Dynamic Functional Hyperconnectivity after Psilocybin Intake is Primarily Associated with Oceanic Boundlessness

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23

Abstract

Background: Psilocybin is a widely studied psychedelic substance, which leads to the psychedelic 24 state, a specific altered state of consciousness. To date, the relationship between the psychedelic 25 state's neurobiological and experiential patterns remains under-characterized as they are often 26 analyzed separately. We investigated the relationship between neurobiological and experiential 27 patterns after psilocybin by focusing on the link between dynamic cerebral connectivity and 28 retrospective questionnaire assessment. Methods: Healthy participants were randomized to receive 29 either psilocybin (n=22) or placebo (n=27) and scanned for six minutes in eyes open resting state 30 during the peak subjective drug effect (102 minutes post-treatment) in ultra-high field 7T MRI. The 31 5D-ASC Rating Scale was administered 360 minutes after drug intake. Results: Under psilocybin, 32 there were alterations across all dimensions of the 5D-ASC scale, and widespread increases in 33 averaged brain functional connectivity. Further time-varying functional connectivity analysis 34 unveiled a recurrent hyperconnected pattern characterized by low BOLD signal amplitude, 35 suggesting heightened cortical arousal. In terms of neuro-experiential links, canonical correlation 36 analysis showed higher transition probabilities to the hyperconnected pattern with feelings of 37 oceanic boundlessness, and secondly with visionary restructuralization. Conclusions: Psilocybin 38 generates profound alterations both at the brain and at the experiential level. We suggest that the 39 brain's tendency to enter a hyperconnected-hyperarousal pattern under psilocybin represents the 40 potential to entertain variant mental associations. These findings illuminate the intricate interplay 41 42 between brain dynamics and subjective experience under psilocybin, providing insights into the neurophysiology and neuro-experiential qualities of the psychedelic state. 43

44 Introduction

Hallucinogens are psychoactive drugs that, historically, have been used to alter conscious 45 experience (1,2). These drugs are divided into the classes of serotonergic psychedelics (e.g., 46 psilocybin), antiglutamatergic dissociatives (e.g., ketamine), anticholinergic deliriants (e.g., 47 scopolamine) and kappa-opioid agonists (e.g., salvinorin A) (3). Research on classical hallucinogens 48 has focused largely on serotonergic psychedelics, such as lysergic acid diethylamide (LSD), 49 ayahuasca, psilocybin, N-dimethyltryptamine (DMT), and mescaline (4). Among them, psilocybin 50 has been one of the most studied psychedelics, possibly due to its potential contribution in treating 51 different disorders (5), such as obsessive-compulsive disorder (6), death-related anxiety (7), 52 depression (8–11), treatment-resistant depression (12–14), major depressive disorder (15), terminal 53 cancer-associated anxiety (11,16), demoralization (17), smoking (18), and alcohol and tobacco 54 addiction (19–21). 55

The acute phase of psilocybin administration leads to the psychedelic state, which is a specific 56 altered state of consciousness associated with consuming psilocybin and LSD (22). By "state" we 57 here refer to the combination of neurobiological and experiential patterns that are associated with 58 59 the psychedelic experience (23). In terms of the general experiential alterations, the psychedelic state has been associated with ego dissolution, i.e., the reduction in self-referential awareness, 60 ultimately disrupting self-world boundaries with increasing feelings of unity with others and own 61 62 surroundings (25,26), unconstrained and hyper-associative cognition (27,28), profound alterations in the perception of time and space (29,30), perceptual alterations, synesthesia, amplification of 63 emotional state (31), and emotional volatility (32). Long-term and enduring effects have also been 64 reported on personality and mood, such as increases in openness and extraversion, decreases in 65 neuroticism, and increases in mindful awareness (33-35). In terms of the neurobiological pattern, 66 the psilocybin administration resulted in increased cerebral connectivity with reduced modularity, 67 whether in the acute or post-acute phase (36-38). Region-wise, there were reports of decreased 68 activity in the thalamus, posterior cingulate cortex, medial prefrontal cortex (10), and altered 69 connectivity of the claustrum (39). Network-wise, decreased connectivity was reported within the 70 71 default mode network-DMN (1,10), visual network (1), and executive control network (40), as well 72 as reduced segregation of the dorsal attentional network and executive control network (41). These neural counterparts indicate that the subjective effects of psilocybin are linked to alterations in the 73 74 activity and connectivity of important brain regions involved in information integration and routing when averaged signal analysis is concerned. Dynamic analyses of connectivity patterns after 75 76 psilocybin administration have shown that the brain tended to recurrently configure into transient

functional patterns with low stability (42). In addition, under psilocybin, there were higher 77 probabilities for the brain to configure into a connectivity pattern characterized by a global cortex-78 wide positive phase coherence (43). In terms of state transition dynamics, a recent study calculated 79 the minimum network control energy required to transition between states (or maintain the same 80 state) and found that the network control energy landscape was flattened under LSD and psilocybin, 81 meaning that there were more frequent state transitions and increased entropy of brain pattern 82 dynamics (44). Taken together, averaged and dynamic connectivity analyses suggest that psilocybin 83 alters brain function such that the overall neurobiological pattern becomes functionally more 84 85 connected, more fluid, and less modular.

