Flicker light stimulation induces thalamocortical hyperconnectivity with LGN and higher-order thalamic nuclei

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Keywords: visual hallucinations, flicker light stimulation, altered states of consciousness, thalamocortical connectivity, thalamic nuclei, functional connectivity, visual hierarchy

1 Highlights

- Flicker light stimulation (FLS) induces thalamocortical hyperconnectivity between the
 first-order thalamic LGN and early visual cortices, likely due to entrainment.
 Thalamocortical connectivity between LGN and upstream visual areas, but not V1, is
 associated with the intensity of visual hallucinations.
 Thalamocortical connectivity changes with higher-order thalamic nuclei, such as
- 7 anterior and mediodorsal nuclei, show strongest modulation by flicker frequency,
- 8 which corresponds to the intensity of visual hallucinations.
- 9

10 Abstract

11 The thalamus is primarily known as a relay for sensory information; however, it also critically 12 contributes to higher-order cortical processing and coordination. Thalamocortical 13 hyperconnectivity is associated with hallucinatory phenomena that occur in various 14 psychopathologies (e.g., psychosis, migraine aura) and altered states of consciousness (ASC, 15 e.g., induced by psychedelic drugs). However, the exact functional contribution of 16 thalamocortical hyperconnectivity in forming hallucinatory experiences is unclear. Flicker 17 light stimulation (FLS) can be used as an experimental tool to induce transient visual 18 hallucinatory phenomena in healthy participants. Here, we use FLS in combination with fMRI 19 to test how FLS modulates thalamocortical connectivity between specific thalamic nuclei and 20 visual areas. We show that FLS induces thalamocortical hyperconnectivity between LGN, early 21 visual areas and proximal upstream areas of ventral and dorsal visual streams (e.g., hV4, VO1, 22 V3a). Further, an exploratory analysis indicates specific higher-order thalamic nuclei, such as 23 anterior and mediodorsal nuclei, to be strongly affected by FLS. Here, the connectivity 24 changes to upstream cortical visual areas directly reflect a frequency-dependent increase in 25 experienced visual phenomena. Together these findings contribute to the identification of 26 specific thalamocortical interactions in the emergence of visual hallucinations.

27 Introduction

28 The functional role of the thalamus goes beyond a relay for sensory information to the cortex. 29 Indeed, no more than 20% of thalamic volume are primary sensory nuclei (Hádinger et al., 30 2023; Rovó et al., 2012). With complex connectivity throughout the neocortex, the thalamus 31 contributes to higher-order processing, cognition and is also thought to coordinate 32 information availability across cortices (Halassa and Sherman, 2019; Sherman and Guillery, 33 2006). Correspondingly, thalamocortical hyperconnectivity has been related to various 34 pathologies, such as psychosis (Avram et al., 2021; Ramsay, 2019), epilepsy (Chen et al., 2021; 35 Kim et al., 2014) and migraine (Bolay, 2020; Martinelli et al., 2021; Tu et al., 2019), and during 36 diverse altered states of consciousness (ASC; e.g., induced by psychoactive drugs (Carhart-37 Harris et al., 2016; Müller et al., 2017; Preller et al., 2019)), all of which involve hallucinatory 38 experiences (consider also (Hirschfeld et al., 2023; Hirschfeld and Schmidt, 2021; Prugger et 39 al., 2022; Schmidt and Majić, 2017)). However, the exact functional contributions of 40 thalamocortical hyperconnectivity to the emergence of hallucinatory phenomena is unclear. 41 Previous reports are limited in the specificity of distinct thalamic nuclei contributions. Here, 42 we utilize flicker light stimulation (FLS) in combination with fMRI to induce transient visual 43 hallucinations in healthy participants and test for the differential modulation of functional 44 connectivity between thalamic nuclei and visual areas.

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46 The neural mechanisms of visual hallucinations are difficult to investigate empirically as their 47 involvement in pathologies are spontaneous and co-exist with other neurophysiologic 48 symptoms (Rogers et al., 2021). This makes it important to identify an experimental tool that 49 can selectively induce visual hallucinatory phenomena in healthy participants. FLS applies 50 stroboscopic light, primarily at alpha frequency (8-12 Hz), over closed eyes to elicit visual 51 hallucinatory perception within seconds of stimulus onset. FLS-induced hallucinations include 52 the perception of simple geometric patterns, motion and colours (Allefeld et al., 2011; Amaya 53 et al., 2023; Bartossek et al., 2021; Montgomery et al., 2023), which hold close similarity to 54 the content of visual hallucinations reported in migraine (Cowan, 2013; Panayiotopoulos, 55 1994; Richards, 1971; Schott, 2007; Wilkinson, 2004), epilepsy (Panayiotopoulos, 1994), psychedelic experiences (Bartossek et al., 2021; Klüver, 1966; Lawrence et al., 2022), and 56 57 Charles Bonnet Syndrome (Ffytche, 2005; Jan and Castillo, 2012). FLS rhythmicity, frequency 58 and brightness can be closely controlled in an experimental setting (Rogers et al., 2021),

59 making it an optimal tool to investigate neural mechanisms of visual hallucinations.

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61 By identifying which thalamic nuclei display altered connectivity with the cortex during visual 62 hallucinations, the functional role of thalamocortical dysconnectivity can be indicated. The 63 lateral geniculate nucleus (LGN) is the first-order thalamic nucleus for visual input and has 64 bidirectional connections with V1. Here, feedforward thalamocortical projections relay visual 65 information from the retina. Feedback corticogeniculate connections modulate activity of the 66 LGN via inhibitory interneurons (Sherman and Guillery, 2006). These pathways determine 67 LGN activity by streaming visual information (e.g., stimulus features (Andolina et al., 2007)) 68 and integrating extra-visual modulations (e.g., attentional (Reinhold et al., 2023)) (see (Briggs, 69 2020) for review). The cortico-striato-thalamo-cortical (CSTC) model proposes that drug- and 70 pathology-induced hallucinations arise from thalamocortical hyperconnectivity (Geyer and 71 Vollenweider, 2008; Preller et al., 2019; Vollenweider and Geyer, 2001). With the perspective 72 of the thalamus as a sensory gate, its contribution to hallucinations is mostly attributed to 73 dysfunctional gating, leading to "sensory flooding" (Geyer and Vollenweider, 2008) and 74 consequent cortical misinterpretation of sensory signals. In line with this suggestion, the LGN 75 was found to have increased connectivity with the occipital cortex in patients with 76 schizophrenia (Anticevic et al., 2014b) and during psychedelic experiences (Müller et al., 77 2018), which may reflect reduced thalamic gating capacities of the LGN to visual information 78 passing to the cortex.

