to track animals' evolving understanding of the task structure over time. (\pm) -DOI significantly influenced the Transition X Outcome coefficient levels (Fig. 3F, P = 0.004), illustrated by the (±)-DOI group's higher rate constant and plateau (P = 0.006), but not initial post-TR values (P = 0.919). Therefore, despite the equal disruption by TR, (±)-DOI-treated mice exhibited a quicker strategy reversal, indicated by a higher influence of the Transition X Outcome interaction on subsequent choices throughout the adaptation period.

To explore factors contributing to the faster strategy reversal in (\pm) -DOI-treated mice, we examined potential changes in their learning strategy after the transition reversal by evaluating reward and omission learning separately. Post-TR trial-by-trial reward learning was significantly different (Fig. 3G P = 0.043) with (\pm) -DOI-treated mice consistently showing a higher tendency than the controls to repeat common rewards. In line with our pre-treatment performance analyses (see Fig. 2G), both treatment groups had non-significant *Omission by transition* predictors pre-TR (Fig. 3H, all

P > 0.452). Post-TR, vehicle-treated animals continued to exhibit consistent absence of learning from omissions (Fig. 3H, best-fit: horizontal line model; all P > 0.739). Strikingly, by contrast, the Omission by transition predictor of (±)-DOI-treated mice decreased over time (best-fit: line model preferred, P = 0.007, slope -0.112, CI [-0.192, -0.032]), becoming significantly negative by the second week post-TR (P < 0.029 for sessions 7–12). The negative loading reveals that (±)-DOI-treated animals started to be influenced by omissions and would be more likely to switch to a different choice after experiencing a common reward omission an optimal strategy previously overlooked by the mice. We confirmed this effect was consistent across individual subjects, with 9 out of 13 (\pm) -DOI-treated mice exhibiting a more negative Omission by transition predictor after TR, compared to only 4 out of 13 vehicle-treated mice (Supplementary Fig. S6, likelihood ratio test P = 0.047).

To assess how unusual this emergence of omission sensitivity in (±)-DOI-treated mice is in the two-step task, we reanalysed the dataset from a previous study [54] using our logistic regression model that evaluates rewards and omissions separately. This showed a non-significant Omission by transition predictor, consistent with our current experiments (Supplementary Fig. S7A). We then simulated pre-drug behaviour using an asymmetric inference model drawn from the distribution of fits from all N = 82animals tested on the two-step task to again confirm that choice strategies were only influenced by rewarded but not unrewarded trials (Supplementary Fig. S7B left). By contrast, the post-TR behaviour of (±)-DOI-treated animals in Two-step Experiment 1 exhibited a significant influence of omission trials in their choice strategy (Supplementary Fig. S7C), now exemplifying symmetric inference learning (Fig.S7B right). Note, however, that although (±)-DOI-treated animals started using information from both rewards and omissions, they did not give equal value to both types of outcomes, with rewarded outcomes still having greater impact on stay/switch behaviour.

We then repeated our initial ex vivo MRI analyses for a subset of brains collected at the end of Two-step Experiment 1 ($n_{\text{group}} = 10$) to look at possible brain structural differences between (±)-DOIand vehicle-treated mice. However, at this timepoint, we found no significant differences in grey-matter volume in either the voxelwise or ROI-wise analyses (linear model drug effects not significant at q > 0.20, Supplementary Fig. S8), even when we used seeded analysis with the ROIs that had exhibited significant differences



one day post-treatment in our first imaging study (Supplementary Fig. S9).

Taken together, these data indicate that (±)-DOI did not enhance overall decision-making accuracy but resulted in a faster

change in strategy during a novel transition reversal. Crucially, (\pm) -DOI-treated mice exhibited a unique shift in strategy and started learning from reward omissions, which was not observed in the vehicle-treated mice.

Fig. 3 (±)-DOI administered one week before a novel transition reversal improved learning via a new choice strategy. A Two-step Experiment 1 timeline. After the animals were fully trained and had one week of stable performance on the two-step task (Pre-drug period), they were treated with either saline vehicle or 2 mgkg⁻¹ (±)-DOI at the end of the daily testing. The day after treatment, testing was continued on the same version of the task for one week (Post-drug period). A single novel transition reversal (TR) was then initiated at the start of the second post-drug week. Animals' performance was tracked for a further two weeks (Post-TR period). B (±)-DOI induced a high frequency headtwitch response (unpaired Welch's t-test, $t_{14.9} = 16.58$, P < 0.001, Cohen's d = 6.5, BF₁₀ » 100) and ear-scratch response (unpaired Welch's t-test, $t_{17.8} = 4.11$, P < 0.001, Cohen's d = 1.6, BF₁₀ = 65.2). **C** The number of correct choices per session did not differ across treatment groups pre-or post-drug (two-way RM ANOVA: Time F_{1,24} = 0.42, P = 0.521, BF_{incl} = 0.33; Drug F_{1,24} = 0.34, P = 0.566, BF_{incl} = 0.50; Time X Drug F_{1,24} = 0.002, P = 0.967, BF_{incl} = 0.36). Post-TR adaptation was not influenced by the drug (nonlinear one-phase association regression fits, $F_{3,96} = 0.63$, P = 0.599, AlCc₁₀ = 0.09). **D** The number of reward reversals per session did not differ pre-drug, but it increased post-drug irrespective of the treatment type (two-way RM ANOVA: Time $F_{1,24} = 4.3$, P = 0.048, $\eta_p^2 = 0.15$, BF_{incl} = 1.51; Drug $F_{1,24} = 2.1$, P = 0.160, BF_{incl} = 0.95; Time X Drug $F_{1,24} = 0.46$, P = 0.503, $BF_{incl} = 0.41$). Post-TR, the treatment groups remained comparable (nonlinear line regression fits, $F_{2,100} = 0.110$, P = 0.896, AICc₁₀ = 0.13, slope_{global} = 1.9, CI [1.4, 2.3]). E The pre-drug reward reversal performance was comparable across treatment groups (double exponential fit permutation test, $tau_{fast} P = 0.671$, $tau_{slow} P = 0.851$, $tau_{fast/slow mix} P = 0.900$). Post-drug, (±)-DOI-treated mice were quicker to reverse their choices ($tau_{fast} P = 0.070$, $tau_{slow} P = 0.036$, $tau_{fast/slow mix} P = 0.046$). In the late post-TR period (post-TR sessions 7–12, when the animals restarted doing many reward reversals per session), the trend for faster adaptation in (±)-DOI-treated mice persisted, but the difference was not statistically significant (tau_{fast} P = 0.130, tau_{slow} P = 0.085, tau_{fast/slow} mix P = 0.152). **F** Trial-to-trial learning of reward and transition probabilities was not different pre- and post-drug (two-way RM ANOVA: Time $F_{1,24} = 1.4$, P = 0.246, $BF_{incl} = 0.49$; Drug $F_{1,24} = 1.3$, P = 0.261, BF_{incl} = 0.66; Time X Drug $F_{1,24} = 0.4$, P = 0.528, BF_{incl} = 0.41). (±)-DOI-treated mice were faster during the TR adaptation (nonlinear one-phase association regression fits, $F_{3,98} = 4.76$, P = 0.004, AlCc₁₀ = 40.10). **G** Trial-to-trial reward learning was not different pre- and post-drug (two-way RM ANOVA: Time $F_{1,24} = 3.4$, P = 0.079, BF_{incl} = 1.04; Drug $F_{1,24} = 0.8$, P = 0.387, BF_{incl} = 0.61; Time X Drug $F_{1,24} = 0.6$, P = 0.444, $BF_{incl} = 0.44$). (±)-DOI-treated mice were faster during the TR adaptation (nonlinear one-phase association regression fits, $F_{3,98} = 2.82$, P = 0.44, (±)-Dol-treated mice were laster during the TR adaptation (nonlinear one-phase association regression regressin regress learning was not significant for either treatment group pre-TR (one sample t-tests, all P > 0.452, BF₁₀ < 0.36). Post-TR, vehicle-treated mice remained uninformed by omissions (one sample t-tests, all P > 0.739, BF₁₀ < 0.29), but (±)-DOI-treated mice started incorporating omissions in their choice strategy by the second post-TR week (one sample *t*-tests: $[1-3] t_{12} = 0.87$, P = 0.403, BF₁₀ = 0.38; $[4-6] t_{12} = -0.87$, P = 0.406, $BF_{10} = 0.38; [7-9] t_{12} = -2.82, P = 0.015, BF_{10} = 4.08; [10-12] t_{12} = -2.48, P = 0.029, BF_{10} = 2.46). Data shown as mean ± SEM. n_{Veh} = 13. n_{(±)-DOI} = 13. *P < 0.05. **P < 0.01.$