Of interest is the link between the brain's functional dynamic reconfigurations and the 86 psychedelic state's experiential patterns. A recent investigation correlated the occurrence rates of 87 prominent connectivity patterns (i.e., frontoparietal subsystem and a globally coherent pattern) with 88 subjective drug intensity (SDI) measured on a 10-point Likert scale (43,45). As much as this 89 90 approach has provided insights into the ensuing psychedelic state, it can be argued that, due to its simplicity, the SDI cannot capture the complexity of the psychedelic state's phenomenological 91 pattern. Here, we adopt a neuro-experiential approach, defined here as the quantification and 92 comparison of both the neurobiological and experiential patterns. This approach allows the 93 investigation of psilocybin's effects on cerebral functional dynamics and, further, the linking of 94 95 these dynamic spatiotemporal fingerprints with reported experiential alterations measured retrospectively with standardized assessment. 96

97 Methods and Materials

This study was conducted according to the code of ethics on human experimentation established by the Declaration of Helsinki (1964) and amended in Fortaleza (Brazil, October 2013). This study was in accordance with the Medical Research Involving Human Subjects Act (WMO) and was approved by the Academic Hospital and the University's Medical Ethics Committee (Maastricht University, Netherlands Trial Register: NTR6505). All participants were fully informed of all procedures, possible adverse reactions, legal rights, responsibilities, expected benefits, and their right to voluntary termination without consequences.

Participants. The present study analyzed previously collected data on 49 healthy participants with previous experience with a psychedelic drug, but not within the past 3 months of the experiment (1). Participants were randomized to receive a single dose of psilocybin (0.17 mg/kg, n=22; 12 male; age= 23 ± 2.9 y) or placebo (n=27; 15 male; age= 23.1 ± 3.8 y).

Procedure. Participants were familiarized with the test day procedures on a separate training day 109 prior to the treatment conditions. Participants were instructed to refrain from drug use, including 110 psychedelic drugs (\geq 3 months), MDMA/ecstasy (\geq 14 days), alcohol (\geq 24 hours), and all other 111 drugs of abuse (\geq 7 days) prior to their testing day. Additionally, participants were asked to refrain 112 from caffeine and nicotine use on the day of the test day. On arrival of a test day, the absence of 113 drug and alcohol use was assessed via a urine drug screen and a breath alcohol screen. An additional 114 pregnancy test was given if participants were female. If all tests were found to be negative, 115 participants were allowed to proceed. After measurements, the treatment was administered orally in 116 117 a closed cup containing bitter lemon (placebo) or bitter lemon and psilocybin (powder). After 40 minutes, participants were placed in the MRI scanner, where resting state scans and magnetic 118 resonance spectroscopy were performed throughout a 1 hour time window. Six minutes of resting 119 state fMRI were acquired from the participants with eyes open. At the end of the test day 120 (approximately 6 hours after treatment administration), participants were asked to complete 121 measures of retrospective subjective experience (5-Dimensional Altered States of Consciousness 122 (5D-ASC). Participants stayed under supervision until the testing day was complete, and the 123 124 researcher deemed they were fit to go home.

Phenomenological Assessment. The 5D-ASC Rating Scale is a 94-item self-report scale that 125 assesses the participants' subjective experience after an altered state of consciousness, and as such, 126 is termed a retrospective phenomenological assessment (46,47). In this questionnaire, participants 127 are asked to make a vertical mark on the 10-cm line below each statement to rate the extent to which 128 the following statements applied to their experience: "No, not more than usual" to "Yes, more than 129 usual." The 5D-ASC comprises five dimensions, including oceanic boundlessness (OBN), dread of 130 ego dissolution (DED), visionary restructuralization (VRS), auditory alterations (AUA), and 131 vigilance reduction (VIR). Further, OBN, DED, and VRS can be decomposed into 11 subscales via 132 a previously published factor analysis (25): OBN: experience of unity, spiritual experience, blissful 133 state, insightfulness, disembodiment, DED: impaired control and cognition, anxiety, and VRS: 134 complex imagery, elementary imagery, audio-visual synesthesia, and changed meaning of percepts 135 comprising the 11-ASC scoring scheme. 136

137 Analysis encompassed an initial assessment for normality assumptions of the 5D-ASC and its 138 11-ASC factors using Shapiro-Wilk tests set at α =0.05. In case of violations of normality, non-139 parametric Mann-Whitney U tests would compare the 5D-ASC and 11-ASC scores between the two 140 groups. P-values were corrected using the Bonferroni method with a significance level set at α =0.05. 141 The effect size was calculated based on Glass rank biserial coefficient (rg).