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80 Recently, there has been more attention on the differential roles of first-order and higher-81 order thalamic nuclei in the generation of visual hallucinations (Vollenweider and Preller, 82 2020), which is facilitated by methodological advances allowing for parcellation of thalamic 83 nuclei (Iglehart et al., 2020; Johansen-Berg et al., 2005). Higher-order nuclei do not receive 84 input from sensory organs, instead, they orchestrate cortico-cortical communication and 85 modulate activity of other thalamic nuclei (Sherman, 2016; Sherman and Guillery, 2006). With regards to visual processing, the inferior and lateral pulvinar are a group of higher-order 86 87 nuclei with pronounced bidirectional anatomic connections to V1, V2 and V4 (Gattass et al., 88 2014; Shipp, 2003; Soares et al., 2001), contributing to visual processing and attention (Adams 89 et al., 2000; Benevento and Rezak, 1976; Gattass et al., 2017; Guedj and Vuilleumier, 2020;

Kaas and Lyon, 2007; Saalmann et al., 2012). They are associated with the generation of hallucinatory phenomena as they show a reduction in volume, neuronal number, and neuronal size in individuals with schizophrenia (Byne et al., 2002; Danos et al., 2003) and dementia with Lewy Bodies (symptoms includes visual hallucination) (Erskine et al., 2017). In sum, the inferior and lateral pulvinar are candidate higher-order thalamic nuclei to contribute to the emergence of FLS-induced visual hallucinatory phenomena.

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97 When aiming to identify the functional role of thalamocortical interactions in the emergence 98 of visual hallucinations, it is relevant to test for differential contributions of visual stream 99 areas with regards to their hierarchical organization. The visual cortex comprises of early 100 visual cortices (EVC: V1-V3), which are typically defined by their retinotopic representation of 101 the visual field (Engel et al., 1997; Sereno et al., 1995), and upstream visual areas, which show 102 less pronounced retinotopy and are commonly described by their selective response to 103 specific features of visual input, such as the activation preference for motion (hMT/V5; (Zeki 104 et al., 1991)), shape (hV4/LO2; (Grill-Spector et al., 1998; Malach et al., 1995; Silson et al., 105 2013)), colour (hV4/VO1; (Persichetti et al., 2015)) and orientation (LO1; (Silson et al., 2013)). 106 One previous EEG study indicated an increase in V4 activity during FLS (Ffytche, 2008), which 107 may relate to the increased intensity of subjective experience of seeing shapes and colours. 108 However, it is likely that altered processing in multiple visual areas relates to FLS-induced 109 effects and the exact functional contributions of cortical areas along the visual hierarchy has 110 not yet been reported.

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112 In this study, we test whether FLS-induced visual hallucinations relate to altered 113 thalamocortical connectivity, and which thalamic nuclei and visual areas are primarily 114 modulated. We use constant light, 3 Hz FLS and 10 Hz FLS, expecting that 10 Hz FLS will induce 115 stronger visual hallucinatory phenomena than 3 Hz FLS and constant light, as previously 116 reported (See (Amaya et al., 2023; Bartossek et al., 2021)). We acquired resting state fMRI 117 data and use the Automated Anatomical Labelling Atlas 3 (AAL3; (Rolls et al., 2020)) for 118 thalamus parcellation and a volume-based maximum probability map (MPM) of visual 119 topography (Wang et al., 2015) for parcellation of visual areas. We hypothesise that LGN will 120 show hyperconnectivity with EVC for 3 Hz and 10 Hz FLS, as they receive excitatory signals 121 from the retina and therefore synchronise to the periodic visual stimulus. For higher-order

122 visual regions, as well as higher-order thalamic nuclei (e.g., inferior and lateral pulvinar), we

123 expect to find parametric modulation of connectivity by the experimental conditions, such

124 that constant light will induce hypoconnectivity, as found in previous work (Schmidt et al.,

125 2020), and FLS will induce frequency-dependent increases in connectivity, whereby 10 Hz

126 produces the strongest coupling. Thereby, changes in connectivity should resemble the

127 intensity of subjective hallucination experience.

128 Methods

129 Participants

130 Twenty-four German speakers with no history of psychiatric or neurological disorders 131 participated in the experiment (14 female; age range 20-41 years, mean (M) = 132 28 years standard deviation (SD) = 5.7 years). All participants were right-handed according to 133 the Edinburgh Handedness Inventory (Oldfield, 1971) (mean laterality quotient = 77.1). Social 134 media and student mailing lists were used for recruitment. Participants were informed about 135 the study aims and background, such as possible risks of FLS, before giving written consent. 136 The study was approved by the ethics committee of the Charité Universitätsmedizin Berlin 137 (application number: EA4/143/18). All procedures were consistent with the guidelines 138 included in the "Declaration of Helsinki – Ethical Principles for Medical Research Involving 139 Human Subjects".

140 Flicker light stimulation

141 For presentation of the light stimulation, we used the light device Lucia N°03 (Light 142 Attendance GmbH, Innsbruck, Austria), which has been developed to evoke hypnagogic visual 143 impressions by intermittent light stimulation. It is equipped with one halogen lamp that is 144 used for constant light stimulation and eight LEDs to apply FLS with high precision in timing 145 and luminance via a programmable interface. Three light stimulation conditions were used: 146 (1) Constant light stimulation at full intensity through a halogen lamp; (2) 3 Hz; and (3) 10 Hz 147 FLS as 50% ON/ 50% OFF times with LED light at maximum intensity, as previously applied 148 (Bartossek et al., 2021; Schwartzman et al., 2019). To apply light stimulation inside the fMRI 149 scanner, the light device was mounted on an aluminium stand close to the end of the gantry 150 at 150 ± 2cm from the participants' eyes. To make the light stimulation comparable to a 151 previous phenomenological study, where the lamp was positioned 50 cm from the 152 participants' eyes (Bartossek et al., 2021), two lenses were introduced into the MRI-mirror 153 system to collect and focus the light [Figure 1A] to deliver approximately the same amount of 154 light to the eyes. To protect the light device from overheating (as the in-built ventilation did 155 not work in the magnetic field), a custom-made air cooling was used that comprised of an 156 industrial vacuum cleaner positioned outside of the shielded MRI room to deliver cold air via 157 extension hose to the light device.