The importance of post-drug timing

Our findings in Two-step Experiment 1 suggested that there might be a temporal dissociation between measurable brain structural changes and the observed cognitive enhancements. To investigate the relationship between the timing of drug administration and cognitive flexibility, in a second cohort (Fig. 4A, B, Two-step Experiment 2, N = 29), we initiated the transition reversal one day after drug treatment. This is when previous studies have described neuronal plasticity enhancements [17-21] and when our initial MRI study showed significant structural plasticity changes (Fig. 1). There were two possible scenarios: either (±)-DOI's effects on novel reversal learning are correlated with increases in neuronal plasticity, suggesting stronger effects when testing adaptability to a novel TR sooner after drug treatment; or there is a critical time component whereby a period of strengthening and integration of newly formed synaptic connections is necessary to utilise the burst of neuronal psychedelic-induced plasticity in imparting longlasting cognitive effects, suggesting weaker effects if testing novel reversal learning immediately after drug treatment.

The post-TR recovery of general task performance was again not affected by (±)-DOI. Task engagement (Supplementary Fig. S5D), choice accuracy (Fig. 4C), the number of reward reversals (Fig. 4D) and speed of reward reversal adaptation (Fig. 4E) were not significantly different across treatment groups post-TR (all P > 0.508). However, in contrast to Two-step Experiment 1, the rate at which the animals learned the new transition structure was comparable across treatment groups. The *Transition X Outcome* (Fig. 4F, P = 0.837) and *Reward by transition* (Fig. 4G, P = 0.738) predictors were equivalent in both (±)-DOI and vehicle mice, and, crucially, learning from omissions remained negligible in both groups (Fig. 4H, P = 0.856).

These findings imply that (\pm) -DOI's effects on cognitive flexibility were not immediate, emphasising a critical time component in shaping how (\pm) -DOI influences cognitive flexibility and the development of novel behavioural strategies.

The importance of post-drug experience

The timing of drug administration relative to TR is not the only factor that was different between Two-step Experiments 1 and 2. In the first cohort, during the first post-drug week, before TR, the mice continued accumulating task experience. Marginal increases in the number of completed trials (Supplementary Fig. S5A) and reward reversals (Fig. 3D) were observed, regardless of the treatment they received. Hence, the observed cognitive effects may have been influenced not just by the timing of TR, but by the experiential context available during that time too. Indeed, psychedelic drug research has continuously highlighted the importance of psychological and environmental factors in shaping the behavioural effects of psychedelic drugs [23, 55].

Therefore, to investigate the influence of training in mediating (±)-DOI's effects on cognitive flexibility, in our final cohort of animals, we deliberately prevented any further task experience during the first post-drug week (Fig. 5A, B, *Two-step Experiment 3*, N = 27). Our prediction was that if the training on the original task during the post-drug period facilitated the necessary experience for cognitive plasticity processes, then the absence of this experiential component would attenuate the reversal learning effects observed.

In contrast to previous cohorts, there was a noticeable decline in task engagement in both treatment groups following the off-task week, but trial rates rebounded upon resuming daily testing after the transition reversal (Supplementary Fig. S5G) and the extent of this effect was not different across treatment groups (P = 0.306). Consistent with Two-step Experiments 1 and 2, the post-TR recovery of general task performance, including task accuracy (Fig. 5C), reward reversal rate (Fig. 5D), and speed of adaptation (Fig. 5E), did not show significant differences between the treatment groups (all P > 0.084). Nonetheless, a trend was visible suggesting that (\pm)-DOI-treated animals now exhibited a marginally slower recovery compared to the control group (Fig. 5C, D).

Examining the cognitive adaptation more closely, specifically looking at the *Transition X Outcome* predictor, we observed a





G Reward by transition

Head twitches

Е

н Omission by transition

Predrug

 \sim

1,20,22

Sessions post-TR



significant effect of (±)-DOI, but, contrary to Two-step Experiment 1, (\pm) -DOI-treated mice exhibited a *slower* rather than a faster rate of adaptation than the vehicle group (Fig. 5F, vehicle best-fit onephase association preferred over line regression, P = 0.016). While

differences in the Transition (Supplementary Fig. S5I, P = 0.055) and Reward by transition predictor (Fig. 5G, P = 0.054) did not quite reach statistical significance, the trend for (±)-DOI-treated mice being slower than the controls to change was still present.

