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Oscillatory properties of functional connections between sensory areas mediate crossmodal illusory perception

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1	Oscillatory properties of functional connections between sensory areas mediate
2	crossmodal illusory perception
3	
4	SHORT TITLE: Oscillatory networks mediate crossmodal illusions
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26 Abstract

27 The presentation of simple auditory stimuli can significantly impact visual processing 28 and even induce visual illusions, such as the auditory-induced Double Flash Illusion (DFI). 29 These crossmodal processes have been shown to be driven by occipital oscillatory activity 30 within the alpha band. Whether this phenomenon is network specific or can be generalized to 31 other sensory interactions remains unknown. The aim of the current study was to test whether 32 crossmodal interactions between somatosensory-to-visual areas leading to the same (but tactile-induced) DFI share similar properties to the auditory-DFI. We hypothesized that if the 33 34 effects are mediated by the oscillatory properties of early visual areas per se then the two 35 versions of the illusion should be subtended by the same neurophysiological mechanism (i.e. 36 the speed of alpha frequency). Alternatively, if the oscillatory activity in visual areas 37 predicting this phenomenon is dependent on the specific neural network involved, then it 38 should reflect network-specific oscillatory properties. In line with the latter, results recorded 39 in humans (both genders) show a network-specific oscillatory profile linking the auditory-40 DFI to occipital alpha oscillations, replicating previous findings, and tactile-DFI to occipital 41 beta oscillations, a rhythm typical of somatosensory processes. These frequency-specific 42 effects are observed for visual (but not auditory or somatosensory) areas and account for 43 auditory-visual connectivity in the alpha band and somatosensory-visual connectivity in the 44 beta band. We conclude that task-dependent visual oscillations reflect network-specific 45 oscillatory properties favouring optimal, directional neural communication timing for sensory 46 binding.

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48 Significant Statement: Cooke and colleagues investigate the oscillatory correlates of 49 the auditory- and tactile-induced double flash illusion (DFI), a phenomenon where two 50 interleaved beeps (taps) set within 100ms apart and paired with one visual flash induce the

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51 sensation of a second illusory flash. Results confirm previous evidence that the speed of 52 individual occipital alpha oscillations predict the temporal window of the auditory-induced 53 illusion. Importantly, they provide novel evidence that the tactile-induced DFI is instead 54 mediated by the speed of individual occipital beta oscillations. These task-dependent occipital 55 oscillations are shown to be mediated by the oscillatory properties of the neural network 56 engaged in the task to favour optimal temporal integration between the senses.

57

58 Introduction

59 Our senses act as temporal gateways to our environment, allowing continuous 60 information streams within and across senses to be coded into discrete information units 61 (VanRullen & Koch, 2003, VanRullen, 2016; Chakravarthi & VanRullen., 2012). The 62 temporal resolution of such mechanisms may allow the brain to temporally bind sensory input over time and across senses into meaningful objects and events (Cecere et al., 2015) 63 64 reducing the complexity of our environment (Wutz et al., 2016; 2018). 65 This Bayesian mechanism (Beierholm et al., 2009; Barakat et al., 2013; Kayser & 66 Shams 2015; Cuppini et al., 2017) generally leads to prompt, efficient readouts of the 67 experienced environment. However, when presented with incongruent sensory information, it 68 often gives rise to illusory phenomena. One such example is the Double Flash Illusion (DFI). 69 Shams and colleagues (2000) first discovered that when two shortly interleaved beeps are 70 paired with a single flash, participants often perceive a second illusory flash (Shams et al., 71 2000; 2002). Such illusion may possibly represent the best coherent perceptual resolution of 72 otherwise conflicting sensory information (Cecere et al., 2015). By systematically manipulating temporal intervals between paired "beeps", it is possible to define the temporal 73 74 window of this illusion (TWI); i.e. the time interval in which the illusory flash is perceived. 75 This TWI, first characterised by Shams and colleagues (2002) and detailed by Cecere et al.,

