# Body mass index (BMI) does not predict responses to psilocybin

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#### Abstract

**Background:** Psilocybin is a serotonin type 2A  $(5-HT_{2A})$  receptor agonist and naturally occurring psychedelic.  $5-HT_{2A}$  receptor density is known to be associated with body mass index (BMI), however, the impact of this on psilocybin therapy has not been explored. While body weight-adjusted dosing is widely used, this imposes a practical and financial strain on the scalability of psychedelic therapy. This gap between evidence and practice is caused by the absence of studies clarifying the relationship between BMI, the acute psychedelic experience and long-term psychological outcomes.

**Method:** Data were pooled across three studies using a fixed 25 mg dose of psilocybin delivered in a therapeutic context to assess whether BMI predicts characteristics of the acute experience and changes in well-being 2 weeks later. Supplementing frequentist analysis with Bayes Factors has enabled for conclusions to be drawn regarding the null hypothesis.

**Results:** Results support the null hypothesis that BMI does not predict overall intensity of the altered state, mystical experiences, perceptual changes or emotional breakthroughs during the acute experience. There was weak evidence for greater 'dread of ego dissolution' in participants with lower BMI, however, further analysis suggested BMI did not meaningfully add to the combination of the other covariates (age, sex and study). While mystical-type experiences and emotional breakthroughs were strong predictors of improvements in well-being, BMI was not.

**Conclusions:** These findings have important implications for our understanding of pharmacological and extra-pharmacological contributors to psychedelic-assisted therapy and for the standardization of a fixed therapeutic dose in psychedelic-assisted therapy.

#### Keywords

Psychedelic therapy, psychedelic-assisted therapy, body mass index, body weight, classic psychedelic, hallucinogen, Bayes Factor, 5-HT<sub>2A</sub>

Psilocybin-assisted therapy is making a resurgence in psychiatry (Aday et al., 2020; Nutt et al., 2020). Following ingestion, psilocybin (one of the active constituents of 'magic mushrooms') is rapidly dephosphorylated to psilocin (4-hydroxy-N,N-dimethytryptamine), which acts (non-selectively) as a serotonin type 2A (5-HT<sub>2A</sub>) receptor agonist (Nichols, 2016). Serotonin 2A receptor agonism is responsible for the signature acute psychological effects of psychedelics (Carter et al., 2005; Vollenweider et al., 1998), with greater plasma psilocin and 5-HT<sub>2A</sub> receptor occupancy being associated with a greater intensity of subjective effects (Madsen et al., 2019). There is growing interest in aspects of the acute experience that are important for facilitating long-term positive outcomes following administration within a therapeutic setting, with both the 'mystical-type' experience (Bogenschutz et al., 2015; Griffiths et al., 2011, 2016; MacLean et al., 2011; Roseman et al., 2018; Ross et al., 2016) and acute emotional-breakthroughs (Roseman et al., 2019; Spriggs et al., 2020) being identified as robust and reliable predictors of therapeutic change. Stenbæk et al. (2020) recently demonstrated that the relationship between individual differences in 5-HT<sub>2A</sub> receptor binding and the mystical-type experience is not straightforward; lower pre-drug 5-HT<sub>24</sub> receptor binding was associated with greater mystical-type experience, longer peak duration and a steeper return to normal waking consciousness. There is currently an absence of data on how the relationship between 5-HT<sub>2A</sub> receptor expression and acute experience translates into long-term outcomes of psychedelic therapy.

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5-HT<sub>2A</sub> receptor density in the brain varies across individuals based on clinical and demographic factors (Adams et al., 2004), one of which is body mass index (BMI). BMI is defined as a person's weight (in kilograms) divided by the square of their height (in m). It is commonly used as a health classifier for four weight categories (underweight (<18.5 kg/m<sup>2</sup>), normal (18.5-24.9 kg/m<sup>2</sup>), overweight (25–29.9 kg/m<sup>2</sup>) and obese (BMI > 29.9 kg/m<sup>2</sup>)) (World Health Organization, 1995, 2006) and is used diagnostically in feeding and eating disorders such as anorexia nervosa (American Psychiatric Association, 2013). Prior studies have demonstrated a relationship between expression of 5-HT<sub>24</sub> receptors in the brain, and diet and body mass. A high-fat diet is associated with a greater density of 5-HT<sub>2A</sub> receptors (Huang et al., 2004), while a reduction in 5-HT<sub>2A</sub> receptor density has been demonstrated in patients who are currently ill and recovered from anorexia nervosa (Frank et al., 2002; Kaye, 2008). The -1438 G/A polymorphism of the 5-HT<sub>2A</sub> receptor gene has been linked to differences in body mass (Rosmond et al., 2002) and the pathogenesis of eating disorders (Ricca et al., 2002; Rosmond et al., 2002). Furthermore, BMI has been shown to correlate positively with 5-HT<sub>2A</sub> receptor binding in superior temporal cortex, medial inferior temporal cortex, right dorsolateral prefrontal cortex (DLPFC) and right sensory motor cortex (Adams et al., 2004; Erritzoe et al., 2009).