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159 Figure 1. (A) Illustration of the setup inside the MRI scanner. FLS with the Lucia N°03 light 160 device is optimized for stimulation from about 50 cm distance from the face. To obtain the same light intensity of stimulation inside of the scanner, the lamp was positioned at the end 161 162 of the gantry at approximately 150 cm distance from the eyes and lenses were used to focus light onto the eyes to obtain the same amount of light as outside of the scanner. (B) The fMRI 163 164 session comprised five closed-eye resting-state scans. The experimental conditions, constant 165 light, 3 Hz and 10 Hz (15 minutes each) were presented in a randomised order, while the pre 166 and post scans (7 minutes each) consisted of closed-eye rest for baseline measurements. (C) 167 Regions of interest (ROIs) were extracted from AAL3 for thalamus parcellation (Rolls et al., 168 2020) and a volume-based MPM of visual topography (Wang et al., 2015). Thalamic ROIs, as 169 labelled, are anteroventral (AV), lateroposterior (LP), ventrolateral (VL), mediodorsal medial 170 (MDM), anterior pulvinar (PuA), lateral pulvinar (PuL), lateral geniculate nucleus (LGN), medial pulvinar (PuM), inferior pulvinar (PuI), and ventroposterolateral (VPL) nuclei. Additional 171 172 thalamic ROIs not displayed are mediodorsal lateral (MDL), intralaminar (IL), ventroanterior (VA) and medial geniculate nuclei (MGN). Cortical ROIs of visual topography are split into the 173 174 dorsal stream (V1d, V2d, V3d, V3a, V3b, LO1, LO2, hMT), ventral stream (V1v, V2v, V3v, hV4, VO1, VO2, PHC1, PHC2) and parietal stream (IPSO-4, SPL1, FEF). Cortical ROIs not displayed 175 176 are V3b, SPL1 and FEF.

177 Study Design and Procedure

To minimize risk of aversive effects of FLS, all participants underwent a preliminary semistructured video-interview with a psychologist to identify any acute mental disorders, consumption of psychotropic medication and/or pregnancy. Thereafter, participants were screened for indications of photosensitive epilepsy based on electroencephalography (EEG) and were shortly presented FLS of each experimental condition to be familiarized with the procedures and setup. All measurements were conducted at the Center for Cognitive Neuroscience Berlin (CCNB) at the Freie Universität Berlin.

The scanning session comprised of five scans: pre and post scans, each lasting seven minutes and consisting of closed-eye rest in darkness, and three light stimulation scans lasting fifteen minutes each [Figure 1B]. After every scan, the participants were asked six questions about their subjective experiences (see below) and verbally responded via the speaker system of the scanner. An anatomical scan was performed before participants were released from the scanner and experiment.

191 FLS-induced phenomenology

192 Phenomenological aspects of the FLS-induced state were retrospectively assessed using six 193 questions of the Altered States of Consciousness Rating Scale (ASC-R; (Dittrich, 1998)), which 194 were previously identified as most characteristic of the subjective experience (Bartossek et 195 al., 2021). The questions were applied in German, taken from original version of the 5D-ASC 196 (Dittrich, 1998) and participants were asked to rate by verbally naming a value from 0-100% 197 for how much the following statements apply: (1) Ich fühlte mich schläfrig English: I felt sleepy, 198 (2) Ich fühlte mich körperlos English: I had the impression I was out of my body, (3) Wie im 199 Traum waren Raum und Zeitgefühl verändert English: My sense of time and space was altered 200 as if I was dreaming, (4) Ich fühlte mich wie in einer wunderbaren anderen Welt English: I felt 201 I was in a wonderful other world (5) Ich sah regelmäßige Muster, English: I saw regular 202 patterns (Note: In the original version the statement continues as: ... with closed eyes or in 203 complete darkness) (6) Ich sah Farben vor mir English: I saw colors (Note: In the original 204 version the statement continues as: ... with closed eyes or in complete darkness). We ran oneway repeated-measures ANOVAs to test the effect of experimental condition on ASC-R 205 206 questionnaire ratings using the *rstatix* package in Rstudio (v2022.07.2). As distribution of 207 ratings had a tendency for skewedness (e.g., positive skew for pre and post scans), significant 208 ANOVA results were additionally confirmed using non-parametric Kruskal-Wallis testing.

209 **fMRI Scanning**

210 Participants were scanned using a 3T Siemens Tim Trio MRI scanner equipped with a 32-211 channel head coil (Siemens Medical, Erlangen, Germany). For resting-state fMRI images, a 212 T2*-weighted echo planar imaging (EPI) sequence was used (37 axial slices acquired 213 interleaved, in-plane resolution is 3 mm^2 , slice thickness = 3 mm, flip angle (FA) = 70°, 20% gap 214 between slices, repetition time (TR) = 2000 ms, echo time (TE) = 30 ms). A structural image 215 was acquired for each participant using a T1-weighted image acquired with Magnetisation 216 prepared rapid gradient-echo (MPRAGE) sequence (TR = 1900 ms, inversion time = 900 ms, 217 TE = 2.52 ms, FA = 9°, voxel size 1mm³). Head motion was minimized using cushioned supports 218 to restrict movement.

219 MRI data pre-processing

220 Data were pre-processed and analysed using a custom-built resting-state data analysis 221 pipeline within SPM12 (www.fil.ion.ucl.ac.uk/spm/). The anatomical T1-images were 222 normalized to MNI152 space using the segmentation approach, by estimating a nonlinear 223 transformation field, which is then applied to the functional images. Slice time correction and 224 realignment was applied to the functional data before spatial normalisation to MNI152 space 225 using unified segmentation in SPM12, which includes reslicing to an isometric 2 mm voxel size 226 (Ashburner and Friston, 2005). The frame-wise displacement (FD) was calculated for each 227 scan using BRAMILA tools (Power et al., 2012). Volumes that exceeded a threshold of 0.4 mm 228 were masked during following analysis steps ("scrubbing"). Principal component analysis 229 (CompCor) was done using the DPABI toolbox (toolbox for Data Processing & Analysis of Brain 230 Imaging, http://rfmri.org/dpabi) within the CSF/white matter mask on the resting-state data 231 to estimate nuisance signals (Behzadi et al., 2007). Anatomical masks for CSF, white and grey 232 matter were derived from tissue-probability maps provided in SPM12. Smoothing was 233 performed with a 3 mm FWHM Gaussian kernel, to retain high spatial specificity of small ROIs 234 within the thalamus. The first five principal components of the CompCor analysis, six head 235 motion parameters, linear and quadratic trends as well as the global signal were used as 236 nuisance signals to regress out associated variance. The removal of global signal changes has 237 been controversially discussed in resting-state fMRI literature with arguments for and against 238 (see (Murphy and Fox, 2017) for overview). It has been particularly discussed for 239 pharmacological studies (e.g., (Carhart-Harris et al., 2012; Vollenweider and Preller, 2020)), 240 in which changes in blood flow, blood pressure, breathing rate and other physiologic parameters might account for some aspects of ROI-to-ROI correlations. Until conclusive interpretations of such differences are revealed, it is suggested to report data with and without global signal regression (Vollenweider and Preller, 2020). Therefore, we additionally report all analyses without GSR in the Supplement. Finally, the toolbox REST (www.restfmri.net) was used for temporal band-pass filtering (0.01-0.08 Hz).