76	(2015), demonstrates that the illusion decays when the average time between stimuli exceeds
77	100ms. Cecere et al., (2015) argued that these TWIs, variable across individuals, are
78	reminiscent of the temporal profile of posterior oscillatory activity in the alpha band (8-
79	12Hz). Employing both correlational and causal approaches, Cecere et al., (2015) found a
80	tight correlation between individual TWI and individual alpha frequency peak (IAF) with
81	faster IAFs predicting shorter TWIs, and slower IAFs predicting larger TWIs.
82	Yet, we are unaware whether this mechanism is determined by local network rules per
83	se, i.e. local occipital oscillatory resonance activity (typically alpha) (Rosanova et al., 2009),
84	or whether it depends on long-range communication networks (Fries, 2015), i.e. the way in
85	which a sensory modality (e.g. auditory) impacts on visual cortex activity (Romei et al.,
86	2012). In other words, are crossmodal visual illusions determined strictly by typically visual
87	oscillatory constraints, or do visual oscillations mediating these effects reflect the oscillatory
88	properties of the functional connection between sensory modalities?
89	An elegant way to tease apart these hypotheses is to investigate the temporal profile
90	and neural underpinnings of a DFI induced by a sensory modality other than audition and
91	compare it with the auditory-DFI. Here, we utilised the tactile-DFI (Violentyev et al., 2005),
92	whereby replacing paired "beeps" with "taps" upon the index finger elicits a similar illusory
93	experience. No previous report of a temporal profile for the tactile-DFI exists. If the induced
94	illusory flash is determined by local resonance frequency of the visual cortex (alpha),
95	irrespective of paired modality, then similar illusory phenomena should also be mediated by
96	occipital IAF. Alternatively, if functional connections between auditory/somatosensory and
97	visual cortices determine the fate of the illusory experience, then occipital oscillations
98	accounting for auditory- and tactile-DFI may depend on communication-specific mechanisms
99	influencing visual cortical processing at the speed of their typical resonance frequency.

101 2015), neural communication subserved by oscillatory synchronization between remote but 102 functionally interconnected areas would be the result of the alignment of post-synaptic neural 103 activity (visual cortex) to pre-synaptic input (auditory/somatosensory cortex), creating 104 temporal windows of optimal communication. 105 This hypothesis would not contradict evidence that auditory-induced TWI is mediated 106 by alpha oscillations as auditory processing (pre-synaptic), which is typically associated with 107 alpha activity (Weisz et al., 2011), phase-aligns alpha oscillations in visual cortex (post-108 synaptic) (Romei et al., 2012). Crucially, this would predict somewhat faster waves to 109 influence the tactile-TWI, since tactile processing (pre-synaptic) is often associated with beta 110 frequency oscillations (Salenius & Hari, 2003; Foffani, et al., 2005; Engel & Fries, 2010; 111 Baumgarten, et al., 2015). 112 113 **Materials and Methods** 114 **Participants** 115 A total of 62 participants volunteered to take part in the study which was approved by 116 the ethics committee of the University of Essex. Eleven participants were excluded from data 117 analysis as their perceived illusion could not be fitted to the sigmoid function curve. 118 All but 3 participants (of whom 2 were left handed and 1 ambidextrous by self-report were right handed (mean age: 25, range: 18 – 44, 31 females). 119 120 Prior to taking part, participants completed a screening questionnaire ensuring they 121 had no psychiatric or neurological history and normal (or corrected) vision, as well as normal 122 hearing and somatosensation by self-report. 123

According to the "Communication Through Coherence" framework (Fries, 2005;

124 Materials and Apparatus

125	All visual stimuli were presented on a 17.5" cathode ray tube monitor via a Dell
126	Optiplex 960 computer (Windows XP, resolution: 1280x1024) with a refresh rate of 85Hz.
127	Auditory stimuli were delivered via a pair of speakers placed either side of the monitor
128	(perceived by the participants as originating from the centre of the screen, close to the visual
129	stimuli). Volume was set so stimuli were approximately 50 dB (SPL) at the location of the
130	participants' head. The tactile stimulation was provided via a tactile controller and
131	mechanical solenoid stimulator (Heijo Research Electronics, London, UK). This would
132	deliver a suprathreshold tap (on the left index finger tip) by pushing a blunt plastic tip against
133	the participant's skin whenever a current was passed through the solenoid. During the tactile
134	stimulation, white-noise (approximately 50db) was played to participants through speakers to
135	mask and ensure that the mechanic noise produced by the tactile stimulator was not heard by
136	the participants. Experimental stimuli were presented via E-prime (version 2.0; Psychology
137	Software Tools, Pittsburgh, PA).
138	We piloted the experiment in the first 15 participants and electroencephalography
139	(EEG) was recorded with a restricted number of electrodes including Electrodes Oz, O2, O1,
140	FP1, FPz and FP2, alongside the ground electrode (location: AFz) and the reference electrode
141	placed over the right mastoid bone.
142	In the remaining participants (N=36), the EEG was recorded from 64 sintered
143	Ag/AgCl electrodes mounted on an elastic cap (Easycap, Herrsching, Germany) alongside the
144	ground electrode (position: AFz) and the reference electrode (placed upon the right mastoid
145	bone). The EEG signals were digitized at 500Hz and amplified using BrainVision
146	Professional BrainAmp amplifier through the BrainVision Recorder programme
147	(BrainProducts GmbH, Gilching, Germany). Before the recording began we ensured that all
148	electrodes were set on the participant's scalp at an impedance not exceeding $10k\Omega$.