Neuroimaging Setup. Images were acquired on a 7T Siemens Magnetom scanner (Siemens 142 Medical, Erlangen, Germany) using 32 receiving channel head array Nova coil (NOVA Medical 143 Inc., Wilmington MA). The T1w images were acquired using a magnetization-prepared 2 rapid 144 acquisition gradient-echo (MP2RAGE) sequence collecting 190 sagittal slices following 145 parameters: repetition time (TR) = 4500 ms, echo time (TE) = 2.39 ms, inversion times TI1 /TI2 = 146 900/2750 ms, flip angle1 = 5°, flip angle2 = 3°, voxel size = 0.9 mm isotropic, bandwidth = 250 147 Hz/pixel. In addition, 258 whole-brain EPI volumes were acquired at rest (TR = 1400 ms; TE = 21148 ms; field of view=198 mm; flip angle = 60° ; oblique acquisition orientation; interleaved slice 149 150 acquisition; 72 slices; slice thickness = 1.5 mm; voxel size = $1.5 \times 1.5 \times 1.5 \text{ mm}$).

151 Analysis encompassed:

Preprocessing: fMRI data were preprocessed using a local pipeline based on SPM12 (48) and 152 FSL 6.0.4 (49). After realignment and susceptibility distortion correction (FSL topup (50)), 153 functional data were registered to the high-resolution T1 image, then normalized to the standard 154 MNI space, and finally smoothed using a Gaussian kernel with a full width at half maximum 155 (FWHM) of 6mm. After segmentation of the structural T1 image into grey matter (GM), white 156 matter (WM), and CSF masks, the bias-corrected structural image and all the extracted masks 157 were normalized to the MNI space. Further, WM and CSF masks were eroded by one voxel to 158 remove any overlapping between these tissues and the GM voxels. To denoise functional time 159 160 series, we used a locally developed pipeline written in Python [nipype package (51)]. In this pipeline, a general linear model (GLM) was fitted to each voxel data separately, regressing out 161 the effect of six movement parameters (translation in x, y, and z directions, and rotation in yaw, 162 roll, and pitch directions) and their first derivative, constant and linear trends using zero-order 163 and first-order Legendre polynomials, 5 principal components of signals in the WM and CSF 164 masks. In addition, outlier detection was performed using the ART toolbox 165 (http://web.mit.edu/swg/software.htm), and outliers were modeled as nuisance regressors in the 166 GLM. Any volume with a movement value of greater than 3 mm, rotation value of greater than 167 0.05 radians, and z-normalized global signal intensity of greater than 3 was considered an outlier. 168 After regressing out these nuisance regressors, the remaining signal was filtered in the range of 169 170 [0.008, 0.09] Hz and was used for further analysis. The Schaefer atlas with 100 ROIs and a resolution of 2mm (52) was used to extract the averaged BOLD signals inside each ROI. 171

Estimation of Averaged Functional Connectivity. Pearson correlations were calculated between 172 the BOLD time series for every pair of ROIs, subsequently Fisher transformed, resulting in the 173 generation of a 100×100 connectivity matrix for each individual participant. An Independent t-174

test was used to compare the 4950 possible between-region connectivity values between the two
groups. FDR correction was performed to correct for multiple comparisons. Further, the average
of the connectivity values over the whole brain was calculated for each participant and was
considered as the overall connectivity value of the brain. An independent t-test was performed to
compare the overall connectivity values between psilocybin and placebo groups.

Estimation of Time-varying Functional Connectivity. We used phase-based coherence to extract
 between-region connectivity patterns at each time point of the scanning session(52,53). For each
 participant i, after z-normalization of time series at each region r (i.e., x_{i,r}[t]), the instantaneous
 phase of each time series was calculated via Hilbert transform as:

184
$$\hat{x}_{i,r}(t) = \frac{1}{\pi t} * x_{i,r}(t)$$

where * indicates a convolution operator. Using this transformation, we produced an analytical
signal for each regional time series as:

187
$$x_{i,r}^{a}(t) = x_{i,r}(t) + j\hat{x}_{i,r}(t)$$

188 where $j = \sqrt{-1}$. From this analytical signal, the instantaneous phase of each time series can be 189 estimated as:

190
$$\varphi_{i,r}(t) = \tan^{-1}\left(\frac{\hat{x}_{i,r}(t)}{x_{i,r}(t)}\right)$$

191 After wrapping each instantaneous phase signal of $\varphi_{i,r}(t)$ to the $[-\pi, \pi]$ interval and naming the 192 obtained signal as $\theta_{i,r}(t)$, we calculated a connectivity measure for each pair of regions as the 193 cosine of their phase difference. For example, the connectivity measure between regions r and s 194 in subject i was defined as:

195
$$conn_{i,r,s}(t) \triangleq \cos\left(\theta_{i,r}(t) - \theta_{i,s}(t)\right)$$

By this definition, completely synchronized time series lead to a connectivity value of 1, completely desynchronized time series produce a connectivity value of zero, and anticorrelated time series produce a connectivity measure of -1. Using this approach, we created a connectivity matrix of 100×100 at each time point t for each subject i that we called $C_i(t)$:

200
$$C_i(t) \triangleq \left[conn_{i,r,s}(t) \right]_{r,s}$$

After collecting the connectivity matrices across all time points and participants, k-means clustering was applied, with 500 repetitions and 200 iterations at each repetition. With this

203 technique, four robust and reproducible patterns were extracted as the centroids of the clusters, 204 and each resting connectivity matrix was assigned to one of the extracted patterns. For 205 comprehensive purposes, we performed supplementary analyses by varying the number of 206 clusters k=3-7.