Body weight-adjusted dosing is a 'gold standard' in pharmacological research, and has been widely used in research on psilocybin (Bogenschutz et al., 2015; Brown et al., 2017; Carbonaro et al., 2016; Carter et al., 2005, 2007; Grob et al., 2011; Nicholas et al., 2018; Ross et al., 2016; Schmidt et al., 2012; Umbricht et al., 2002; Vollenweider et al., 2007). Given the PET findings above (Stenbæk et al., 2020), and an increased receptor density in those with a higher BMI, it is unclear what impact weight-adjusted dosing would have on the acute experience. More broadly, it has been suggested that body weight may be insufficient as an adjustment metric as it does not account for body composition, which is particularly important for those within the obese BMI range (Green and Duffull, 2004; Morrish et al., 2011). In a pooled analysis of studies using weight-adjusted doses of psilocybin, Studerus et al. (2011) found that BMI was not a significant predictor of the intensity of the acute psilocybin experience across a dose range of 115-315 mg/kg. A more recent analysis across trials using doses of 20 mg/70 kg and 30 mg/70 kg also found no evidence for a relationship between body weight and acute experience (Garcia-Romeu et al., 2021). While these authors did mimic a 'fixed dose' group analysis (dose range 23-27 mg), all these studies employed body weight-adjusted dosing, largely limiting any conclusions that can be made about BMI. Additionally, neither of these previous analyses looked at the long-term psychological outcomes of the psychedelic experience.

An attractive alternative to body weight-adjusted dosing is to use a fixed dose. Such a strategy has the important benefit of simplifying the logistics of large-scale clinical roll-out. Moreover, this approach has been supported by pharmacokinetic simulations conducted by Brown et al. (2017) who demonstrated that 25 mg would be a sufficient fixed dose to induce the therapeutically meaningful acute experiences of a dose of 0.3 mg/kg (Griffiths et al., 2011; Hirschfeld and Schmidt, 2020; Nicholas et al., 2018). No studies to date have directly assessed the relationship between BMI and the acute experience after a fixed high (i.e. therapeutically meaningful) dose of psilocybin, and whether this has any impact on the long-term psychological outcomes. To address this, we conducted a pooled analysis across three recent studies from the Centre for Psychedelic Research, Imperial College London where a fixed high dose of 25 mg psilocybin was administered within a supportive environment. The aim of this analysis was to ascertain the relationship between BMI and acute psilocybin experiences, as well as BMI and long-term psychological outcomes. Given that no strong hypotheses could be made based on current literature, we employed a combination of frequentist and Bayesian hypothesis testing for all analyses to enable conclusions to be drawn regarding both the presence and absence of effect (i.e. support for or against the null) (Mulder and Wagenmakers, 2016).

# Materials and methods

#### Studies

Three studies were included in the current analysis. Two of the studies were clinical studies: an open-label study in treatmentresistant unipolar depression (depression open-label (D-OL)) and a randomized control trial (RCT) in moderate-severe unipolar depression (depression RCT; D-RCT). The third study was in psychedelic-naïve (i.e. had never taken a psychedelic drug) healthy volunteers (HVs). All trials received favourable opinion from the National Research Ethics Service and were sponsored by Imperial College London's Joint Research and Compliance Office. The two clinical studies were adopted by the National Institute of Health Research (NIHR) Clinical Research Network and reviewed and approved by the Medicines and Healthcare products Regulatory Agency. All study sessions for all studies took place at the NIHR-funded Imperial College Research Facility.