149	In all trials, participants were presented with a flashing disc, displayed just below a
150	central fixation cross (this disc always flashed once for a duration of 12ms and had a diameter
151	of 2cm). During the auditory DFI task the disc was always paired with a double-beep with
152	each beep having a frequency of 3500Hz and a duration of 7ms. During the tactile DFI task
153	disc presentation was paired with a double tactile stimulation to the left index finger.
154	The two brief tones (and the two tactile stimulations) were spaced apart by varying
155	Stimulus Onset Asynchronies (SOAs) ranging between 36 and 204ms with increments of
156	12ms, resulting in 15 different SOAs. Each SOA was presented 10 times, resulting in 150
157	randomly ordered trials per task.
158	The time between trials included the presentation of the stimuli (as described above)
159	plus a varying interval. The interval corresponded to the elapsed time following the
160	experimenter inputting on the keyboard the participant's vocal response plus an interval
161	ranging between 1000ms and 1800ms (there were 5 different inter-trial delays in steps of
162	200ms, each occurring 30 times).
163	
164	Experimental Design
165	Upon EEG fitting completion, participants were seated 57cm away from the screen.
166	EEG recording was manually started prior to trial commencement. Participants were

167 instructed to fixate on a cross situated at the centre of the screen while 150 flashing discs

were presented in a first block of trials paired with two auditory (or tactile) stimuli, followed, after a brief resting period, by a second block of 150 flashing discs paired with two tactile (or auditory) stimuli. To control for order effects (including fatigue or boredom), the order of the blocks was counterbalanced, with half of the participants performing the tactile DFI first, and

- the other half performing the auditory DFI first. For the tactile DFI block, participants were
- 7

174 to maximise spatial co-occurrence of the visual and tactile stimuli processing.

In all trials participants were required to verbally report whether they perceived one or two flashes, to avoid motor interference from participants using their resting hand to respond to the stimuli, especially with the tactile version of the experiment. Participants were instructed to provide unspeeded, accurate responses. The verbal report was then input by the examiner via the "1" and "2" key on the keyboard which prompted the new trial to start after

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180

182 Statistical Analysis

a variable inter-trial interval.

183 Behavioural data analysis

184 The participants' perceived illusory flashes across the different SOAs were used to separately 185 calculate for the auditory- and tactile-DFI the temporal window in which the visual illusion 186 was maximally perceived. Therefore, we calculated the percentage of illusory trials (i.e. two 187 flashes perceived) and plotted them as a function of SOAs separately for the auditory- and tactile-DFI. A psychometric sigmoid function [y = a+b/(1+exp(-(x-c)/d)); a = upper188 189 asymptote; b = lower asymptote; c = inflection point; d = slope] was then fitted to each 190 percentage distribution returning a corresponding inflection point (centre c) of the fitted 191 sigmoid representing the point of decay of the illusion, taken as an index of the TWI. If data would not fit to the sigmoid function, participants' performance was deemed unreliable and 192 193 discarded. Following this procedure, 11 of the 62 participants were not enrolled in the full 194 experiment procedure and therefore excluded from data analysis.

195

196 EEG data analysis

197 Sensor space analysis

EEG activity concurrently recorded during task execution was analysed to calculate
 individual alpha and beta frequency peaks, for each participant performing the auditory- and
 tactile-DFI tasks.