Fig. 4 (±)-**DOI administered one day before a novel transition reversal did not lead to improved learning. A** Two-step Experiment 2 timeline. The animals were treated with either saline vehicle or 2 mgkg^{-1} (±)-DOI after they were fully trained and had one week of stable performance on the two-step task (*Pre-drug* period). A transition reversal (TR) was initiated the day after drug treatment. Animals' performance was tracked for a further two weeks (*Post-TR* period). **B** (±)-DOI induced a high frequency head-twitch response (unpaired Welch's *t*-test, $t_{13.3} = 15.61$, P < 0.001, Cohen's d = 5.9, BF₁₀ » 100) and ear-scratch response (unpaired Welch's *t*-test, $t_{19.5} = 7.96$, P < 0.001, Cohen's d = 3.0, BF₁₀ » 100). **C** The number of correct choices per session was not significantly different across treatment groups pre-drug (unpaired *t*-test, $t_{27} = 0.096$, P = 0.924, BF₁₀ = 0.35) or post-TR (nonlinear line regression fits, $F_{2,112} = 0.22$, P = 0.804, AlCc₁₀ = 0.14, slope_{global} = 0.067, CI [0.057, 0.076]). **D** The number of reward reversals per session was not different pre-drug (Mann–Whitney test, W = 86.5, P = 0.431, BF₁₀ = 0.42) or post-TR (nonlinear line regression fits, $F_{2,109} = 0.0008$, P > 0.999, AlCc₁₀ = 0.11, slope_{global} = 1.6, CI [1.3, 1.9]). **E** The pre-drug reward reversal performance was not different across treatment groups remained comparable (tau_{fast} P = 0.102, tau_{slow} P = 0.520, tau_{fast/slow} mix P = 0.244). In the late post-TR period, the two treatment groups remained comparable (tau_{fast} P = 0.169, tau_{slow} P = 0.520, tau_{fast/slow} mix P = 0.508). **F** Trial-to-trial learning of reward and transition probabilities was not different pre-drug (Mann–Whitney test, P = 0.169, tau_{slow} P = 0.520, tau_{fast/slow} mix P = 0.508). **F** Trial-to-trial learning of reward and transition probabilities was not different pre-drug (Mann–Whitney test, P = 0.508).

W = 120, P = 0.533, $BF_{10} = 0.46$) or post-TR (nonlinear line regression fits, $F_{2,111} = 0.17$, P = 0.837, AlC₀ = 0.14, slope_{global} = 0.35, CI [0.28, 0.43]). **G** Trial-to-trial reward learning was not significantly different pre-drug (Mann–Whitney test, W = 123, P = 0.451, $BF_{10} = 0.48$) or post-TR (nonlinear line regression fits, $F_{2,112} = 0.30$, P = 0.738, AlC₀ = 0.16, slope_{global} = 0.79, CI [0.65, 0.93]). **H** Trial-to-trial reward omission learning was not significantly different pre-drug (unpaired t-test $t_{27} = 0.15$, P = 0.880, $BF_{10} = 0.35$) or post-TR (nonlinear horizontal line regression fits, $F_{1,114} = 0.033$, P = 0.856, AlC₀ = 0.35, mean_{global} = -0.055, CI [-0.116, 0.006]). Data shown as mean ± SEM. $n_{Veh} = 15$. $n_{(\pm)-DOI} = 14$.

Moreover, there was no evidence for learning from omissions in either group (Fig. 5H, all P > 0.095), so the faster adaptation in vehicle-treated animals was not accompanied by a change in strategy, unlike the one observed in (±)-DOI-treated mice in Two-step Experiment 1. Therefore, the absence of additional task experience during the post-drug week not only curtailed the cognitive changes observed in Two-step Experiment 1 but actually resulted in the opposite direction of effect.

Together, our three separate two-step experiments underscored the importance of both time- and experience-dependent mechanisms in influencing (±)-DOI's effects on the speed of novel reversal learning. To assess whether the changes observed in *Transition X Outcome* predictor differed significantly across our two-step experiments, we conducted a 3-way ANOVA with the within-subjects factor of post-TR session, and between-subjects factors of drug and experiment (Session P < 0.001, $\eta_p^2 = 0.70$, Session X Experiment P < 0.001, $\eta_p^2 = 0.21$, Drug X Experiment P = 0.035, $\eta_p^2 = 0.08$, rest P > 0.176). Crucially, we found a significant drug by experiment interaction, confirming that the effects of (±)-DOI on cognitive flexibility varied across the two-step experiments, highlighting the importance of considering the experimental context and timing when interpreting the drug's effects.

DISCUSSION

Here we demonstrate how (\pm)-DOI treatment facilitated a faster change in strategy during a novel transition reversal without affecting overall decision-making accuracy. Remarkably, (\pm)-DOI was able to induce a unique shift in the learning strategy whereby mice started learning from previously overlooked reward omissions. Crucially, we further uncovered the complex time- and context-dependent nature of (\pm)-DOI's effects on cognitive flexibility. The timing of drug administration and the availability of post-drug training were both found to be critical, as cognitive effects were not immediate and depended on post-drug task experience.

We show that, in the first week post-treatment, (\pm)-DOI-treated animals were quicker than the controls to reverse their choices following serial reversals in reward probabilities, but this difference was driven, at least in part, by an apparent postinjection drop in performance in vehicle-treated animals. The difference in within-subject effects cannot be attributed to differences in timing, duration of testing, amount of training, or the baseline performance rate, as these factors were all kept consistent across treatment groups. An alternative explanation may involve the injection stress experienced by both groups, suggesting (\pm)-DOI's positive impact on serial reward reversal adaptation could be linked to improving cognitive stability [56]. This implies a protective effect of maintaining optimal cognitive performance in contrast to the marginal variation in the control group. Recent data show that tabernanthalog, a plasticityinducing non-psychedelic analogue of the psychedelic drug ibogaine, was able to rescue a serial reversal learning deficit in mice that underwent unpredictable mild stress [57]. Tabernanthalog, like (±)-DOI in our study, did not increase performance past the levels seen in the non- treated controls, suggesting no added performance benefit due to the drug. Alternatively, (±)-DOI might generally promote serial reversal learning, but our ability to detect further enhancements beyond pre-drug levels could have been hindered by the fact that the mice were already highly proficient at reward reversals before treatment. Indeed, this limitation is what prompted us to introduce a transition reversal that the animals were not trained on and where (±)-DOI's main effect on novel cognitive adaptations became evident. This differentiation implies that (±)-DOI's impact varies between single and serial reversal learning scenarios.