246 **ROI-to-ROI correlation analysis**

We used the AAL3 (Rolls et al., 2020) to define anatomical ROIs for thalamus parcellation (14 thalamic nuclei for each hemisphere) and a volume-based MPM of visual topography for cortical parcellation (23 visual areas for each hemisphere; see Figure 1C) (Wang et al., 2015). Using probability maps of V1 and V2, overlapping ROIs at the midline were resolved by assigning voxels to the region with highest probability. Of thalamic ROIs, the Reuniens nucleus is only 8mm³ and was not included in our analyses.

253 For each ROI, mean BOLD time courses were extracted and temporal ROI-to-ROI correlations 254 calculated. For all ROI-to-ROI pairs, we averaged the correlation coefficients of pre and post 255 scans and then computed differences with experimental conditions via subtraction of 256 matrices. We took the mean of correlation coefficients for ipsilateral connections (e.g., left 257 LGN and left V1v averaged with right LGN and right V1v) to give one bilateral functional 258 correlation coefficient for each pair of ROIs. Lilliefors test of normality showed that at least 259 90% of ROI-to-ROI correlation coefficients were Gaussian distributed across participants for 260 each condition. Therefore, to test for specific changes within thalamus and visual areas, we 261 ran repeated-measures ANOVAs with condition as a fixed effect and connectivity changes as 262 the dependent variable. We selected 16 visual areas to test: 8 within the ventral stream (V1v, 263 V2v, V3v, hV4, VO1, VO2, PHC1, PHC2) and 8 within the dorsal stream (V1d, V2d, V3d, V3a, 264 V3b, LO1, LO2, hMT), as classified by Wang et al. (2015). We conducted the analyses for LGN, 265 inferior and lateral pulvinar. We Bonferroni-corrected the alpha threshold to .003 (.05/16) to 266 correct for 16 repeated-measures ANOVAs for every thalamic nucleus. When tests were 267 significant, post-hoc t-tests were used to determine the differences between condition 268 groups. Thereafter, we further explored the ROI-to-ROI connectivity matrices of all thalamic and visual ROIs to identify if functional connectivity with any other thalamic nuclei or visual 269 270 areas appeared to be modulated by FLS.

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272 Testing the relationship between subjective experience and connectivity changes

273 To test for the relationship between subjective experience and connectivity changes, we 274 selected ratings of "I saw regular patterns" and "I saw colours" to reflect the intensity of visual 275 phenomena. Using paired t-tests, we tested whether the distribution of ratings between the 276 two items were different for each condition. As these tests were nonsignificant, we took the 277 average of seeing patterns and seeing colours for each participant as the measure for 278 occurrence of visual hallucinations. We subtracted the average of pre and post ratings from 279 those of each experimental condition. From here, we ran linear mixed effects models with 280 change in subjective ratings as a fixed effect and change in functional connectivity as the 281 dependent variable. Participants were included as a random effect. Models with random 282 intercept only had better fit (i.e., lower Akaike Information Criterion values) than random 283 intercept and random slope models, and therefore models were run with random intercepts 284 only. Following our hypotheses, we ran this test for connectivity changes between LGN, 285 inferior pulvinar, lateral pulvinar and 16 visual subregions, thus Bonferroni-correcting the 286 alpha threshold to .003. The analyses were conducted using the Ime4 package in Rstudio 287 (v2022.07.2). Underlying assumptions of linear mixed modelling (e.g., equal variance of 288 residuals, Gaussian-distributed dependent variable) were tested and met.

289 Results

290 **FLS-induced subjective experience**

291 We assessed the subjective experience following each scanning session (including pre/post 292 scans) to test whether reported effects induced by the experimental conditions were 293 comparable to previous findings where FLS was applied outside of the MRI (Amaya et al., 2023; 294 Bartossek et al., 2021). Using ASC-R scores from each session, we ran 5x1 repeated-measures 295 ANOVAs to test the effect of condition on ASC ratings. The results are presented in Figure 2. 296 We found a significant effect of experimental condition on ratings of "I felt I was in a 297 wonderful other world" (F(4, 92) = 9.83, p < .001), "My sense of time and space was altered 298 as if I was dreaming" (F(4, 92) = 7.12, p < .001), and "I had the impression I was out of my 299 body" (F(4, 92) = 5.37, p < .001), where post-hoc paired t-tests revealed that 10 Hz elicited 300 significantly higher ratings than pre and post resting scans (p<.05). Further, there was a 301 significant effect of experimental condition on ratings of "I saw patterns" (F(2.09, 48.03) = 302 104.53, *p* < .001) and "I saw colours" (F(2.2, 50.71) = 88.78, *p* < .001), where post-hoc paired 303 t-tests showed that all experimental conditions were significantly different from each other 304 and 10 Hz generated the highest ratings (p < .001) [Figure 2]. Non-parametric Kruskal-Wallis 305 testing confirmed all ANOVA results (Out of body: H(4) = 14.23, p = .006; Altered time and 306 space: H(4) = 15.88, p = .003; Wonderful other world: H(4) = 16.79, p= .002; Patterns: H(4) = 307 87.61, p<.001; Colours: H(4) = 87.84, p < .001), together showing that FLS inside the MRI 308 scanner robustly induced hallucinatory experiences in all participants, with 10 Hz stimulation 309 eliciting the highest intensity of subjective experience

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311 Changes in functional connectivity between LGN and visual areas

312 We tested for effects of FLS (3 Hz, 10 Hz) and constant light on connectivity changes from 313 baseline between LGN nuclei and 16 visual areas using repeated-measures 3x1 ANOVAs (note 314 that for every participant we averaged connectivity changes across ipsilateral connections; 315 see methods). Alpha is Bonferroni corrected to .003 (.05/16). We found an increase in 316 connectivity strength for 3 Hz and 10 Hz compared to baseline (average of pre and post scans), 317 however 3 Hz and 10 Hz were not different from each other [Figure 3]. Specifically, there was 318 a significant effect of experimental condition on connectivity changes between LGN and V1v 319 (F(2, 46) = 17.75, p < .001), V1d, F(2, 46) = 20.64, p < .001), V2v (F(2, 46) = 26.91, p < .001),320 V2d (F(2,46) = 27.17, p < .001), V3v (F(2,46) = 20.73, p < .001), V3d (F(2,46) = 16.39, p < .001),

which encompasses all early visual areas. In addition, there was a significant effect of experimental condition on connectivity changes with hV4 (F(2, 46) = 13.15, p < .001), VO1 (F(2, 46) = 7.40, p = .002) and V3a (F(2, 46) = 7.85, p = .001), whereby 10 Hz FLS induces the strongest coupling, followed by 3 Hz while constant light induced a weak decoupling.