#### Participants

All participants provided written informed consent after being provided with a complete description of the relevant study and before taking part. For all studies, inclusion criteria included an age range of 18–85 years and physically healthy (determined via physical examination). Primary exclusion criteria included past or present diagnosis of a psychotic disorder, immediate family member with a psychotic disorder, MRI contraindications, positive pregnancy test at screening or during the study and excessive alcohol or drug use (for further study-specific criteria, refer to relevant publications). With the exception of one participant in D-OL, all participants in the two depression trials withdrew from serotonergic medication prior to starting the trial.

#### Procedure

*Dose.* For consistency, the current analysis focuses on the 25 mg dose in all studies. Where more than one 25 mg dose was delivered, the first of these is used. This dose is generally well tolerated and is thought to maximize therapeutic outcomes while having minimal side effects. Across all three studies, no serious adverse events occurred at this dose.

*D-OL trial.* D-OL was an open-label feasibility trial of psilocybin-assisted psychotherapy for treatment-resistant depression (ISRCTN registration number ISRCTN14426797). Twenty participants (six females) received two oral doses of psilocybin (10 mg followed by 25 mg) 1 week apart. Psilocybin was obtained from THC Pharm (Frankfurt, Germany) and formulated into the investigational medicinal product (5 mg psilocybin in size 0 capsules) by Guy's and St. Thomas' Hospital's Pharmacy Manufacturing Unit (London, UK). For details on full trial procedures, refer to Carhart-Harris et al., (2016).

*D-RCT.* D-RCT compared psilocybin to the selective serotonin reuptake inhibitor escitalopram (NCT03429075). Fifty-nine participants received two oral doses of psilocybin separated by 3 weeks. Thirty participants (11 females) received two 25 mg doses of psilocybin and a 6-week course of placebo, while the remaining 29 (9 females) received two 1 mg doses of psilocybin coupled with a 6-week course of escitalopram. Only participants receiving the 25 mg dose of psilocybin are included in the current analysis as the coupling of the 1 mg dose with escitalopram would confound the analysis. Psilocybin (COMP360) was supplied by Compass Pathways. Manufacture was performed by Onyx and encapsulation was performed by Catalent (formerly Juniper) pharmaceuticals. Bottling and labelling were performed by Fisher pharmaceuticals. For full trial details, refer to Carhart-Harris et al., (2021).

*HV trial.* The HV study assessed long-term psychological and brain changes following a 25 mg dose of psilocybin in psychedelicnaïve individuals (Lyons, 2020). One month prior, all participants also received a low dose (1 mg) but were blind to the dosing schedule. A total of 28 participants (13 females) completed this study. Psilocybin supply was identical to D-RCT.

*Psychological support.* Given the role of extra-pharmacological factors in shaping the acute experience (and our psychological indices thereof) (Carhart-Harris et al., 2018), and important emphasis was placed upon the 'set and setting' of all dosing sessions. Across all studies, each participant was paired with two experienced guides/sitters who provided psychological support. Dosing days took place in a therapeutic environment and were enveloped by psychological preparation (becoming acquainted with the participant, building trust and discussing what to expect from the experience) and integration (non-judgemental, compassionate listening to the participants' experience, aiding their ability to contextualize and assimilate it).

During dosing, participants were encouraged to recline in a semi-supine position and were provided with an eye mask and headphones. The music playlist was specially designed to map onto the psychedelic experience and participants were encouraged to go on an inward journey while they were supported by the presence of the two guides.

# Measures

*Demographics and BMI.* Demographic information was collected at the screening visit for each study including age, sex, height and weight. BMI was calculated for all participants using the formula weight (kg)/height (m)<sup>2</sup>.

ASC questionnaire. The altered states of consciousness (ASC) questionnaire is the most widely used measure of altered states of

consciousness (particularly in the psychedelic state (Dittrich, 1998; Studerus et al., 2010)) and was included in all three studies

1998; Studerus et al., 2010)) and was included in all three studies discussed here. The ASC can be parcellated into either 5 (5D-ASC, from 94 questions) or 11 (11D-ASC, from 42 questions) factors (Dittrich, 1998; Studerus, Gamma, & Vollenweider, 2010). Each item is measured on visual analogue scales from 0 ('not more than usual') to 100 ('much more than usual'). Averages are calculated for total and subscale scores.