(±)-DOI's ability to shape cognitive flexibility was further elucidated when the animals were tested on a single novel reversal in the task's transition structure, suggesting (\pm) -DOI's effects could be distinctive if testing single versus serial reversal learning. When the transition reversal was implemented one week after drug treatment, (±)-DOI-treated animals were better able to inhibit responding to the old model. Strikingly, they also now incorporated a novel learning strategy whereby they exhibited significant sensitivity to reward omissions. This is notable as omissions were otherwise disregarded by mice, a pattern replicated in previous experiments using the two-step [54] and other decision-making tasks [58–60]. One intriguing possibility is that the added challenge of a novel kind of reversal and the frustrative increased rate of reward omissions may have acted as an acquired motivation to change strategies [61], which could have primed (±)-DOI-mediated increased sensitivity to the previously overlooked omission cues. Notably, learning asymmetry for reward versus omission is not unique to mice. Humans solving the two-step task and other reward-guided probabilistic tasks also show higher learning rates for positive feedback [62-65], and reduced loss aversion has been implicated in addictive disorders such as gambling and alcohol dependence [66]. Our finding that (\pm) -DOI aids faster learning from both rewards and omissions echoes the recent human data suggesting LSD increased both reward and punishment learning rates in healthy subjects doing a probabilistic reversal task, although the human subjects in this study were performing the task in the acute phase of drug action [67].

The cognition enhancing effects of psychedelics are widely believed to result from the enhancement of neural plasticity processes [2] which are presumed to be ramping up over the first week following single treatment [18, 19, 21], so the time between drug treatment and any novel reversal are potentially critical for the observed effects. In fact, we saw no adaptability differences



with (\pm)-DOI when we initiated the transition reversal one day after drug treatment, suggesting that while some cognitive benefits may develop during the sub-acute phase, as we saw some effect of (\pm)-DOI on reward reversals in the first post-drug

week, additional time may be needed to confer benefits for novel adaptations to more challenging task changes.

The question of why the most significant effect on novel reversals occurred one week, but not one day, after (\pm) -DOI

Fig. 5 Effects of (±)-DOI on the adaptability to a novel reversal occurring one week after treatment were dependent on experience. A Two-step Experiment 3 timeline. The animals were treated with either saline vehicle or 2 mgkg⁻¹ (±)-DOI when they were fully trained and had one week of stable performance on the two-step task (Pre-drug period). For the next week, the animals were kept under water deprivation but were not allowed any further experience on the two-step task. A novel transition reversal (TR) was then initiated at the start of the second post-drug week. Animals' performance was tracked for a further two weeks (Post-TR period). B (±)-DOI induced a high frequency head-twitch response (unpaired Welch's t-test, $t_{13,4} = 14.24$, P < 0.001, Cohen's d = 5.5, BF₁₀ » 100) and ear-scratch response (Mann–Whitney U test, W = 7, P < 0.001, Rank-Biserial Corr. = 0.92, BF₁₀ = 28.8). C The number of correct choices per session did not differ across treatment groups pre-drug (unpaired t-test, $t_{25} = -0.381$, P = 0.707, $BF_{10} = 0.38$) or post-TR (nonlinear line regression fits, $F_{2,104} = 2.24$, P = 0.111, AlCc₁₀ = 1.11, slope_{global} = 0.064, CI [0.051, 0.077]). D The number of reward reversals per session was not significantly different pre-drug (unpaired t-test, $t_{25} = -0.045$, P = 0.965, $BF_{10} = 0.36$) or post-TR (nonlinear line regression fits, $F_{2,102} = 2.54$, P = 0.084, AlCc₁₀ = 1.48, slope_{global} = 1.7, Cl [1.2, 2.2]). **E** The pre-drug (double exponential fit permutation test, tau_{fast} P = 0.513, tau_{slow} P = 0.354, tau_{fast/slow} mix P = 0.610) and late post-TR $(tau_{fast} P = 0.560, tau_{slow} P = 0.719, tau_{fast/slow mix} P = 0.368)$ reward reversal performance was comparable across treatment groups. **F** Trial-totrial learning of reward and transition probabilities was not different pre-drug (unpaired t-test $t_{25} = 0.123$, P = 0.903, BF₁₀ = 0.36). (±)-DOI group's fit was significantly different post-TR. Nonlinear regression fits: (±)-DOI, line fit (one-phase association model failed to converge on a best-fit curve), slope = 0.064, CI [0.051, 0.077]; Vehicle, line vs. one-phase association fit: $F_{1,49} = 6.19$, P = 0.016, AlCc₁₀ = 6.79. **G** Trial-to-trial reward learning was not different pre-drug (unpaired t-test, $t_{25} = 0.449$, P = 0.657, BF₁₀ = 0.39) or post-TR (nonlinear line regression fits, $F_{2,104} = 3.01, P = 0.054, AlCc_{10} = 2.36$, $slope_{global} = 0.47$, Cl [0.39, 0.56]). **H** Trial-to-trial reward omission learning was not significantly different pre-drug (unpaired *t*-test, $t_{25} = 0.563, P = 0.578, BF_{10} = 0.40$) or post-TR (nonlinear horizontal line regression fits, $F_{1,106} = 0.229, P = 0.633$, $AlCc_{10} = 0.39, mean_{global} = -0.064, Cl [-0.125, -0.002]$). Trial-to-trial reward omission learning was not contributing to the choice strategy of either treatment group (one sample t-tests, all P > 0.095, BF₁₀ < 0.97). Data shown as mean ± SEM. $n_{Veh} = 13$. $n_{(\pm)-DOI} = 14$.

treatment is central to our findings. Different mechanisms could underlie rapidly-induced versus long-lasting behavioural effects, as it was shown in the case of another plasticity-promoting drug ketamine [68]. One possibility could be that the consolidation of cellular plasticity changes is a predecessor for, and a modulator of, lasting improvements in cognitive flexibility. While (±)-DOI swiftly induces marked changes in brain structure and function, sustained cognitive consequences result from the gradual integration and consolidation of these neuroplastic changes into animals' cognitive processes via Hebbian and homoeostatic plasticity mechanisms [69]. Here, "integration and consolidation" denote the transformation of initial molecular and neuronal plasticity into enduring changes in circuitry and network function, achieved through synaptic pruning and strengthening, determining the retention and integration of spines into neural networks over the longer term. With approximately 30% of spines persisting a month after psychedelic treatment [18], such spines can be considered consolidated.