325

326 Changes in functional connectivity between pulvinar and visual areas

327 Using the same treatment of data as for the LGN, we tested for effects of experimental 328 condition on connectivity changes between inferior and lateral divisions of the pulvinar and 329 16 subregions of the visual cortex. Using repeated-measures 3x1 ANOVAs, we found no 330 significant effects of condition on connectivity changes with inferior pulvinar across all tested 331 visual areas, which is evident in Figure 3. For the lateral pulvinar, a significant effect of 332 condition was revealed for connectivity changes with V1d (F(2,46) = 7.13, p = .002) and V2v 333 (F(2,46) = 7.47, p = .002), whereby post-hoc t-tests showed that 10 Hz and 3 Hz induced 334 stronger coupling than constant light (p < .05) [Figure 3].

335

336 Association of connectivity strength with subjective experience

337 We ran linear mixed models with rating as a fixed effect and participant-specific random 338 intercepts to determine if ASC-R mean ratings of experienced visual effects (i.e., mean of "I 339 saw patterns" and "I saw colours"; see Methods) could predict changes in functional 340 connectivity between ROIs. Alpha was Bonferroni-corrected to .003 to account for the 341 comparison of 16 models for each group (i.e., 16 visual areas for LGN, lateral pulvinar and 342 inferior pulvinar). We found that subjective ratings significantly predicted increases in 343 connectivity between the LGN and V2v (p < .001; $R^2m = 0.15$; $R^2c = 0.46$), V2d (p < .001; R^2m 344 = 0.15; R^2c = 0.44), V3v (p < .001; R^2m = 0.19, R^2c = 0.54), V3d (p < .001; R^2m = 0.26, R^2c = 345 0.59), hV4 (p < .001; R²m = 0.22, R²c = 0.50), VO1 (p = .002; R²m = 0.12, R²c = 0.55), VO2 (p= .001; $R^2m = 0.10$, $R^2c = 0.48$), V3a (p < .001; $R^2m = 0.16$, $R^2c = 0.58$) and V3b (p = .001; R^2m 346 347 = 0.10, R^2c = 0.46). Furthermore, subjective ratings significantly predicted connectivity 348 increases between lateral pulvinar and V1d (p < .001; $R^2m = 0.10$; $R^2c = 0.56$). Together, this 349 shows that the subjective ratings associate moreso with LGN interactions with upstream 350 visual areas beyond V1, while connectivity between V1 and lateral pulvinar are significantly 351 associated with subjective ratings.



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Figure 2. Mean scores of ASC-R items for each experimental condition, indicating no differences on wakefulness across conditions, minor parametric effects on general ASC phenomena and a strong modulation of visual phenomena. Effects tested via one-way repeated-measures ANOVAs; post-hoc paired t-test significance represented by * p<.05, ** p<.01, *** p<.001. Standard error is depicted by error bars.



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360 Figure 3. Effects of FLS on functional connectivity changes compared to baseline (average of 361 pre and post scans) between visual areas and (A) LGN, (B) inferior pulvinar (Pul) and (C) lateral 362 pulvinar (PuL). Visual areas are grouped into ventral and dorsal visual streams, as presented 363 by Wang et al. (2015). Of the repeated-measures ANOVAs that returned significant effects of 364 condition on connectivity change from baseline (alpha = .003), post-hoc paired t-tests indicate 365 differences between conditions, where significance is represented by * p < .05, ** p < .01, ***366 p<.001. There is a strong modulation of condition on connectivity increases between LGN and 367 EVC, and proximal upstream visual areas of dorsal (V3a) and ventral (hV4, VO1) streams. 3 Hz 368 and 10 Hz induce LGN hyperconnectivity to the same degree for EVC, however for higher 369 areas of the dorsal stream (V3a, V3b, LO1), LGN hyperconnectivity is only apparent during 10 370 Hz FLS. There is no significant effect of light stimulation on connectivity changes between 371 inferior pulvinar and visual areas, while lateral pulvinar shows a similar pattern of connectivity 372 changes as LGN with visual areas, albeit less strong.

373 Exploratory analysis of thalamocortical connectivity

374 To explore the whole connectivity profiles of thalamic nuclei, we plotted connectivity 375 matrices with 14 thalamic ROIs from the AAL3 atlas (Rolls et al., 2020) and 23 cortical ROIs 376 from the Wang et al. maximum probability map of visual topography (Wang et al., 2015). 377 Figure 4 displays the ROI-to-ROI correlation coefficients of the experimental conditions 378 subtracted by the averaged pre and post scans, thus showing the connectivity change induced 379 by the conditions. We see strong hyperconnectivity between AV, ventral and MD thalamic 380 nuclei and cortical visual regions. Connectivity with higher-order cortical visual regions, such 381 as hV4, VO1 and LO1, show more frequency-dependent effects (i.e., 10 Hz induces more 382 coupling than 3 Hz) than EVC. We note that, as ventral nuclei (i.e., VA, VPL and VL nuclei) show 383 similar changes in connectivity patterns and have anatomical proximity, we consider their 384 effects collectively as a ventral group. Likewise, MDM and MDL are divisions of MD nuclei 385 showing similar connectivity patterns and are therefore considered together as the MD region. 386 The changes in connectivity induced by 10 Hz FLS are additionally represented in Figure 6.

387

388 Exploratory analysis of visual area and thalamic interconnectivity

389 To explore interconnectivity profiles of visual and thalamic areas, we plotted masked 390 interconnectivity matrices of 23 cortical and 14 thalamic visual ROIs, where only connectivity 391 changes that were significantly different from baseline (alpha = .01) are displayed [Figure 5]. 392 Figure 5A shows that 3 Hz and 10 Hz FLS leads to hyperconnectivity within EVC (i.e., V1-V2) 393 but hypoconnectivity between EVC and higher visual areas of both the ventral (e.g., LO2/1) 394 and dorsal (e.g., V3a/b, IPS) streams. Meanwhile, higher visual areas show increased coupling 395 to each other (e.g., LO2/1 and IPS). Interconnectivity matrices of thalamic ROIs display few 396 changes in connectivity amongst thalamic nuclei, especially at 10 Hz FLS [Figure 5B].