We calculated the occurrence rate of each pattern defined as the proportion of connectivity matrices assigned to that pattern and was calculated for each subject separately. Independent twotailed t-tests were used to compare the occurrence rate of each FC pattern between the psychedelic and placebo groups. Bonferroni correction was used to correct the p-values for multiple comparisons across the four connectivity patterns.

212 Dynamic state transition modeling. To investigate the temporal evolution of the identified connectivity matrices, we defined the extracted patterns as the distinct states of a dynamical 213 system transitioning between them over time using Markov modelling(53). Using this approach, 214 the data of a sample participant could be stated as a sequence of connectivity patterns over time 215 (i.e., $\{P_t \mid t: 1, ..., T \text{ and } P_t \in \{1, ..., M\}\}$, where M is the number of patterns and T is the number 216 of signal time points). In this case, the probability of transitioning from Pattern I to Pattern J 217 defined as $p(I \rightarrow I)$, considering $I, I \in \{1, ..., M\}$, can be calculated as the number of consecutive 218 *I*, *I* pairs in the sequence, divided by the total number of transitions from pattern *I*: 219

220
$$p(I \to J) = \frac{\sum_{t=0}^{T-1} [(P_t == I) \& (P_{t+1} == J)]}{\sum_{j=1}^{M} \sum_{t=0}^{T-1} [(P_t == I) \& (P_{t+1} == j)]}$$

This transition probability was estimated for each possible between-state transition and each subject separately. With this approach, we could compare any significant difference in transition probabilities between two groups of subjects. To detect significantly different transition probabilities between the two groups, Wilcoxon rank-sum test was performed on each transition and p-values were FDR-corrected.

<u>Regional BOLD Amplitude Analysis</u>. The Euclidean norm of the BOLD signal was calculated
 at each ROI as a measure of the power of the signal. Independent t-test was used to compare the
 regional BOLD signal power between two groups, and p-values were FDR-corrected due to
 multiple comparisons.

- <u>Neuro-experiential Analysis.</u> A canonical correlation analysis (CCA) was conducted using the sixteen dynamic patterns transition probability variables as features of the neuronal space and the 11-ASC variables as features of the phenomenological space to evaluate the multivariate shared relationship between the two variable sets. CCA is a multivariate latent variable model that identifies associations between two different data modalities (55). Considering matrix $X^{N \times M}$

contains M neuronal features of N subjects, and $Y^{N\times P}$ contains P questionnaire features of N subjects, the objective of the CCA is to find pairs of neuronal and questionnaire weights $w_x^{M\times 1}$ and $w_y^{P\times 1}$ such that the weighted sum of the neuronal and experiential variables maximizes the correlation between the resulting latent variables (canonical variates):

239

$$\max_{w_x,w_y} corr(Xw_x,Yw_y)$$

After finding latent variables Xw_x and Yw_y that have the maximal correlation, the features in 240 each data modality that have a stronger correlation with their respective latent variable are also 241 significantly associated with one another. To account for over-fitting, we used a permutation test 242 to calculate the significance of correlation values. This was achieved by random shuffling of 243 244 observations in the neural space compared to the observations in the phenomenological space. The procedure was repeated 100,000 times, and at each iteration, a CCA model was fitted to the 245 246 data, and the correlation values were calculated. These values were used to construct the null distribution and to calculate the p-value of the observed correlation value in the main analysis. 247 248 The obtained p-values were FDR-corrected to account for the multiple comparisons.

Validation of the Results. We analyzed the potential effects of motion, atlas parcellation, and 249 global signal regression on the main results. To quantify motion, we calculated the mean 250 framewise displacement (FD) (56) for each subject as well as for each time-varying connectivity 251 pattern. Independent t-tests were used to compare the mean FD between Placebo and Psilocybin 252 groups as well as between time-varying connectivity patterns. Furthermore, the Pearson 253 correlation between the Mean FD and either mean functional connectivity or mean BOLD signal 254 amplitude was calculated. To investigate the role of sub-cortical regions, we incorporated 19 sub-255 cortical regions (Brain Stem together with the Thalamus, Caudate, Putamen, Pallidum, 256 Hippocampus, Amygdala, Accumbens area, VentralDC, and Cerebellum in the right and left 257 258 hemispheres) sourced from the Human Connectome Project (57–59), into the initially utilized Schaefer atlas, resulting in an atlas with 119 regions of interest. Then, we performed both 259 260 averaged and dynamic functional connectivity analysis using this combined atlas. Finally, to verify the effect of the global signal on the analysis results, we also performed all the analyses 261 262 after global signal regression (GSR).

263 **Results**

Experiential Assessment. All variables of the 5D-ASC and its 11-ASC factors violated the assumption of normality (Table S1). As a result, Mann-Whitney U tests compared the phenomenological outcomes in the two groups. Analyses revealed significant differences in all

dimensions and factors with large effect sizes, such that the psilocybin group had more substantialeffects than the placebo (Figure 1A and 1B, Table 1).