The remodelling of psychedelic-induced neuronal plasticity changes potentially represents phase 2 of the adaptive response, transitioning from synaptic construction in phase 1 to enduring behavioural plasticity. This process involves pruning unnecessary elements and stabilising crucial structures, dependent on ongoing neural activity and environmental engagement [70]. However, the mechanisms underlying such synaptic integration remain unexplored. In the case of ketamine, sustained behavioural effects required BDNF-dependent MeCP2-phosphorylation initiated one week after treatment, distinct from the post-acute phase when behavioural effects commenced [71]. Whether psychedelicinduced shifts in excitation-inhibition balance involve BDNFdependent phosphorylation for enduring effects or engage other mechanisms is unknown. Future research should unravel how rapidly induced changes in individual neurons stabilise within neural circuits, elucidating the dynamics of synaptic integration over time, the regulation of the pruning process, and whether it can be directed for a specific purpose. This is the missing link crucial for validating claims of sustained behavioural changes arising from plasticity-promoting psychedelic treatment.

Remarkably, we also found that (\pm) -DOI did not confer cognitive benefits when we did not allow the animals any further task experience after drug treatment, before then reversing the task structure. Instead, (\pm) -DOI now had a mild detrimental effect, slowing down the animals' relearning. One explanation for this could be the lack of enriched behavioural experience during the critical neuroplasticity window. Barring the animals from the task restricted their cognitive stimulation, which is known to be a positive modulator in the environment capable of inducing neuronal plasticity [72]. Reduced cognitive activity could be perceived as environmental impoverishment [73], whose detrimental effects on learning and/or downscaling of plasticity processes could be exacerbated by (±)-DOI. It has been suggested that neuroplasticity induced by serotonin-enhancing drugs acts as a catalyst for a "unidirectional susceptibility to change" that allows subsequent stimuli to reshape neural circuits in both positive and negative directions, depending on the quality of the environment [22, 74]. Neuroplasticity is a complex sequence of molecular, cellular, and network-level events that unfold across time, and, at each level, experience may modulate the course of this intricate cascade, for example, by directing the consolidation of synaptic remodelling induced by psychedelic drugs.

Consistent with the widely replicated neuronal plasticitypromoting effects of (±)-DOI [17, 19, 20] we also provide the first evidence that a single moderate dose of (±)-DOI can induce regional volume changes across sensory and association cortical areas, as well as subcortical structures, beyond the acute phase of drug action. These discoveries complement previous findings of psychedelic-induced increases in dendritic branching and spine formation [17-21, 25, 26] and suggest that (±)-DOI may have widespread effects on whole-brain structural plasticity. Notably, our effects in S1 and thalamic nuclei complement previous reports of (±)-DOI-induced spinogenesis in that region [19], and acute changes in activity measured in pharmacological MRI studies with (±)-DOI [75, 76]. Our findings are also consistent with unbiased whole-brain maps of psilocybin-induced c-FOS expression changes, specifically in S1, V1/2, thalamic nuclei, and RSA [77]. In contrast, while the pharmacological MRI signals and c-FOS levels were increased in the cingulate cortex acutely [75-77], no lasting structural changes were found in these areas. However, the differences between acute signals and post-acute structural changes could stem from their distinct timeframes and what aspects of the drug's effects they capture, making them valuable for understanding different facets of the drug's impact on the brain.

We did not observe any significant volume changes three weeks post-treatment. This is consistent with prior evidence suggesting that the rates of structural plasticity changes are at their highest in the first few days after psychedelic drug treatment [19–21] and that only a third of newly formed spines are maintained three weeks after [18]. Therefore, any remaining differences in spine density may be too subtle to be detected with a whole-brain analysis. Furthermore, long-term cognitive and behavioural changes may not require all of the initial growth of spines and dendritic branches to be maintained across time. The initial neuroplasticity burst could instead be acting as the

12

foundation for rewiring circuits and changing network dynamics which, in turn, then directs changes in higher-level processes, such as cognitive flexibility.

Our findings highlight the multifaceted nature of psychedelics' therapeutic effects and their relevance for various mental health conditions. We suggest that these therapeutic benefits may not be solely dependent on the initiation of neuroplasticity but could also be influenced by the specific post-treatment experiential context. These insights prompt further mechanistic studies of how the pharmacological plasticity-promoting effects of psychedelics can be synergistically combined with trainingguided network reorganisation, leveraging the increased plasticity induced by the drug. Such an integrated approach holds promise for enhancing the therapeutic potential of psychedelics, particularly for patients exhibiting perseverative behaviours and a resistance to change, which is commonly observed in depression, anxiety, and addictions. The ability of psychedelics to both facilitate adaptive responses and incorporate previously unexplored information may bring new opportunities for promoting positive therapeutic outcomes in clinical settings where rigid cognitive patterns and resistance to traditional interventions pose a particular challenge.

Supplementary material

Supplementary Material includes Supplementary Methods, Supplementary Tables S1 and S2, and Supplementary Figs. S1–S9.

DATA AVAILABILITY

Minimally preprocessed imaging data are openly available via the Digital Brain Bank (https://open.win.ox.ac.uk/DigitalBrainBank/#/datasets/pathologist). Example data can be accessed via the online viewer and the full dataset is available via a data sharing agreement to ensure the data is used for purposes which satisfy research ethics and funding requirements. The raw and processed data used in the behavioural analyses are publicly available on OSF (Identifier: DOI 10.17605/OSF.IO/ VNJDZ) and licensed as CC BY 4.0.

CODE AVAILABILITY

Any custom code used to generate the processed data can be made available upon reasonable request to the corresponding author MŠ.