Consistent with Roseman et al. (2018), we utilized the 42-item version of the ASC which only indexes three of the five dimensions defined by the 5D-ASC: oceanic boundlessness (OBN), dread of ego dissolution (DED) and visionary restructuralization (VRS). The OBN subscale indexes the 'mystical type' experience - that has been deemed important in predicting long-term psychological gains following a psychedelic experience (Erritzoe et al., 2018; Griffiths et al., 2008; Roseman et al., 2018; Ross et al., 2016). Within the OBN factor are five of the 11D-ASC subfactors: 'insightfulness', 'blissful state', 'experience of unity', 'spiritual experience' and 'disembodiment'. DED assesses the negative aspects of the experience and encompasses the 11D subscales of 'anxiety' and 'impaired control or cognition'. VRS refers to perceptual distortions and encompasses the 11D subscales of 'complex imagery', 'elementary imagery', 'audio/visual synaesthesia' and 'changed meaning of percepts'. By focusing on these three factors, we explored the association between BMI and mystical, challenging and perceptual experiences (the pillars of a psychedelic experience), while avoiding the additional computational load of the final two sub-factors of the 5D-ASC ('auditory alterations' and 'reduction of vigilance') which are not central to the altered states induced via classic psychedelics (Studerus et al., 2010).

*Emotional breakthrough inventory.* The emotional breakthrough inventory (EBI) is a recently validated measure of emotional release/breakthrough experienced during the acute psychedelic state (Roseman et al., 2019; Spriggs et al., 2020). The EBI consists of six statements: 'I faced emotionally difficult feelings that I usually push aside', 'I experienced a resolution of personal conflict/trauma', 'I felt able to explore challenging emotions and memories', 'I had an emotional breakthrough', 'I was able to get a sense of closure on an emotional problem' and 'I achieved an emotional release followed by a sense of relief'. Each statement is designed to reflect aspects of overcoming emotions through the psychedelic experience. The EBI was only included in the D-RCT and HV studies and was run at the end of the dosing day (i.e. alongside the ASC) in reference to the acute experience.

*Warwick-Edinburgh Mental Well-being Scale.* The Warwick-Edinburgh Mental Well-being Scale (WEMWBS) is a validated 14-item scale designed to measure both the hedonic (i.e. subjective experience of happiness) and the eudaemonic (i.e. psychological functioning) aspects of positive mental health, or well-being (Tennant et al., 2007). Each item is a positive statement that participants rate on a 5-point Likert-type scale from 'none of the time' to 'all of the time' in reference to the previous 2 weeks. Higher scores represent greater well-being, with a maximum score of 70. The WEMWBS was included within the 10 days before and exactly 2 weeks after the dosing day in question in the D-RCT and HV studies.

#### Analysis

The analyses performed here were conceived of *post hoc* and were not part of an *a priori* statistical analysis plan for any of the studies and neither were they specifically approved *a priori* by an ethics committee. However, such *post hoc* analyses are commonplace in clinical research where new questions naturally arise that warrant addressing. As is standard, ethics approval does not adjudicate on such *post hoc* analyses, but simply ask that good practice be maintained in data management and protection and all other relevant aspects of clinical research. In accordance with Imperial College guidelines, all participants across studies consented to their research data being stored and analysed by researchers at Imperial College London.

*Frequentist analyses.* Preliminary analyses were conducted to assess for differences in age, sex and BMI between the studies, and for a relationship between demographics and BMI. Data were then pooled across studies for subsequent analysis. Linear regressions were used to assess BMI as a predictor of both the acute psychedelic experience (ASC and EBI) and psychological outcomes (WEMWBS). Age (mean-centred), sex and study were included as control variables in all analyses, with baseline WEM-WBS also added as a control variable in the WEMWBS analysis (a=0.05; two tailed).

*Bayesian analyses.* To complement these frequentist analyses, Bayes Factors (BFs) were also computed for linear regressions and, where appropriate, follow-up *t*-tests. BFs represent the relative evidence for one model over another, conditioned on the observed data. Bayesian linear regressions were performed, including the covariates age (mean-centred), sex and study. For prediction of the ASC and EBI, two alternative models were defined and compared to the null ( $M_0$ ):  $M_1$  did not include BMI ( $M_1$ : Age, Sex, Study), while  $M_2$  did ( $M_2$ : Age, Sex, Study, BMI). Two BFs are therefore presented for each analysis: the first assesses the relative evidence for all covariates of the full model as compared to the null model (BF<sub>02</sub>). The second directly compares the two alternative models and therefore establishes the relative evidence for the single covariate BMI (BF<sub>12</sub>).