397





399 Figure 4. Connectivity matrices for all visual areas and thalamic nuclei during constant light, 3 400 Hz and 10 Hz FLS, subtracted by the average of pre and post scans (closed-eye rest) to 401 represent the connectivity change induced by the experimental conditions. A mask has been 402 applied where only significant connectivity changes compared to baseline are shown, as 403 determined by paired t-tests (alpha=.01). All divisions of ventral nuclei form a cluster as they 404 display similar connectivity patterns. Likewise, medial and lateral divisions of MD nuclei show 405 similar connectivity patterns and can be collectively considered as the MD region. With this 406 clustering, we observe that AV, ventral and MD thalamic regions display the greatest 407 frequency-dependent effects of FLS on connectivity changes with visual areas, in that 10 Hz 408 induces the strongest coupling that is additionally evident in upstream visual areas of both 409 ventral (e.g., VO2) and dorsal (e.g., hMT, V3a) visual streams. Meanwhile, we see overall 410 hypoconnectivity in the constant light condition.

411



412

413 Figure 5. (A) Connectivity changes between visual areas during constant light, 3 Hz and 10 Hz 414 FLS, as compared pre and post scans. Upper half of matrices show t values of paired t-tests; lower half show connectivity changes (masked at p<.01, where paired t-tests revealed a 415 416 significant difference between connectivity in experimental condition versus baseline). There 417 are two groups of hyperconnectivity: within EVC and between upstream visual areas (e.g., LO1, hMT) and IPS, while these groups are decoupled from each other. (B) Connectivity 418 419 changes within the thalamus. The connectivity changes in the 10 Hz condition are confined to 420 relevant areas (i.e., LGN, AV, ventral and MD nuclei), which supports that the applied 421 parcellation yields region-specific effects. If ROIs were to reflect the same underlying signals, 422 one would expect an overall increase in connectivity between thalamic subfields. Thalamo-423 cortico-thalamic connections likely drive increased LGN connectivity with other thalamic 424 nuclei (i.e., AV, ventral and MD nuclei), such that the signal passes from LGN via visual cortices 425 to higher-order thalamic nuclei.



426

427 Figure 6. Summary of thalamocortical and corticocortical functional connections changes 428 during 10 Hz FLS. Orange lines represent functional hyperconnectivity compared to baseline, 429 while blue dashed lines represent hypoconnectivity. For display purposes, red and orange are 430 used to distinguish between first-order (sensory) and higher-order (non-sensory) thalamic 431 regions. The strength of correlation change is depicted by line thickness. During FLS, the LGN 432 shows connectivity increases to early visual cortices (EVC; V1-V3) and proximal upstream 433 areas of the ventral stream (i.e., hV4, VO1). We found that AV and MD higher-order thalamic 434 nuclei display increased coupling with visual areas along ventral and dorsal visual streams. (Note: ventral nuclei also displayed a comparable connectivity profile, while their 435 436 contributions as higher-order nucleus are less clear). Connectivity changes of higher-order 437 nuclei with ventral areas are notably stronger than LGN coupling. As these nuclei do not 438 receive direct driving retinal inputs, they are most likely driven by inputs from EVC. While the 439 directionality of effects in higher-order regions are speculative, our findings may indicate that 440 AV and MD nuclei take an orchestrating role for information flow across cortical regions, such as eliciting the observed hypoconnectivity between EVC and upstream cortical areas. 441

442 **Discussion**

We tested the effects of FLS on functional connectivity between anatomically specified 443 444 thalamic nuclei and visual areas. We found that FLS induced hyperconnectivity between the 445 LGN and early visual cortices (EVC: V1-V3), independent of flicker frequency. Meanwhile, 446 upstream visual areas show a differential effect of flicker frequency on LGN connectivity, in 447 that coupling was strongest for 10 Hz. Similarly, FLS induced a frequency-dependent increase 448 in participant ratings of visual hallucinations ("I saw colours" and "I saw patterns"), which 449 replicates previous findings (Amaya et al., 2023; Bartossek et al., 2021). The intensity of visual 450 phenomena was associated with the strength of connectivity changes between LGN and 451 higher visual areas, especially for V3 and hV4, suggesting that effects are not only driven by a 452 simple feedforward mechanism from LGN to V1, but rather arise from a modulation of 453 upstream visual areas. FLS additionally induced weak thalamocortical hyperconnectivity with 454 the lateral pulvinar but had no effect on the inferior pulvinar. Hyperconnectivity between 455 lateral pulvinar and V1 was associated with subjective ratings, which may correspond to a 456 top-down modulatory influence of the pulvinar on V1. When exploring connectivity changes 457 across all thalamic nuclei of the AAL3 atlas, we found stronger frequency-dependent 458 modulations of connectivity between AV, ventral and MD thalamic nuclei and visual areas. 459 Moreover, we explored corticocortical connectivity changes between visual areas and 460 observed two groups of hyperconnectivity: (1) within EVC and (2) between upstream visual 461 areas and intraparietal sulcus (IPS), while these groups were decoupled from each other. 462 Overall, we identify that hyperconnectivity between upstream visual areas, LGN and other 463 thalamic regions, such as AV, ventral and MD nuclei, may be most relevant for the emergence 464 of visual hallucinations.

465

466 Thalamocortical connectivity with LGN

FLS significantly increased connectivity between LGN and EVC, hV4, VO1 and V3a. This expected finding supports that rhythmic retinal activation propagate along dorsal (i.e., V3a) and ventral (i.e., hV4, VO1) visual streams. It is likely that driving inputs from the retina cause synchronisation with LGN and subsequent visual areas via excitatory feedforward signalling, which manifests as an increase in functional connectivity, in the sense of entrainment. EEG studies have shown that periodic visual flicker at alpha frequency increases neural entrainment at that frequency (Adrian and Matthews, 1934; Mathewson et al., 2012;

474 Notbohm et al., 2016; Notbohm and Herrmann, 2016; Schwartzman et al., 2019), which
475 coincides with findings that subjectively experienced FLS-effects are strongest in the alpha476 frequency range (Amaya et al., 2023).

477

478 As there are rich feedback connections between visual cortices and thalamic nuclei (Budd, 479 2004; Murphy et al., 1999), an increase in functional connectivity likely encapsulates both 480 feedforward and feedback processes. Indeed, it was recently shown that visual flicker induced 481 phase-locking in LGN and cortical layers 4 and 5 of V1 (Schneider et al., 2023), which are 482 involved in feedforward and feedback processes, respectively. The corticogeniculate inputs 483 may refine the feedforward signals, possibly through enhancing response precision and 484 synchronising LGN action potentials (Andolina et al., 2007; Briggs, 2020; Sillito et al., 1994), 485 leading to the development of specific geometric patterns and distinct colours. While our data 486 may represent changes to both feedforward and feedback interactions during FLS, future 487 research should assess the weighting of these contributions to the resulting thalamocortical 488 hyperconnectivity.