REFERENCES

- 1. Nichols DE. Psychedelics. Pharm Rev. 2016;68:264-355.
- Carhart-Harris RL, Nutt DJ. Serotonin and brain function: a tale of two receptors. J Psychopharmacol. 2017;31:1091–120.
- Griffiths RR, Johnson MW, Carducci MA, Umbricht A, Richards WA, Richards BD, et al. Psilocybin produces substantial and sustained decreases in depression and anxiety in patients with life-threatening cancer: A randomized double-blind trial. J Psychopharmacol. 2016;30:1181–97.
- Ross S, Bossis A, Guss J, Agin-Liebes G, Malone T, Cohen B, et al. Rapid and sustained symptom reduction following psilocybin treatment for anxiety and depression in patients with life-threatening cancer: a randomized controlled trial. J Psychopharmacol. 2016;30:1165–80.
- Grob CS, Danforth AL, Chopra GS, Hagerty M, McKay CR, Halberstadt AL, et al. Pilot study of psilocybin treatment for anxiety in patients with advanced-stage cancer. Arch Gen Psychiatry. 2011;68:71–78.
- Carhart-Harris RL, Bolstridge M, Rucker J, Day CMJ, Erritzoe D, Kaelen M, et al. Psilocybin with psychological support for treatment-resistant depression: an open-label feasibility study. Lancet Psychiatry. 2016;3:619–27.
- Moreno FA, Wiegand CB, Taitano EK, Delgado PL. Safety, tolerability, and efficacy of psilocybin in 9 patients with obsessive-compulsive disorder. J Clin Psychiatry. 2006;67:1735–40.
- Carhart-Harris RL, Roseman L, Bolstridge M, Demetriou L, Pannekoek JN, Wall MB, et al. Psilocybin for treatment-resistant depression: fMRI-measured brain mechanisms. Sci Rep. 2017;7:1–11.
- 9. Johnson MW, Garcia-Romeu A, Griffiths RR. Long-term follow-up of psilocybinfacilitated smoking cessation. Am J Drug Alcohol Abus. 2017;43:55–60.
- Bogenschutz MP, Ross S, Bhatt S, Baron T, Forcehimes AA, Laska E, et al. Percentage of Heavy Drinking Days Following Psilocybin-Assisted Psychotherapy vs

Placebo in the Treatment of Adult Patients With Alcohol Use Disorder: A Randomized Clinical Trial. JAMA Psychiatry. 2022;79:953–62.

- Barrett FS, Doss MK, Sepeda ND, Pekar JJ, Griffiths RR. Emotions and brain function are altered up to one month after a single high dose of psilocybin. Sci Rep. 2020;10:1–14.
- Griffiths RR, Johnson MW, Richards WA, Richards BD, McCann U, Jesse R. Psilocybin occasioned mystical-type experiences: immediate and persisting doserelated effects. Psychopharmacology. 2011;218:649–65.
- Griffiths R, Richards W, Johnson M, McCann U, Jesse R. Mystical-type experiences occasioned by psilocybin mediate the attribution of personal meaning and spiritual significance 14 months later. J Psychopharmacol. 2008;22:621–32.
- Olson DE. Psychoplastogens: a promising class of plasticity-promoting neurotherapeutics. J Exp Neurosci. 2018;12:1179069518800508.
- Frankel PS, Cunningham KA. The hallucinogen d-lysergic acid diethylamide (d-LSD) induces the immediate-early gene c-Fos in rat forebrain. Brain Res. 2002;958:251–60.
- Benekareddy M, Nair AR, Dias BG, Suri D, Autry AE, Monteggia LM, et al. Induction of the plasticity-associated immediate early gene Arc by stress and hallucinogens: role of brain-derived neurotrophic factor. Int J Neuropsychopharmacol. 2013;16:405–15.
- de la Fuente Revenga M, Zhu B, Guevara CA, Naler LB, Saunders JM, Zhou Z, et al. Prolonged epigenomic and synaptic plasticity alterations following single exposure to a psychedelic in mice. Cell Rep. 2021;37:109836.
- Shao L-X, Liao C, Gregg I, Davoudian PA, Savalia NK, Delagarza K, et al. Psilocybin induces rapid and persistent growth of dendritic spines in frontal cortex in vivo. Neuron. 2021;109:2535–44.
- 19. Cameron LP, Tombari RJ, Lu J, Pell AJ, Hurley ZQ, Ehinger Y, et al. A nonhallucinogenic psychedelic analogue with therapeutic potential. Nature. 2021;589:474–9.
- Ly C, Greb AC, Cameron LP, Wong JM, Barragan EV, Wilson PC, et al. Psychedelics Promote Structural and Functional Neural Plasticity. Cell Rep. 2018;23:3170–82.
- Moliner R, Girych M, Brunello CA, Kovaleva V, Biojone C, Enkavi G, et al. Psychedelics promote plasticity by directly binding to BDNF receptor TrkB. Nat Neurosci. 2023;26:1032–41.
- 22. Branchi I. The double edged sword of neural plasticity: increasing serotonin levels leads to both greater vulnerability to depression and improved capacity to recover. Psychoneuroendocrinology. 2011;36:339–51.
- Carhart-Harris RL, Roseman L, Haijen E, Erritzoe D, Watts R, Branchi I, et al. Psychedelics and the essential importance of context. J Psychopharmacol. 2018;32:725–31.
- Raval NR, Johansen A, Donovan LL, Ros NF, Ozenne B, Hansen HD, et al. A single dose of psilocybin increases synaptic density and decreases 5-HT2A receptor density in the pig brain. Int J Mol Sci. 2021;22:835.
- Vargas MV, Dunlap LE, Dong C, Carter SJ, Tombari RJ, Jami SA, et al. Psychedelics promote neuroplasticity through the activation of intracellular 5-HT2A receptors. Science. 2023;379:700–6.
- Ly C, Greb AC, Vargas MV, Duim WC, Grodzki AC, Lein PJ, et al. Transient Stimulation with Psychoplastogens is Sufficient to Initiate Neuronal Growth. ACS Pharm Transl Sci. 2020;4:452–60.
- Hesselgrave N, Troppoli TA, Wulff AB, Cole AB, Thompson SM. Harnessing psilocybin: antidepressant-like behavioral and synaptic actions of psilocybin are independent of 5-HT2R activation in mice. Proc Natl Acad Sci. 2021;118:e2022489118.
- Hutten NRPW, Mason NL, Dolder PC, Theunissen EL, Holze F, Liechti ME, et al. Low doses of LSD acutely increase BDNF blood plasma levels in healthy volunteers. ACS Pharm Transl Sci 2020;4:461–6.
- de Almeida RN, Galvão ACM, da Silva FS, Silva EADS, Palhano-Fontes F, Maia-de-Oliveira JP, et al. Modulation of serum brain-derived neurotrophic factor by a single dose of ayahuasca: observation from a randomized controlled trial. Front Psychol. 2019;10:1234.
- Holze F, Ley L, Müller F, Becker AM, Straumann I, Vizeli P, et al. Direct comparison of the acute effects of lysergic acid diethylamide and psilocybin in a double-blind placebo-controlled study in healthy subjects. Neuropsychopharmacology. 2022;47:1180–7.
- Hsu KJ, Beard C, Rifkin L, Dillon DG, Pizzagalli DA, Björgvinsson T. Transdiagnostic mechanisms in depression and anxiety: The role of rumination and attentional control. J Affect Disord. 2015;188:22–27.
- Newman J, Marmar C. Executive function in posttraumatic stress disorder. In: Executive functions in health and disease. Academic Press; 2017. p. 487–524.
- Figee M, Pattij T, Willuhn I, Luigjes J, van den Brink W, Goudriaan A, et al. Compulsivity in obsessive-compulsive disorder and addictions. Eur Neuropsychopharmacol. 2016;26:856–68.
- 34. Tchanturia K, Harrison A, Davies H, Roberts M, Oldershaw A, Nakazato M, et al. Cognitive flexibility and clinical severity in eating disorders. PLoS One. 2011;6:e20462.