201 In the first 15 participants, EEG analysis was performed on electrode Oz only. 202 Depending on the band of interest the data was band pass filtered as follows: for alpha, a high 203 pass filter of 3Hz and a low pass filter of 40Hz were used (identical to Cecere et al., 2015); 204 for beta, given the lower power relative to alpha, a more stringent criterium was used: a high pass filter of 12Hz and a low pass filter of 25Hz were used. The EEG signal was segmented 205 206 in equal epochs of 2000ms. As data in this first sample of participants was not synched to 207 stimulus presentation (no trigger was recorded for each stimulus onset and response), the 208 2000ms epochs corresponded to consecutive non-overlapping segments independent of the 209 stimulus onset (for a total of \sim 170 epochs on average). The potential confound of induced and 210 evoked oscillatory responses was controlled for in the second group of 36 participants, where 211 64 channel EEG was recorded at a sampling rate of 500Hz. In this group the EEG signal was 212 re-referenced offline to the average of all scalp electrodes. EEG data was subsequently 213 segmented into 2000ms epochs time-locked to and preceding the visual stimulus onset. This 214 resulted in 150 epochs of pre-stimulus oscillatory activity for each of the three frequency 215 bands assessed both for the tactile and auditory DFI task. Each single epoch was visually 216 inspected for artefacts (from eye blinks and muscle contractions), and manually rejected 217 where necessary. For each participant and for all the recorded electrodes a full power 218 spectrum was obtained through Fast Fourier Transform (FFT) with zero padded window 219 (nominal frequency resolution 0.125Hz). Finally, for each participant, task and frequency 220 band, EEG segments were averaged for calculation of the average peak frequency in the 221 visual cortex, as calculated at the electrode Oz. For each frequency band, the peak frequency 222 was determined for each participant as the value corresponding to the maximum peak

224 participant the speed (in ms) of one single oscillatory cycle was calculated using the peak 225 frequency data (in Hz) obtained in the alpha and beta bands over Oz in the first 15 226 participants and over 64 channels in the other 36 participants. 227 228 **Source Space analysis** 229 All source space analyses were performed on the second group of 36 participants for whom 230 the signal had been recorded from a full set of 64 EEG channels. 231 232 Frequency peak analysis in virtual electrodes Virtual electrodes were computed for three different cortical areas (visual cortex, auditory 233 234 cortex and somatosensory cortex) using the linearly constrained minimum variance scalar 235 beamformer (Sekihara et al., 2004) implemented in Fieldtrip. First, a 10 mm three-236 dimensional grid was fitted to the MNI standard brain. Then, the forward model was created 237 using a standardized realistic head model. The spatial filters were computed for each DFI task 238 using a 2-s pre-stimulus and a 0.5-s post second stimulus covariance window, with the 239 regularization parameter set to 10%. Single trial time series were projected to the cortical 240 surface by multiplying them by the spatial filters weights. The source volume was 241 interpolated with the MNI standard brain to define three regions of interest: right calcarine 242 gyrus (visual-cortex), right superior temporal gyrus (auditory cortex), and the right 243 postcentral gyrus (somatosensory cortex). For each participant the IAF and IBF were 244 calculated in the voxel inside each of the three ROIs that showed a clear peak with the 245 maximal amplitude. Finally, for each participant and selected voxel we calculated the speed 246 (in ms) of one single oscillatory cycle for each peak frequency data (in Hz). 247

frequency within their frequency range: alpha, 7-12Hz; beta, 12-25Hz. Finally, for each

248 Phase locking value analysis

249 To quantify the frequency specificity synchronization between the visual and the

250 somatosensory cortex in the tactile-DFI condition, and between the visual and the auditory

251 cortex in the auditory-DFI condition, we computed the phase locking value (PLV) centred in

252 each participant specific IAF and IBF (Lachaux et al. 1999). The time series in each virtual

253 electrode was filtered with Fc of IAF and IBF +/- 1Hz. The instantaneous phase complex

254 representation of the filtered signal was calculated as follows: $e^{i\phi(t)} = s_a(t)/|s_a(t)|$, where $s_a(t)$ is

the signal's analytic representation. The phase alignment between the two virtual electrodes

256 was computed as follows:

257

$$PLV_{i,j}(t) = \frac{1}{N} \left| \sum_{n=1}^{N} e^{-i\left(\varphi_i(t,n) - \varphi_j(t,n)\right)} \right|$$

259

258

260 where N is the number of trials.