Neuroimaging. After psilocybin, whole-brain averaged connectivity increased (independent t-269 test: t=3.087, p=0.004; Figure 2A). This overall increase was further observed as a cortex-wide 270 271 increase in the connectivity matrix values (independent t-test on the between-region connectivity values with FDR correction; Figure 2B) and an increase of the averaged connectivity values in the 272 transmodal regions (independent t-test on the regional averaged connectivity values with FDR 273 correction; Figure S1). These alterations in the connectivity values were also accompanied by 274 changes in the BOLD signal amplitude. By calculating the Euclidean norm of the BOLD time series 275 related to each ROI, we found that regional BOLD signal amplitude decreased after psilocybin 276 277 administration in both posterior and anterior regions compared to the placebo group (independent ttest, FDR-corrected; Figure 2C, and Figure S2). While somatomotor, limbic network, and temporal 278 279 regions of the DMN did not show significant changes in their signal norm, the highest decrease in 280 BOLD signal amplitude was related to the posterior cingulate cortex and parietal regions of the external control network. 281

Time-varying analysis revealed variant and distinct patterns of complex inter-areal interactions: 282 one of both correlations and anti-correlations (Pattern 1), one of anti-correlations of the DMN with 283 other networks (Pattern 2), one of global cortex-wide positive connectivity (Pattern 3), and one of 284 285 low inter-areal connectivity (Pattern 4). Pattern 3 occurred significantly more often in the psilocybin group when compared to the placebo group (independent t-test: t=3.731, p=0.001, $\alpha_{\text{honferroni}}$ = 286 0.05/4 = 0.0125, Figure 2D). Supplementary analyses using k=3-7 clusters showed that the same 287 connectivity patterns were replicable, and hyperconnectivity had a higher occurrence rate in the 288 289 psychedelic state (Figure S3). In terms of dynamic transitions, the psilocybin group showed significantly higher transition probabilities towards Pattern 3 from Pattern 1 (Wilcoxon Rank-Sum 290 test: z=2.744, p=0.006), Pattern 3 (z=2.291, p=0.022), and Pattern 4 (z=2.000, p=0.045; Figure 2E). 291 In addition, the psilocybin group showed lower transition probabilities from Pattern 2 to itself 292 293 compared to the placebo group (z=-2.452, p=0.014).

The neuro-experiential link was investigated with canonical correlation analysis (CCA), by which we estimated the first canonical vector for both the behavioral and neural space that maximized the shared correlation between two spaces (r=0.97, p<0.001). Considering the neural space, the transition probabilities from Pattern 1 to Pattern 3 showed the highest correlation with the first canonical vector of the neural space (r=0.86, p<0.001, Figure 3A). In addition, the transition from Pattern 4 to Pattern 3 (r=0.40, p=0.016) showed a lower significant correlation with the first

canonical vector of the neural space. In the questionnaire space, factors related to oceanic 300 boundlessness (experience of unity: r=0.80, p=0.008, blissful state: r=0.74, p=0.010, insightfulness: 301 r=0.68, p=0.013, spiritual experience: r=0.62, p=0.044) and visionary restructuralization 302 (elementary imagery: r=0.67, p=0.012 and audio-video synesthesia: r=0.61, p=0.021) showed the 303 highest correlations with the first canonical vector of this space (Figure 3B). To account for over-304 fitting, we used a permutation test to calculate the significance of correlation values. This was 305 achieved by random shuffling of observations in the neural space compared to the observations in 306 the questionnaire space. The procedure was repeated 100,000 times, and at each iteration, a CCA 307 308 model was fitted to the data, and the correlation values were calculated. These values were used to construct the null distribution and to calculate the p-value of the observed correlation value in the 309 main analysis. The obtained p-values were FDR-corrected to account for the multiple comparisons. 310 To validate the results, we also performed a CCA analysis between the dimensions of the 5D-ASC 311 and the between-state transition probabilities. At the neural space, the transition probability from 312 Pattern 1 to Pattern 3 showed the highest correlation with the first canonical vector of the neural 313 space (r=0.89, p<0.001), and at the questionnaire space, oceanic boundlessness showed the highest 314 315 correlation with the first canonical vector (r=0.93, p=0.0145; Table 2).

Validation. The analysis of the effect of motion revealed comparable values in terms of mean 316 framewise displacement between the Psilocybin and Placebo group (independent t-test, t=-0.31, 317 p=0.76; Figure S4.A), as well as between the connectivity patterns (Figure S4.B). Additionally, no 318 significant correlations were observed between mean framewise displacement and either mean 319 functional connectivity values (r=0.23, p=0.12) or mean BOLD signal amplitude (r=0.11, p=0.43; 320 Figure S4.C). Furthermore, the connectivity results were replicated even after adding subcortical 321 regions to the parcellation atlas (Figure S5). However, regressing out the global signal led to the 322 absence of a significant increase in functional connectivity values within the psilocybin group 323 (Figures S6.A, and S6.B), as well as the absence of a hyper-connectivity pattern in the dynamic 324 325 functional analysis (Figure S6.C) as also previously shown (59). Given that the GS amplitude was lower in the Psilocybin group, and that motion values were comparable between the Psilocybin and 326 Placebo groups, we do consider that GS might contain inherent information about the psychedelic 327 state. Therefore, we opted to retain the GS in the main analyses. 328

329 Discussion

We investigated the effect of the serotonergic hallucinogen psilocybin on the brain's functional connectome to link it with consciousness alterations to better comprehend how resulting neural and phenomenological changes are interconnected. Overall, we found that psilocybin administration led

to a tendency of the brain to recurrently configure in a globally hyperconnected pattern, which was
linked to heightened reports of oceanic boundlessness (experience of unity, blissfulness,
insightfulness, and spiritual experience), and visionary restructuralization (complex imagery,
elementary imagery, audio-visual synesthesia, and changed meaning of percepts).