- Zühlsdorff K, Dalley J, Robbins T, Morein S. Cognitive flexibility: neurobehavioural correlates of changing one's mind. Cerebral Cortex. 2022;33:5436–46.
- Genet JJ, Siemer M. Flexible control in processing affective and non-affective material predicts individual differences in trait resilience. Cogn Emot. 2011;25:380–8.
- Carhart-Harris RL, Leech R, Hellyer PJ, Shanahan M, Feilding A, Tagliazucchi E, et al. The entropic brain: a theory of conscious states informed by neuroimaging research with psychedelic drugs. Front Hum Neurosci. 2014;8:20.
- Carhart-Harris RL, Friston KJ. REBUS and the Anarchic Brain: Toward a Unified Model of the Brain Action of Psychedelics. Pharm Rev. 2019;71:316–44.
- Boulougouris V, Robbins TW. Enhancement of Spatial Reversal Learning by 5-HT2C Receptor Antagonism Is Neuroanatomically Specific. J Neurosci. 2010;30:930–8.
- 40. Roberts MHT, Bradley PB. Studies on the effects of drugs on performance of a delayed discrimination. Physiol Behav. 1967;2:389–97.
- King AR, Martin IL, Melville KA. Reversal learning enhanced by lysergic acid diethylamide (LSD): concomitant rise in brain 5-hydroxytryptamine levels. Br J Pharm. 1974;52:419.
- 42. Doss MK, Považan M, Rosenberg MD, Sepeda ND, Davis AK, Finan PH, et al. Psilocybin therapy increases cognitive and neural flexibility in patients with major depressive disorder. Transl Psychiatry. 2021;11:574.
- Odland AU, Jessen L, Kristensen JL, Fitzpatrick CM, Andreasen JT. The 5-hydroxytryptamine 2A receptor agonists DOI and 25CN-NBOH decrease marble burying and reverse 8-OH-DPAT-induced deficit in spontaneous alternation. Neuropharmacology. 2019;183:107838.
- Murphy-Beiner A, Soar K. Ayahuasca's 'afterglow': improved mindfulness and cognitive flexibility in ayahuasca drinkers. Psychopharmacology. 2020;237:1161–9.
- Olson RJ, Garza G, Moghaddam B. Acute psilocybin enhances cognitive flexibility in rats. Neuropsychopharmacology. 2023. 48:1011–20.
- Amodeo DA, Hassan O, Klein L, Halberstadt AL, Powell SB. Acute serotonin 2A receptor activation impairs behavioral flexibility in mice. Behav Brain Res. 2020;395:112861.
- Odland AU, Kristensen JL, Andreasen JT. The selective 5-HT2A receptor agonist 25CN-NBOH does not affect reversal learning in mice. Behav Pharmacol. 2021;32:448–52.
- Quednow BB, Kometer M, Geyer MA, Vollenweider FX. Psilocybin-induced deficits in automatic and controlled inhibition are attenuated by ketanserin in healthy human volunteers. Neuropsychopharmacology. 2012;37:630–40.
- Pokorny T, Preller KH, Kraehenmann R, Vollenweider FX. Modulatory effect of the 5-HT1A agonist buspirone and the mixed non-hallucinogenic 5-HT1A/2A agonist ergotamine on psilocybin-induced psychedelic experience. Eur Neuropsychopharmacol. 2016;26:756–66.
- Rambousek L, Palenicek T, Vales K, Stuchlik A. The effect of psilocin on memory acquisition, retrieval, and consolidation in the rat. Front Behav Neurosci. 2014;8:180.
- Wittmann M, Carter O, Hasler F, Cahn BR, Grimberg U, Spring P, et al. Effects of psilocybin on time perception and temporal control of behaviour in humans. J Psychopharmacol. 2007;21:50–64.
- Spring S, Lerch JP, Henkelman RM. Sexual dimorphism revealed in the structure of the mouse brain using three-dimensional magnetic resonance imaging. Neuroimage. 2007;35:1424–33.
- Lerch J. Voxel-wise morphometry using RMINC. 2014. https:// www.bic.mni.mcgill.ca/~samir/Brain_imaging/RMINC.pdf.
- 54. Blanco-Pozo M, Akam T, Walton ME Dopamine-independent effect of rewards on choices through hidden-state inference. Nat Neurosci. 2024.
- 55. Hartogsohn I. Constructing drug effects: A history of set and setting. Drug Sci Policy Law. 2017;3:1–17.
- Grahek I, Everaert J, Krebs RM, Koster EHW. Cognitive control in depression: Toward clinical models informed by cognitive neuroscience. Clin Psychological Sci. 2018;6:464–80.
- Lu J, Tjia M, Mullen B, Cao B, Lukasiewicz K, Shah-Morales S, et al. An analog of psychedelics restores functional neural circuits disrupted by unpredictable stress. Mol Psychiatry. 2021;26:6237–52.
- Cieślak PE, Ahn W-Y, Bogacz R, Parkitna JR. Selective effects of the loss of NMDA or mGluR5 receptors in the reward system on adaptive decision-making. ENeuro. 2018;5:ENEURO.0331–18.201.
- Grossman CD, Bari BA, Cohen JY. Serotonin neurons modulate learning rate through uncertainty. Curr Biol. 2022;32:586–.e7.
- Dabney W, Kurth-Nelson Z, Uchida N, Starkweather CK, Hassabis D, Munos R, et al. A distributional code for value in dopamine-based reinforcement learning. Nature. 2020;577:671–5.
- Amsel A. The role of frustrative nonreward in noncontinuous reward situations. Psychol Bull. 1958;55:102.
- 62. Frank MJ, Seeberger LC, O'reilly RC. By carrot or by stick: cognitive reinforcement learning in parkinsonism. Science. 2004;306:1940–3.