To assess BMI as a predictor of well-being, three models were compared, all of which included age, sex, study and baseline WEMWBS as covariates:  $M_1$  additionally included BMI,  $M_2$  additionally included EBI or ASC-OBN and  $M_3$  included both BMI and either EBI or ASC-OBN. BFs were computed to assess the relative evidence of  $M_3$  versus models that did not include either BMI (BF<sub>32</sub>) or EBI/ASC-OBN (BF<sub>31</sub>).

We provide the following guidelines for the interpretation of BF values. The further a BF value is from 1, the stronger the evidence for either the model of interest (BF > 1) or the competing model (BF < 1). Typically, a BF value that is >3 is regarded as strong evidence when comparing an alternative to null; however, lower thresholds are accepted when comparing alternative models (Mulder et al., 2009). As decimal-place BFs are more challenging to interpret, we present BFs as >1 where possible, for example, when model evidence most consistently supports the null, we present BF<sub>01</sub> > 1, rather than BF<sub>10</sub> > 1. This does not change the statistical value, and this is purely for ease of interpretation (Rouder and Morey, 2012). All analyses were performed



**Figure 1.** BMI in the three studies separately. Violin plots represent the distribution of scores. Black dots and bars represent the mean and standard deviation, respectively, while open circles represent individual participants. BMI: body mass index; D-OL: depression open-label; D-RCT: depression randomized control trial; HV: healthy volunteer.

Table 1. Demographic information for the three studies.

Study	Ν		Age (years)		BMI (kg/m²)		
	Total	Females	M (SD)	Range	<i>M</i> (SD)	Range	
HV	28	13	40.6 (8.7)	28–59	24.0 (5.0)	16.4-41.3	
D-RCT	30	11	43.3 (11.7)	21-64	26.4 (4.6)	17.7-37.1	
D-OL	19	6	44.7 (10.9)	27-64	26.4 (4.3)	18.3-36.4	
Total	77	30	42.7 (10.5)	21-64	25.6 (4.7)	16.4-41.3	

BMI: body mass index; D-OL: depression open-label; D-RCT: depression randomized control trial; HV: healthy volunteer.

using default JSZ priors (Rouder et al., 2009) in R Studio (https://rstudio.com/) using the BayesFactor package (Morey et al., 2015). Plots were generated using ggplot2 (Wickham, 2009).

# Results

#### Demographics and BMI

Demographic data for the three studies are presented in Table 1. There were no significant differences between studies in age  $(F_{(2,74)}=0.95, p=0.393)$  and sex  $(\chi^2_{(2,N=77)}=1.15, p=0.560)$ , and there was no significant differences in BMI between the studies  $(F_{(2,74)}=2.386, p=0.099)$ ; Figure 1). Across the three studies, there was no significant relationship between age and BMI  $(r_{75}=0.19, p=0.104)$ ; however, females had significantly lower BMIs than males (female M (SD) = 24.1 kg/m<sup>2</sup> (4.8 kg/m<sup>2</sup>); male M (SD)=26.5 kg/m<sup>2</sup> (4.36 kg/m<sup>2</sup>);  $t_{(57,58)}=2.241, p=0.03)$ . Age, sex and study were used as covariates in all analyses.



Figure 2. Scatter plots of the relationship between BMI and the ASC subscales of (a) OBN, (b) DED, and (c) VRS as well as (d) total ASC score. DED: dread of ego dissolution; OBN: oceanic boundlessness; VRS: visual restructuralization; BMI: body mass index; ASC: altered states of consciousness.

All three studies were included in analyses on ASC (total N=77); however, EBI and WEMWBS were only included in D-RCT and HV with some drop-out seen in the collection of WEMWBS at follow-up (EBI analysis N=56; WEMWBS analysis N=51).

# BMI as a predictor of acute experience

Altered states of consciousness. The results of the linear regressions used to assess whether BMI predicts the intensity of

the acute experience (indexed with the ASC), while controlling for age, sex and study, are presented in Table 2 and Figure 2. The results of frequentist analyses were non-significant for the total ASC and the three subscales (OBN, DED and VRS), with the DED subscale showing a marginal effect (p=0.076). The BFs comparing the full alternative M<sub>2</sub> to the null M<sub>0</sub> all provided strong evidence towards the null, with the exception of DED where the evidence was low/anecdotal towards the alternative. When comparing the two alternative models, the model without BMI as a predictor (M<sub>1</sub>) was favoured in all cases except for DED, where the evidence was inconclusive.