Regarding experiential changes, the psilocybin group exhibited significant increases across all 337 dimensions and factors compared to the placebo, including derealization, depersonalization, loss of 338 self-control, visual pseudo-hallucinations (both elementary and complex), audio-visual synesthesia, 339 unity experiences, spiritual insight, bliss, and disembodiment (45), as previously reported (1). These 340 findings demonstrate that a moderate psilocybin dose produces a distinct phenomenological pattern 341 compared to a placebo. Previous research on psilocybin administration also noted measurable 342 343 changes in various dimensions with dosages ranging from 45 to 315 µg/kg body weight compared to a placebo (60,61). Our data aligns with this dose-dependent phenomenological pattern associated 344 345 with psilocybin consumption.

Regarding neural changes, the psilocybin group exhibited an overall increase in whole-brain 346 functional connectivity, consistent with previous reports (37). Serotonergic psychedelics, including 347 psilocybin, have been shown to alter the brain's functional organization, promoting greater global 348 integration with increased short-range and long-range functional connections (41,62,63). The 349 dynamic analysis revealed a higher probability of the brain transitioning to a hyperconnected pattern 350 351 under psilocybin compared to the placebo group, a pattern reported in other psychedelic studies (42). This hyperconnected state, previously shown to be characterized by maximal integration and 352 minimal segregation (53), aligns with the flattened landscape theory, where specific connectivity 353 patterns become less dominant under psychedelics, resulting in increased transition probabilities to 354 the functionally non-specific hyperconnected pattern.^{43,63,64} 355

Additionally, the hyperconnectivity pattern in the psilocybin group was associated with cortex-356 wide decreases in BOLD signal amplitude. Despite the ongoing debate about global signal (GS) 357 removal in denoising processes due to its reflection of various fMRI nuisance sources, we chose to 358 retain GS in our analysis (66-70). This decision was based on our recent finding that GS can 359 complement extracted connectivity patterns (59). Specifically, we observed that when the 360 hyperconnected pattern coincided with high GS amplitude during wakeful rest, participants were 361 more likely to report instances of mind blanking (59,71). Previously, the GS amplitude served as an 362 indirect measure of general arousal levels, with higher amplitude indicating lower arousal and lower 363 amplitude linked to higher arousal (72-75). After LSD intake, similar results were observed, 364

365 showing a decrease in signal variance, which eventually leads to a decrease in GS (76). In our study,
366 the hyperconnectivity pattern was associated with reduced GS amplitude, further contributing to the
367 understanding of the psychedelic state as mediated by high cortical arousal (77). It is important to
368 mention that the hyperconnected pattern was sensitive to GS removal and did not show such signal
369 configuration after the regression (Supplementary Information), which is consistent with our
370 previous work with this method (59).

371 In neuro-experiential terms, we found a significant association between higher transition probabilities into the hyperconnected pattern and the factors of oceanic boundlessness (OBN) and 372 373 visionary restructuralization (VRS). OBN entails a positive mood, insight, and unity experiences (25). Previous studies linked positive ego dissolution and oceanic boundlessness to reduced 374 375 hippocampal glutamate (1) and increased insight to reduced DMN within-network static functional connectivity (27). Our whole-brain dynamic analysis extends this by demonstrating that recurrent 376 hyperconnected states after psilocybin intake can explain unity experiences, characterized by a 377 disruption of the self-world boundary, contrasting with the hyperconnected pattern's atypical 378 minimal segregation profile (53). We propose that unity feelings and visual pseudo-hallucinatory 379 experiences under psilocybin are linked to the brain's inclination for highly integrated patterns, 380 showcasing its capacity for diverse mental associations. This is supported by improved creative 381 thinking dimensions (27,79) attributed to increased between-network functional connectivity of 382 DMN and the frontoparietal network, (28) which resembles the hyperconnected pattern. 383

Three OBN factors (unity, bliss, insight) had the highest canonical correlations in our analysis, 384 385 followed by VRS factors. Dimensional-level canonical correlations reinforced OBN's highest association with transition probabilities to the hyperconnected pattern. Despite serotonergic 386 psychedelics being historically labeled as hallucinogens, our findings align with psilocybin studies, 387 emphasizing OBN's primary role in phenomenological outcomes (79-81). OBN's overall 388 389 importance in the psychedelic state is further supported by research showing that it is linked to increased 5-HT2AR receptor binding potential (60,61), that it predicts functional connectivity 390 changes (82), and that it positively correlates with somatomotor network disconnection (83). Since 391 OBN is defined as the positive valence associated with depersonalization and derealization, it is a 392 key psychometric dimension describing ego phenomenological modifications (25,45). The here 393 performed CCAs on both the 5D-ASC and 11-ASC show OBN and its factors as having the strongest 394 correlations with the latent variable of the neurobiological space. This may suggest OBN as the 395 primary driver of psilocybin's experiential pattern, prompting consideration of more precise terms 396 397 such as "egotropic" over "hallucinogenic" when discussing its clinical relevance. This is not to

suggest that the other psychometric dimensions/factors do not have importance or clinical relevance.
Rather, we mean to raise a discussion around how egotropic effects of psilocybin may be overlooked
as reflected in how the drug is labelled or categorized.