261 PLVs were computed separately for trials within each participant's TWI and for trials outside

262 each participant's TWI, and rescaled with respect to a 100-ms pre-stimulus window.

263 Nonparametric statistics were used to compute significant differences between each condition

264 (Maris & Oostenveld, 2007). First, temporal clusters of PLVs were calculated based on time-

265 points that were significant in paired t-tests. Then, Monte-Carlo randomisation was

266 performed to obtain the empirical distribution of the maximum cluster statistic, computed as

267 the sum of within-cluster t-values. The observed cluster was considered significant if its

268 cluster statistic value was above the 95% of the empirical distribution.

269

270 Correlation analyses on behavioural data

First, we looked at the behavioural data obtained in the 51 participants for the

auditory- and tactile-DFI, to compare performance in the two tasks and characterise for the

first time the temporal profile of the tactile DFI. Second, we assessed the relationship
between the known auditory-DFI and the previously unexplored tactile-DFI temporal
profiles.

To investigate this relationship, we also utilised the robust skipped correlation method as described by Pernet et al. (2013).

278

Correlation analyses between behavioural and electrophysiological data (sensor space)
 Next, we performed correlational analyses between the individual speeds (in ms) of each
 oscillatory cycle and the individual width (in ms) of the TWI separately for the auditory- and
 tactile-DFI.

283 Our behavioural and electrophysiological data were used to test the following predictions. 284 Firstly, we aimed to replicate data from Cecere et al., (2015) providing evidence suggesting 285 that occipital IAF is selectively predictive of TWI size. Secondly, we wanted to test the 286 hypothesis that occipital IAF is predictive of both the size of the auditory and tactile TWI or 287 alternatively that the size of TWI is differently accounted for by the occipital IAF in the 288 specific instance of the auditory DFI and by the Individual Beta Frequency (IBF) in the 289 specific instance of the tactile DFI. We tested these hypotheses first in the initial 15 290 participants over Oz (with epochs unlocked to stimulus onsets) and again in the sample of 36, 291 this time using a full array of electrodes allowing for a topographical distribution of Pearson's 292 r (and stimulus-locked epochs). As the preliminary analyses of both behavioural and EEG 293 data showed comparable results between groups, notably excluding at the EEG level the 294 potential confounds of evoked responses in the calculation of individual frequency peaks, 295 data from both groups were pooled together for behavioural and EEG analyses at sensor Oz. 296 Furthermore, we utilised the robust skipped correlation method as described by Pernet, et al., 297 (2013).

299 Multiple regression analyses between behavioural and electrophysiological data (source

300 space)

To test whether any relationship between behavioural and oscillatory data was specific to the visual cortex a multiple linear regression analysis was used to assess the relationship between: 1) the TWI in the auditory-DFI and the IAF and IBF of visual and auditory virtual electrodes; 2) the TWI in the tactile-DFI and the IAF and IBF of visual and somatosensory virtual electrodes (Keil et al., 2016). A forward step procedure was adopted to fit the regression model.

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309 Results

310 Auditory-induced vs. tactile-induced DFI

311 We first determined the temporal profile for the auditory- and tactile-DFI. For the 312 auditory-DFI we replicated previous reports (Cecere et al., 2015) of an average TWI just 313 around 100ms. The temporal profile of the tactile-induced DFI was very similar to the 314 auditory-induced DFI in the same participants and did not significantly differ from each other 315 (auditory-induced TWI: 99.02ms (S.E.M.: 3.08); tactile-induced TWI: 102.80ms (S.E.M.: 3.23); t (50) = -1.02; p = 0.31). We then tested whether these two measures were correlated. 316 We found a significant correlation between the two versions of the DFI (Pearson's r = 0.31 p 317 318 = 0.03) which also survived the robust skipped correlation method (r = 0.31, CI = [0.02, 0.55]) 319 (See Figure 1).

We further compared the two sensory versions of the illusion by contrasting the goodness of fit across the two versions of the DFI. Specifically, measurements were taken for the R^2 value (as an indicator of the goodness of fit) for each curve across participants and

significantly lower compared to that of the auditory illusion ($R^2 = 0.83$, p < .001), suggesting

325 the tactile illusion is inherently noisier than the auditory version.

Overall, a first interpretation of these behavioural findings is that the auditory and
 tactile version of the DFI might be driven by similar neurophysiological mechanisms.