Acute scale	Frequentis	Bayesian*			
	В	95% CI	р	BF02	BF12
ASC-OBN	0.30	-1.20, 1.81	0.689	39.63	2.82
ASC-DED	-1.07	-2.25, 0.12	0.076	0.38	0.69
ASC-VRS	0.40	-0.90, 1.70	0.538	3.63	2.35
ASC total	-0.09	-1.20, 1.01	0.87	5.83	2.66
EBI	-0.11	-1.79, 2.02	0.904	30.91	2.60

 Table 2. Results of linear regressions assessing BMI as a predictor of ASC and EBI controlling for age, sex and study.

ASC, N=77; EBI, N=56.

ASC: altered states of consciousness; BF: Bayes Factor; BMI: body mass index; DED: dread of ego dissolution; OBN: oceanic boundlessness; VRS: visionary restructuralization; EBI: emotional breakthrough inventory.

Mo: null model.

 $M_1$ : Age + Sex + Study.

M<sub>2</sub>: Age + Sex + Study + BMI.

<sup>\*</sup>While BFs are commonly presented as evidence for the alternative relative to the null, here we presented evidence for the null relative to the alternative ( $BF_{01}$  and  $BF_{12}$ ) because BF > 1 are easier to interpret than BF < 1 (Rouder and Morey, 2012).



**Figure 3.** DED across the three studies separately. Violin plots represent the distribution of scores. Black dots and bars represent the mean and standard deviation, respectively, while open circles represent individual participants. DED: dread of ego dissolution.

To further explore the low/anecdotal evidence for  $M_2$  predicting DED, three additional models were defined to determine the contribution of the three other predictors to the full model. Specifically, these three models removed each of the predictors one-by-one for comparison with the full model ( $M_3$ =Sex, Study, BMI;  $M_4$ =Age, Study, BMI;  $M_5$ =Age, Sex, BMI). Evidence was inconclusive for the predictor age (BF<sub>23</sub>=1.08), was strong *against* sex as a predictor (BF<sub>24</sub>=3.83) and was strong *for* study as a predictor (BF<sub>52</sub>=3.902). Additional Bayesian *t*-tests (default JSZ priors) were performed to determine evidence for differences between the studies. Here, there was strong support *for* a difference in DED between D-RCT and HV (BF=22.07), moderate evidence *against* a difference between HV and D-OL (BF=0.36) and inconclusive evidence for a difference between the two depression trials (BF=1.76) (Figure 3). These differences are driven by overall lower DED in D-RCT. To summarize, these analyses indicate that study is the strongest predictor driving the evidence for  $M_2$  over the null in predicting DED.

*Emotional breakthrough inventory.* The results of the linear regressions used to assess whether BMI predicts emotional breakthrough (EBI) are presented in Table 2 and Figure 4(a). The frequentist linear regression assessing BMI as a predictor of EBI and controlling for age, sex and study was not significant (p=0.904). Additionally, the Bayesian regression provided very strong evidence towards the null model (BF<sub>02</sub>=30.91), and moderate evidence against the inclusion of BMI (BF<sub>12</sub>=2.60).

# BMI as a predictor of psychological outcome

BMI was found to be a non-significant predictor of WEMWBS in a linear regression controlling for age, sex, study and baseline WEMWBS (b=0.27 95%CI [-0.28, 0.82], p=0.325; Figure 4(b)). Furthermore, when comparing models without (M<sub>1</sub>) and with (M<sub>2</sub>) BMI as a predictor, the BF analysis revealed moderate evidence against BMI as a predictor (BF<sub>12</sub>=2.051).

A final set of regressions were computed on WEMWBS scores that also included EBI or ASC-OBN as predictors. A frequentist regression including BMI and ASC-OBN as predictors demonstrated that the ASC-OBN significantly predicted improvements in WEMWBS (b=0.10 95%CI [0.03, 0.18], p=0.009), while BMI did not (b=0.29 95%CI [-0.22, 0.81], p=0.258). Similarly, a regression including BMI and EBI as predictors demonstrated that EBI predicted improved WEMWBS (b=0.10 95%CI [0.03, 0.18], p=0.005), while BMI did not (b=-0.3195%CI [-0.2, 0.82], p=0.221). For each regression, BFs were computed to assess the relative evidence of each predictor of interest against a full model including all covariates (M<sub>3</sub>). This demonstrated strong evidence for ASC-OBN as a predictor of WEMWBS (BF<sub>31</sub>=6.50) and weak evidence against BMI  $(BF_{23}=1.85)$ . Similarly, strong evidence was demonstrated for EBI (BF<sub>31</sub>=8.95) while weak evidence was provided against BMI (BF<sub>23</sub>=1.86).