Our study has several limitations. First, the absence of concurrent physiological recordings 401 during fMRI scanning restricts tracking arousal levels, leaving us to use GS amplitude as a proxy 402 for cortical arousal. Simultaneous physiological and electrophysiological recordings in future 403 studies could enhance the understanding of neuronal firing during hyperconnected patterns. Second, 404 the between-subject design, which also requires brain anatomy normalization to the MNI space, 405 could hamper the reproducibility of the findings. A proper within-subject design is required in future 406 studies to mitigate this shortcoming. We further recognize that, even with classic mitigations at 407 408 preprocessing, the effect of motion can still be influencing the obtained findings. Similar effects can also come from the shift in the neurovascular coupling during psychedelics, as recent work in mice 409 with calcium imaging has shown (84). Fourth, we are aware that due to methodological differences 410 411 using an eyes-open condition during rest our results are not fully in line with other protocols where the psychedelic effects are were maximized with eyes closed. However, as in our past study we 412 showed that the characteristic psychedelic effects could be found in this cohort of subjects even in 413 the eyes open (1), we remain assured that here we also characterize this state adequately. Also, in 414 our past work we identified differences in the DMN which in the present analysis was not 415 straightforward finding. We think that this discrepancy is due to the adoption of a whole-brain 416 network characterization, using an atlas-based parcellation with multiple ROIs, which can reduce 417 the sensitivity of capturing network-level alterations. Lastly, the analysis' reliance on the recruited 418 population may limit generalizability, though previous studies demonstrated replicability and 419 universality of recurrent connectivity patterns in different datasets and brain parcellations (53,59). 420

In summary, psilocybin induces significant alterations in both brain function and subjective 421 experience, promoting a functionally non-specific hyperconnected organization. 422 The hyperconnected state correlates with reported experiences of oceanic boundlessness and visual 423 pseudo-hallucinations, highlighting the complex interplay between brain dynamics and subjective 424 phenomena potentially reflecting the ability to entertain variant mental associations. In total, these 425 426 findings illuminate the intricate interplay between brain dynamics and subjective experience under psilocybin and providing insights into the neurophysiology and neuro-experiential qualities of the 427 psychedelic state. 428

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445 **Disclosures:** The authors report no biomedical financial interests or potential conflicts of interest.

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Figure 1. Substantial alterations in subjective experience were reported after psilocybin administration compared to placebo. A) The assessment of five dimensions of altered states of consciousness questionnaire (5D-ASC) showed that the administration of psilocybin significantly altered subjective experience in all dimensions. B) The same effect can also be observed considering the 11 factors of altered states of consciousness (11-ASC). Notes, OBN: Oceanic Boundlessness, DED: Dread of Ego Dissolution, VRS: Visionary Restructuralization. Radar plots illustrate group means for each dimension/factor.

Figure 2. After psilocybin administration, there was an overall cerebral tendency to show 671 more re-occurrence of a functional hyper-connectivity pattern. A) Averaged functional 672 connectivity expressed as Fisher-transformed correlation values increased significantly after 673 psilocybin administration compared to the placebo group. B) There were higher inter-regional 674 connectivity values in the psilocybin group. The matrix represents t-values comparing the 675 connectivity matrices of the psilocybin group and those of the placebo group (contrast: psilocybin 676 677 minus placebo). Only significant difference values are colored. C) The BOLD amplitude of posterior and anterior brain regions decreased after psilocybin administration, while the amplitude 678 of somatomotor and limbic areas, as well as the temporal regions of default more network (DMN), 679 remain unchanged. Colors are based on t-values comparing the Euclidean norm of BOLD time series 680 in the psilocybin group and the placebo group at each ROI; only significant difference values are 681 colored. **D**) The functional connectome reconfigures in four connectivity patterns, ranging from 682 complex inter-areal interactions (Pattern 1) to a low inter-areal connectivity profile (Pattern 4). After 683 psilocybin administration, there was a significant increase in the occurrence rate of the global 684 cortex-wide positive connectivity (Pattern 3). The connectivity matrices are colored based on the 685 connectivity value: from dark blue to dark red corresponds to connectivity values from -1 to +1. 686 Violin plots represent the distribution of patterns' occurrence rates across participants. E) The 687 transition probability from other patterns to Pattern 3 increased in the psilocybin group. Arrows 688 indicate transitions between functional connectivity states. Green corresponds to significantly 689 higher transition probabilities (Wilcoxon Rank-Sum test) for the psilocybin group compared to the 690 placebo, and red corresponds to significantly higher transition probabilities for the placebo 691 compared to the psilocybin group. 692