489

490 Thalamocortical connectivity with pulvinar

491 Due to the involvement of the pulvinar as a higher-order thalamic nucleus in visual processing 492 (Adams et al., 2000; Benevento and Rezak, 1976; Guedj and Vuilleumier, 2020; Kaas and Lyon, 493 2007), we expected to find effects of FLS on thalamocortical connectivity with the inferior and 494 lateral pulvinar. The lateral pulvinar demonstrated increased coupling with EVC, which was 495 more apparent for ventral visual areas compared to dorsal (see Figure 3). This reflects the 496 major contribution of the lateral pulvinar to the ventral visual stream (Kaas and Lyon, 2007), 497 which is responsible for shape and colour recognition (Ungerleider and Haxby, 1994), possibly 498 relating to the hallucinatory perception of patterns and colours, although tests of this 499 association did not survive conservative Bonferroni correction. Additionally, there were no 500 effects of FLS on inferior pulvinar connectivity, together showing that the effects of FLS on 501 pulvinar connectivity were smaller than expected, especially when compared to other 502 thalamic nuclei (see below). It is possible that the observed effects on the pulvinar can be 503 assigned to contributions to visual attention (Gattass et al., 2017; Saalmann et al., 2012), 504 rather than the subjective experience of visual hallucinatory phenomena.

505

506 Further thalamic nuclei displaying altered thalamocortical connectivity

507 Exploratory analyses of ROI-to-ROI connectivity highlighted three further thalamic subregions 508 whose connectivity to visual areas seem to be modulated by FLS: (1) anterior nuclei, where 509 all divisions of anterior nuclei are included in the AV region of the AAL3 atlas. (2) the ventral 510 nuclei group, which includes VA, VPL and VL nuclei, and (3) MD nuclei. All these thalamic 511 regions showed hyperconnectivity with EVC during 3 Hz and 10 Hz FLS and hyperconnectivity 512 with further upstream visual areas (e.g., V3a, VO2) for 10 Hz FLS only.

513 Anterior nuclei are critically involved in spatial navigation and memory (Roy et al., 2022; Safari 514 et al., 2020). For example, they receive head direction signals through vestibular sensory 515 inputs (Peyrache et al., 2019; Sharp et al., 2001; Taube, 2007). Within the anterior division, 516 AV nuclei are linked to the visual cortex via connections to the retrospinal cortex (Lomi et al., 517 2023), which is thought to contribute to spatial organization in imagination (Botzung et al., 518 2008; D'Argembeau et al., 2008; Hassabis et al., 2007; Szpunar et al., 2007). Furthermore, a 519 post-mortem study of patients with schizophrenia found fewer thalamocortical projections in 520 the AV nucleus bilaterally (Danos et al., 1998), suggesting a potential role in pathologic altered 521 perceptual processing.

522 Within the ventral group, the VL nucleus has been associated with auditory-tactile 523 synaesthesia (Ro et al., 2007), despite being primarily known as a first-order relay for motor 524 inputs (Percheron et al., 1996). The ventral thalamic group were found to be hyperconnected 525 with sensorimotor networks within psychosis (Avram et al., 2018) and following LSD 526 administration (Avram et al., 2022), together indicating an contribution to altered perceptual 527 processing. VL nuclei were further found to be functionally connected to the lateral visual 528 network (Kumar et al., 2022), which is involved in motion and shape perception (Smith et al., 529 2009). Here, despite being known as first-order nuclei, we speculate that ventral thalamic 530 regions may serve higher-order, integrative functions within visual processing, as it was found 531 that first-order nuclei can also form a hub for interactions with multiple functional networks 532 (Hwang et al., 2017).

533 MD nuclei have extensive connections with the prefrontal cortex (Haber and Mcfarland, 2001) 534 and are primarily involved in executive cognitive function (Parnaudeau et al., 2017). For 535 patients with psychotic disorders, MD nuclei were functionally hypoconnected with 536 prefrontal areas (Avram et al., 2018; Woodward and Heckers, 2016) while being 537 hyperconnected with sensorimotor areas (Anticevic et al., 2014). Further, in a healthy 538 population, MD nuclei were activated during perception of fused versus non-fused colour 539 (indicative of hallucinatory perception; (Seo et al., 2022)). Ventral and MD nuclei were also 540 highlighted in recent reviews of relevant thalamic regions contributing to drug- and 541 pathology-related hallucinatory phenomena (Avram et al., 2021; Doss et al., 2021).

542 Together, these thalamic regions (AV, ventral, MD) show a similar thalamocortical 543 hyperconnectivity pattern with visual cortices as recently reported in patients with chronic 544 schizophrenia (Rolls et al., 2021), suggesting that the observed hyperconnectivity could be 545 associated with hallucinatory experiences. However, the sparsity of literature linking these 546 thalamic regions to the visual system makes it difficult to infer how exactly they contribute 547 mechanistically to the emergence of visual hallucinations. This calls for further research into 548 the functional involvement of higher-order nuclei in visual processing and consequently in 549 hallucinatory experiences.

550

551 The role of higher-order thalamic nuclei in the formation of visual hallucinations may instead 552 lie in their ability to orchestrate brain-wide cortical activity. AV, ventral and MD nuclei all 553 display strong connector hub properties for cortical functional networks (Hwang et al., 2017), 554 which suggests that these thalamic areas are not only functionally specific, but also contribute 555 to domain-general, brain-wide function (Shine et al., 2023). For example, cross-frequency 556 coupling (CFC) may be a mechanism underlying FLS-induced effects, whereby the thalamus 557 and/or EVC are entrained to alpha frequency, which consequently modulates large-scale 558 cortical excitability occurring in the gamma frequency range (Canolty and Knight, 2010; 559 Klimesch et al., 2007; Kosciessa et al., 2021; Wang et al., 2012). Given the importance of the 560 thalamus in coordinating brain-wide activity, thalamocortical pathways have become a 561 central feature of multiple theories of consciousness (Alkire et al., 2008; Aru et al., 2019; 562 Purpura and Schiff, 1997; Tononi and Edelman, 1998; Ward, 2011) e.g., Dynamic Core Theory 563 ((Tononi and Edelman, 1998); from which Integrated Information Theory developed (Tononi, 564 2011; Tononi et al., 2016)), where subjective experiences might partly depend on 565 orchestrating roles of thalamocortical interactions. Further, Dendritic Integration Theory 566 proposes that cortical layer 5p neurons, where dendritic signalling is under control of 567 thalamocortical projections of higher-order nuclei, are critical for conscious experience (Aru 568 et al., 2019). While our study does not directly address the neural mechanisms of conscious 569 processing, it adds to an understanding regarding the role of thalamocortical interactions

570 within visual experiences in the context of hallucinatory perception. Future research should 571 continue to integrate how thalamocortical interactions contribute to conscious awareness 572 and phenomenal characteristics of subjective experience.