# Discussion

The aim of the current study was to investigate whether BMI predicts acute and long-term effects of a fixed dose of psilocybin administered in a supportive setting. Data were pooled across three trials conducted at the Centre for Psychedelic Research, Imperial College London, totalling 77 individuals receiving a 25 mg dose of psilocybin. When controlling for age, sex, and study, evidence supported the null hypothesis that BMI does not predict overall intensity of the altered state (total ASC), mystical-type experiences (ASC-OBN), perceptual changes (ASC-VRS) or emotional breakthroughs (EBI) during the acute experience. There was weak, nonsignificant evidence for greater dread of ego dissolution (ASC-DED) in participants with lower BMI, however, further analysis provided no evidence for BMI meaningfully contributing



Figure 4. Scatter plots of the relationship between BMI and (a) EBI and (b) WEMWBS 2-weeks post-high dose. BMI: body mass index; EBI: emotional breakthrough inventory

to the combination of the other covariates (age, sex and study) in predicting ASC-DED. Finally, while both greater mystical-type experiences and emotional breakthroughs were strong predictors of greater improvements in well-being, BMI was not. Overall, this is – to the best of our knowledge – the first demonstration that BMI does not predict long-term, as well as acute effects of a fixed dose of psilocybin (but see Studerus et al., (2011) and Garcia-Romeu et al. (2021) for an exploration using weightadjusted doses). By employing Bayesian hypothesis testing, we were able to conclude that this largely reflects *evidence of absence*, rather than an *absence of evidence*.

The present study also expands upon the results of previous studies (Garcia-Romeu et al., 2021; Studerus et al., 2011) by providing the first pooled analysis across studies employing a fixed dose of psilocybin. While body weight-adjusted dosing is currently regarded as a 'gold-standard' in research, there has been increasing recognition that body weight may not provide a sufficient measure of body composition when adjusting dosing (Green and Duffull, 2004; Morrish et al., 2011). Additionally, it adds practical and financial complexity to standardization, validation and large-scale distribution (Brown et al., 2017), which in turn significantly impacts the feasibility of large-scale rollout of psychedelic-assisted therapy. Having a fixed dose could significantly simplify the design and logistics of numerous future clinical studies, particularly in clinical trials where BMI is a feature of the target population, such as psilocybin-assisted psychotherapy in anorexia nervosa. Such trials are currently underway with more planned for the future (NCT04505189; NCT04052568; NCT04661514) (Foldi et al., 2020; Spriggs et al., 2021).

To assess the quality of the acute experience, this study used the ASC (the most widely used subjective index of altered states), with a focus on three of its subscales that are central to the psychedelic experience (Studerus et al., 2010), namely: mystical experiences (ASC-OBN), negative experiences (ASC-DED) and perceptual changes (ASC-VRN). The OBN subscale has been a particular focus of psychedelic research as greater mystical-type experiences have been associated with greater long-term mental health outcomes from psychedelic therapy (Erritzoe et al., 2018; Griffiths et al., 2008; Roseman et al., 2018; Ross et al., 2016). Recent evidence also points towards a distinct component of the acute experience, namely emotional breakthrough, as an additional key mediator of long-term outcome (Roseman et al., 2019; Spriggs et al., 2020). Across our pooled dataset, scores of mystical-type experience and emotional breakthrough within the trial setting predicted long-term increases in well-being. Importantly however, BMI did not predict scores of mystical-type experience, emotion breakthrough or long-term changes in well-being when using a fixed dose within a therapeutic environment.