- Wyckmans F, Otto AR, Sebold M, Daw N, Bechara A, Saeremans M, et al. Reduced model-based decision-making in gambling disorder. Sci Rep. 2019;9:1–10.
- Sebold M, Deserno L, Nebe S, Schad DJ, Garbusow M, Hägele C, et al. Modelbased and model-free decisions in alcohol dependence. Neuropsychobiology. 2014;70:122–31.
- Grogan JP, Tsivos D, Smith L, Knight BE, Bogacz R, Whone A, et al. Effects of dopamine on reinforcement learning and consolidation in Parkinson's disease. Elife. 2017;6:e26801.
- 66. Genauck A, Quester S, Wüstenberg T, Mörsen C, Heinz A, Romanczuk-Seiferth N. Reduced loss aversion in pathological gambling and alcohol dependence is associated with differential alterations in amygdala and prefrontal functioning. Sci Rep. 2017;7:1–11.
- Kanen JW, Luo Q, Kandroodi MR, Cardinal RN, Robbins TW, Carhart-Harris RL, et al. Effect of lysergic acid diethylamide (LSD) on reinforcement learning in humans. Psychol Med. 2023;53:6434–45.
- Moda-Sava RN, Murdock MH, Parekh PK, Fetcho RN, Huang BS, Huynh TN, et al. Sustained rescue of prefrontal circuit dysfunction by antidepressant-induced spine formation. Science. 2019;364:eaat8078.
- 69. Kavalali ET, Monteggia LM. Rapid homeostatic plasticity and neuropsychiatric therapeutics. Neuropsychopharmacology. 2023;48:54–60.
- Diniz CRAF, Crestani AP. The times they are a-changin': a proposal on how brain flexibility goes beyond the obvious to include the concepts of "upward" and "downward" to neuroplasticity. Mol Psychiatry. 2023;28:977–92.
- Kim J-W, Autry AE, Na ES, Adachi M, Björkholm C, Kavalali ET, et al. Sustained effects of rapidly acting antidepressants require BDNF-dependent MeCP2 phosphorylation. Nat Neurosci. 2021;24:1100–9.
- Sale A, Berardi N, Maffei L. Enrich the environment to empower the brain. Trends Neurosci. 2009;32:233–9.
- Latham N, Mason G. Frustration and perseveration in stereotypic captive animals: is a taste of enrichment worse than none at all? Behav Brain Res. 2010;211:96–104.
- Castrén E, Antila H. Neuronal plasticity and neurotrophic factors in drug responses. Mol Psychiatry. 2017;22:1085–95.
- Spain A, Howarth C, Khrapitchev AA, Sharp T, Sibson NR, Martin C. Neurovascular and neuroimaging effects of the hallucinogenic serotonin receptor agonist psilocin in the rat brain. Neuropharmacology. 2015;99:210–20.
- Malkova NV, Gallagher JJ, Collin ZY, Jacobs RE, Patterson PH. Manganeseenhanced magnetic resonance imaging reveals increased DOI-induced brain activity in a mouse model of schizophrenia. Proc Natl Acad Sci. 2014;111:E2492–E2500.
- Davoudian PA, Shao L-X, Kwan AC. Shared and distinct brain regions targeted for immediate early gene expression by ketamine and psilocybin. ACS Chem Neurosci. 2023;14:468–80.

ACKNOWLEDGEMENTS

We thank Claire Bratley for coordinating and facilitating the collection of ex vivo MRI data. We thank Lily Qiu, Urs Schuffelgen, Clemence Ligneul, and Antoine Cherix for technical assistance with ex vivo MRI sample and image collection, and Karla Miller for supervision and funding acquisition. We also thank Thomas Akam for technical assistance with the two-step task and inputs on the data analysis, Vladyslav Vyazovskiy for useful discussions about the data, and Katie Hewitt for laboratory facility management and support. This research was funded in whole, or in part, by Wellcome (MŠ: 4-year studentship 102170/Z/13/Z; MEW: Senior Research Fellowship fellowship 202831/Z/16/Z and Collaborative Award 214314/Z/18/Z; JPL, MT and the Wellcome Trust 203139/Z/16/Z and 203139/A/16/Z; AM-B: 202788/Z/16/Z and 215573/Z/19/Z). CT was funded by the EPSRC and MRC Centre for Doctoral Training in Biomedical Imaging grant EP/L016052/1. For the purpose of open access, the author has applied a CC BY public copyright licence to any Author Accepted Manuscript version arising from this submission.

AUTHOR CONTRIBUTIONS

MŠ: conceptualisation, methodology, software, formal analysis, investigation, data curation, visualisation, writing—original draft, review and editing, funding acquisition. AL: software, formal analysis, writing—review and editing. MB-P: methodology, software, formal analysis, writing—review and editing. CT & MT: methodology, software, investigation, writing—review and editing. AM-B: methodology, software, supervision, writing—review and editing. DMB: conceptualisation, methodology, resources, supervision, writing—review and editing. DMB: conceptualisation, methodology, methodology, resources, supervision, funding acquisition, writing—review and editing. MEW: conceptualisation, methodology, resources, supervision, funding acquisition, writing—review and editing.

M. Šabanović et al.

COMPETING INTERESTS

MEW and DMB have received research funding from COMPASS Pathways to start in 2023. However, the work described here was conducted prior to this agreement and was entirely independent of any input or influence from the company. The authors affirm that COMPASS Pathways had no involvement in the design, data collection, analysis, interpretation, or preparation of this manuscript. The authors have no other competing interests to declare.

ADDITIONAL INFORMATION

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41380-024-02439-2.

Correspondence and requests for materials should be addressed to Merima. Šabanović, Mark E. Walton or David M. Bannerman.

Reprints and permission information is available at http://www.nature.com/ reprints

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http:// creativecommons.org/licenses/by/4.0/.

© The Author(s) 2024

14