573

574 **Connectivity within visual areas**

575 When exploring connectivity changes within the visual system, we found a consistent pattern 576 of connectivity changes for 3 Hz and 10 Hz FLS. There was hyperconnectivity within two 577 groups: (1) within EVC and (2) between upstream visual areas (e.g., LO1) and the IPS, while 578 these two groups were decoupled from each other. Such altered corticocortical connectivity 579 may have been mediated by the thalamus, which can sustain and modulate corticocortical 580 functional connectivity (Schmitt et al., 2017). This connectivity pattern contrasts with effects 581 on the visual system elicited by ASC pharmacological interventions, i.e., LSD, where a 582 hypoconnectivity within EVC and within lateral visual regions (e.g., hV4/hMT) was found 583 (Bedford et al., 2023; Carhart-Harris et al., 2016; Müller et al., 2018), however methodological 584 differences in defining visual areas make it difficult to draw direct comparisons. Within our 585 study, FLS-induced EVC hyperconnectivity likely reflects the visual sensory inputs that drive 586 the consequent hallucinatory effects, while hallucinatory effects of LSD are mediated by 587 serotonergic agonism (Aghajanian and Marek, 1999). It can be further speculated that EVC 588 hyperconnectivity may evoke decoupling between EVC and upstream visual areas, which then 589 become hyperconnected to further upstream areas (i.e., IPS) as a compensatory response. 590 However, what the functional relevance of this would be is largely unclear, especially as 591 similar corticocortical connectivity patterns for 3 Hz and 10 Hz FLS suggest that the altered 592 connectivity does not correspond directly to the visual experience. Further research should 593 explore in detail whether there is a phenomenal correlate of altered connectivity along the 594 visual hierarchy and furthermore, whether a temporal sequence of connectivity changes can 595 hint towards a causational link.

596

597 Limitations

598 It must be acknowledged that not all thalamic nuclei are accounted for in the AAL3 atlas. 599 Particularly, the thalamic reticular nucleus, which forms a thin sheet surrounding the 600 thalamus (Pinault, 2004) is known to exert inhibitory control on other thalamic nuclei, such 601 as the LGN (Halassa and Sherman, 2019). Therefore, it is possible that changes in connectivity with thalamic regions may have been mediated by thalamic reticular activity. While future
work could utilise other atlas parcellations of the thalamus that include reticular nuclei (e.g.,
thalamic probabilistic atlas (Iglesias et al., 2018)), Rolls *et al.* (2020) purposely omitted this
ROI from their atlas due to its difficult structure for automated parcellation. Accurate
parcellation of the reticular nuclei may only be possible with a higher field MRI scanner (i.e.,
7 Tesla) and thus higher resolution images.

608 Moreover, with the quantification of functional connectivity, interpreting the directionality of 609 effects is highly limited. The well-described anatomy of retinal inputs to the thalamus allows 610 to draw some inference on feedforward signalling from the LGN to the cortex. Furthermore, 611 the lack of direct retinal inputs to higher-order nuclei suggests that these are most likely 612 driven by corticothalamic signalling. However, an interpretation of directionality beyond 613 these are speculative. Future investigations could employ effective connectivity analyses, 614 such as regression Dynamic Causal Modelling (rDCM) (Frässle et al., 2021, 2017), as used in a 615 recent LSD study (Bedford et al., 2023), which allows to test for directionality based on 616 predefined network models of interacting regions. Thus, analyses such as rDCM could give 617 more mechanistic insights into the sources of connectivity changes across thalamocortical 618 and corticocortical loops. This may, in turn, shed further light on the functional roles of relay 619 and higher-order thalamic nuclei in the generation of visual hallucinatory phenomena.

620

621 **Conclusions**

622 Overall, we show that FLS induces thalamocortical hyperconnectivity between LGN, EVC and 623 proximal upstream areas of ventral and dorsal visual streams (i.e., hV4, VO1, V3a). 624 Additionally, while only weak effects were found for the pulvinar, hyperconnectivity between 625 other thalamic nuclei and visual areas were more apparent, i.e., mediodorsal, anterior and 626 ventral nuclei. The hyperconnectivity between higher-order thalamic nuclei and upstream 627 visual areas was only evident for 10 Hz FLS, which follows the parametric modulation of flicker 628 frequency on subjective ratings of seeing patterns and colours. This suggests that, although 629 thalamocortical hyperconnectivity with LGN may initially drive the FLS-induced effects, the 630 subsequent cortical interactions with higher-order thalamic nuclei may be more relevant for 631 the emergence of visual hallucinations. In sum, we identify, for the first time, the specific 632 thalamic nuclei and visual areas that display altered connectivity during flicker-induced 633 hallucinatory phenomena.

634	
635	Acknowledgements
636	We thank Light Attendance GmbH (Innsbruck, Austria) for generously providing a Lucia N°03
637	system free of charge.
638	
639	Declaration of interest
640	None
641	
642	Financial Disclosure
643	No external funding was received for the execution of this investigation. I.A. is a PhD fellow
644	of the Einstein Center for Neurosciences funded by Charité – Universitätsmedizin Berlin.
645	
646	Data and code availability
647	All data will be shared upon contact to I.A. (email: ioanna.amaya@charite.de). Code for MRI
648	preprocessing and generating connectivity matrices will be made available at:
649	https://github.com/ioannaamaya/FLS-rsfMRI.git. Any further information required to re-
650	analyse the data presented in this article is available without restrictions upon request to I.A.
651	
652	Author contributions
653	Ioanna A. Amaya: Formal analysis, Data curation, Methodology, Visualization, Writing -
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655	curation. Johanna Kemmerer: Investigation, Data curation, Methodology. Evgeniya Kirilina:
656	Methodology, Resources. Till Nierhaus: Methodology, Formal analysis, Software, Supervision,

- 657 Writing review & editing. **Timo T. Schmidt:** Conceptualisation, Investigation, Project 658 administration, Resources, Methodology, Software, Supervision, Visualisation, Writing –
- 659 original draft, Writing review & editing.

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