While the evidence supported the full model over the null in predicting DED, the contribution of BMI to the combination of the other covariates (age, sex and study) was equivocal. To further explore this trend, the independent contribution of each covariate was assessed, and study was the only covariate with strong evidence towards inclusion in the model. There was strong evidence for lower DED in D-RCT than HV and moderate evidence for no difference between D-OL and HV. One possibility for this effect of study is the setting, where the setting for HV was more scientifically focused (e.g., with electroencephalography recording in-session) than therapeutic in nature. Previous work has found brain imaging to be a predictor of more challenging experiences under psychedelics (Studerus et al., 2011). Another possibility is differential therapeutic alliance across studies. Challenging experiences have previously been associated with a weaker therapeutic relationship (Haijen et al., 2018; Kettner et al., 2021; Stauffer et al., 2020) and a separate analysis performed on data from the D-RCT supports therapeutic alliance as a predictor of acute experience and long-term outcomes (Murphy et al., 2022). Interestingly, although females had significantly lower BMI on average than males, there was strong evidence against sex as a predictor of DED. One recent study found a trend towards females having greater challenging experiences than males with approximately 25 mg psilocybin (Garcia-Romeu et al., 2021). From a constructionist perspective, this may reflect a greater likelihood for women versus men to report challenging experiences – for example, due to cultural gender norms (McLean and Anderson, 2009).

In positron emission tomography (PET) studies, BMI has been found to positively correlate with 5-HT<sub>2A</sub> receptor binding in the superior temporal cortex, medial inferior temporal, right DLPFC and right sensory motor cortex (Adams et al., 2004; Erritzoe et al., 2009). One PET study using a displacement paradigm with psilocybin as the 'cold' displacing ligand - recently found a positive relationship between the subjective intensity and the corresponding percentage occupancy of  $5\text{-HT}_{2A}$  receptors achieved by a range of psilocybin dosages - that is, greater intensity was associated with greater 5-HT<sub>2A</sub> receptor occupancy (Madsen et al., 2019). Pooling across this and one additional PET study (N=16), Stenbæk et al. (2020) further demonstrated how lower pre-drug 5-HT<sub>2A</sub> receptor binding was associated with greater mystical-type experience, longer peak duration and a more rapid offset of subjective drug effects post-peak. As well as these pharmacological factors, one should also consider how non-pharmacological, contextual factors could impinge on the experience felt and reported (Carhart-Harris et al., 2018; Haijen et al., 2018; Hartogsohn, 2016, 2017; Kettner et al., 2021; Mediano et al., 2020; Studerus et al., 2011). While the current results provide strong evidence against BMI as a predictor of acute psychedelic experience or long-term outcome, it may be important for future PET studies to elaborate on this further.

It is worth highlighting here the insights offered by Bayesian statistics that would not be provided by frequentist approaches alone (Mulder and Wagenmakers, 2016; Wagenmakers et al., 2018). A BF is a quantification of the relative evidence that the data provide for two competing hypotheses, thus, it allows for conclusions to be made about the relative evidence for or against the null hypothesis. As such, we are able to draw conclusions on the evidence of absence, rather than mere absence of evidence as would be the case using purely frequentists approaches. Additionally, the BF is a meaningful index of relative evidence, where, for example,  $BF_{01}=4$ , means that the data are four times more likely under the null hypothesis. Frequentist statistics, in contrast, provide a dichotomous outcome of 'significance' based on a (somewhat arbitrary) p value of 0.05. Finally, as opposed to frequentist statistics, a BF does not depend on the sampling plan, or on a hypothetical data set that has not been observed. This is relevant for the post hoc pooling that was employed here.

There are a few notable limitations of the current study. Firstly, 15 participants in the current analysis fell within the obese weight range (BMI  $> 29.9 \text{ kg/m}^2$ ) but only three participants were classified as underweight (BMI  $< 18.5 \text{ kg/m}^2$ ), precluding any comparison of the extreme tails of the cohort. Secondly, the absence of pharmacokinetic measures in this study precluded the measurement of drug concentration changes or the

relationship between pharmacokinetic processes and the observed effects. Third, we only analysed data from 25 mg dosing sessions and so it is unclear how these findings would translate to other doses of psilocybin, or indeed other psychedelic drugs or mixtures (such as ayahuasca). Finally, while all data correspond to a participant's first 25 mg dose, the three studies had slightly different designs, meaning that there is some variation in prior experience between participants. We did, however, control for 'study' as a covariate.

To conclude, this paper provides the clearest demonstration to-date that the acute psychedelic experience and long-term psychological outcome from a fixed 25 mg dose of psilocybin is not predicted by BMI. This discovery has important implications, not only for our understanding of pharmacological and extra-pharmacological contributors to the psychedelic experience, but also to the large-scale roll-out of psychedelic-assisted therapy. Future studies are required to explore this matter further in more wide-ranging populations, and with different doses and psychedelics.

#### **Declaration of conflicting interests**

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