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Figure 3. The neuro-experiential analysis indicated that transitions to the hyperconnected Pattern 3 were linked to the factors of oceanic boundlessness and visionary restructuralization. A) In the neural space, the canonical correlation analysis showed that the

transition probabilities to the hyperconnected pattern had the highest correlation with the first 697 canonical vector of the space. Notes: Demonstrated p-values are related to the significant correlation 698 values and are FDR-corrected. The x-axis represents pattern transitions, e.g. T13: transition from 699 Pattern 1 to Patten 3. B) In the phenomenological space, factors related to the dimension of oceanic 700 boundlessness and visionary restructuralization showed the highest correlation with the first 701 702 canonical vector of the space. Bars represent correlation values of each factor to the first canonical vector of its associated space. Notes: OBN: oceanic boundlessness, VRS: visionary 703 restructuralization, DED: dread of ego dissolution, Unity: experience of unity, Bliss: blissful state, 704 705 Insight: insightfulness, Spirit: spiritual experience, Disembody: disembodiment, ElemImg: elementary imagery, Synesth: audio-visual synesthesia, CmpxImg: complex imagery, ChangeMean: 706 changed meaning of percept, Impair: Impaired control and cognition, AUA: auditory alterations, 707 VIR: vigilance reduction. 708

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Table 1. There were substantial changes in subjective experience after psilocybin
 administration compared to placebo. Mann-Whitney U test results of comparison between 11 ASC factors of the Psilocybin and Placebo groups. rg = Glass rank biserial coefficient effect size.

Table 2. The neuro-experiential analysis indicated that transitions from Pattern 1 to the hyperconnected Pattern 3 were linked to Oceanic Boundlessness. Canonical correlation analysis between between-state transition probabilities and five dimensions of the 5D-ASC. The results are sorted from the highest correlation to the lowest.

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Table 1

		Psilocybin		Placebo		Stats		
		(n=21)		(n=26)		(MW-U test)		est)
		mean	SD	mean	SD	U	rg	р
	Oceanic Boundlessness	35.09	23.58	3.78	5.56	528.5	.936	< 0.001
ບ	Dread of Ego Dissolution	20.54	17.12	3.94	8.05	494	.81	< 0.001
-AS	Visionary Restructuralization	42.97	19.20	5.33	9.23	528.5	.936	< 0.01
5D	Auditory Alterations	16.99	17.18	4.69	12.97	458.5	.679	< 0.001
	Vigilance Reduction	28.18	20.43	13.99	16.33	400.5	.467	< 0.001
	Insightfulness	42.44	29.77	4.99	7.39	508	0.861	<0.001
	Spiritual Experience	21.73	22.04	3.33	6.91	435	0.593	<0.001
	Experience of Unity	33.27	30.57	2.85	4.70	483.5	0.771	<0.001
	Blissful State	35.65	27.02	4.36	7.04	489	0.791	<0.001
ບ	Disembodiment	20.65	25.71	1.74	1.82	434	0.59	<0.001
-AS	Anxiety	19.55	22.57	3.01	4.30	430	0.575	<0.001
11	Impaired Control and Cognition	24.29	18.35	4.77	12.51	497	0.821	<0.001
	Changed Meaning of Percept	36.75	29.65	4.24	8.92	495.5	0.815	<0.001
	Audio-Visual Synesthesia	49.54	22.82	4.94	12.99	525	0.923	<0.001
	Complex Imagery	36.43	25.49	6.22	12.03	528.5	0.839	<0.001
	Elementary Imagery	49.25	21.95	5.68	9.24	502	0.943	<0.001
	5.							

Table 2.

	Factor	Correlation	p-value	p-value
		Coefficient		(FDR-Corrected)
	T13	0.89	1.00e-05	1.60e-04 ***
	T23	0.44	3.07e-02	1.64e-01
	T43	0.43	1.71e-03	1.37e-02 *
	T33	0.25	5.94e-02	1.91e-01
	T21	0.23	4.86e-02	1.91e-01
	T14	0.12	1.58e-01	4.22e-01
e	T32	0.09	2.90e-01	5.80e-01
Spac	T24	0.09	2.51e-01	5.73e-01
ıral	T31	-0.01	5.37e-01	9.55e-01
Neı	T44	-0.08	7.61e-01	9.92e-01
	T11	-0.09	6.61e-01	9.92e-01
	T41	-0.17	8.38e-01	9.92e-01
	T34	-0.27	9.70e-01	9.92e-01
	T22	-0.33	9.69e-01	9.92e-01
	T12	-0.34	9.84e-01	9.92e-01
	T42	-0.34	9.92e-02	9.92e-01
al	OBN	0.93	2.90e-03	1.45e-02 *
ogic	VRS	0.74	4.29e-02	1.07e-01
enol	DED	0.46	2.02e-01	3.32e-01
nom	AUA	0.35	2.66e-01	3.32e-01
Phe	VIR	0.11	4.54e-01	4.54e-01
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Tij: probability of transition from Pattern i to Pattern j. OBN: oceanic boundlessness, VRS: visionary restructuralization, DED: dread of ego dissolution, AUA: auditory alteration, VIR: vigilance reduction.







Experiential Measures