328

329 EEG correlates of auditory- and tactile-DFI

330 Sensor space

331 We found that occipital IAF (in ms) positively correlates with the size of the TWI in the auditory-DBI (Pearson's r = 0.52; p < .001), which also survives robust skipped 332 333 correlations (r = 0.41, $CI = [0.18 \ 0.59]$), such that faster IAFs accounted for shorter TWIs, 334 essentially replicating the results of Cecere et al., (2015). Pearson's correlation topography 335 (calculated on 36 participants) suggests that this effect is maximal over posterior regions and 336 is frequency-specific as no significant correlations could be found for IBF (calculated on 337 51participants: r = -0.06; p = .69) (See Figure 2). Crucially, when looking at the tactile-DFI, a 338 different pattern of results emerged. IAF did not correlate with TWI when the TWI was induced by tactile stimuli (r = -0.13; p = .38). Instead we found that occipital IBF positively 339 correlated with the size of the TWI in the tactile-DFI (Pearson's r = 0.54; p < .001), which 340 also survives robust skipped correlations (r = 0.54, CI = [0.32, 0.69]), such that faster IBFs 341 342 accounted for shorter TWIs (See Figure 3B).

343

344 Source Space

Multiple linear regression analysis showed that, for the TWI of the auditory-DFI task, the visual IAF (Beta = 0.751, p < .01) was a significant predictor (in line with recent findings by Keil & Senkowski (2017)), while the auditory IAF (0.040, p>0.05), the visual IBF

For the TWI of the tactile-DFI task, the visual IBF (Beta = 0.984, p < .05) was a significant predictor, while the somatosensory IBF (-0.141, p>0.05), the visual IAF (Beta=-0.020, p>0.05), and the somatosensory IAF (Beta=0.104, p>0.05) were not significant. The overall model fit was R2 = 0.16.

354

355 Phase locking value

356 Next, we explored whether the frequency-specific effects observed at the level of the visual cortex for the auditory-DFI and the tactile-DFI can be best explained by a network 357 358 specific mechanism. For this purpose, we measured the Phase Locking Value (PLV) in alpha 359 and beta oscillatory activity for auditory-visual and somatosensory-visual networks 360 depending on: 1) the performed task (auditory- and tactile-DFI) and 2) the individual TWI, 361 thus contrasting trials within and outside the TWI respectively. 362 Non-parametric statistical analysis revealed significant differences between trials 363 within and outside the TWI (see Figure 3). Specifically, IAF PLVs between the auditory and 364 visual cortices in the auditory-DFI were significantly greater for the trials outside the TWI in 365 a temporal cluster comprised between 310 and 400 ms post stimulus (p=0.046). IBF PLVs between the visual and somatosensory cortices in the tactile-DFI differed between conditions 366 in two temporal clusters, between 210 and 260 ms and between 280 and 360 ms post stimulus 367 368 (p=0.015 and p=0.03, respectively).369

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371 Discussion

In the current study we characterised for the first time the temporal profile of the tactile-DFI directly comparing it to the temporal profile of the auditory-DFI. We found that these temporal profiles are comparable; they do not significantly differ and positively correlate, suggesting that similar mechanisms may be at play in determining these effects. We thus tested which neurophysiological mechanism might best account for the auditory- and tactile-DFI.

378 EEG results demonstrated that oscillatory processes relate to the two illusions in a 379 frequency- and network-specific manner. Whilst replicating previous findings demonstrating 380 a relationship between IAF and auditory-DFI (Cecere, et al., 2015; Keil & Senkowski, 2017), 381 we could not replicate this relationship between IAF and tactile-TWI. Instead, a positive 382 correlation between TWI and IBF was found, such that faster IBF predicted shorter TWI. 383 This was found both at sensor and source space, over early visual areas. Moreover, in source 384 space we found that visual (but not auditory or somatosensory) IAF explained the audio-385 visual TWI (in line with a recent report by Keil & Senkowski, 2017) and similarly only 386 visual-IBF explained the tactile-visual TWI. 387 To test for the specific interpretation that oscillatory correlates of the auditory- and 388 tactile-DFI represent not just a local occipital phenomenon but rather a reliable marker of the 389 specific crossmodal network engendering the illusion we have looked at an index of 390 connectivity between nodes of the network, namely PLV. Specifically, we investigated the 391 modulation of signal strength between auditory-visual and somatosensory-visual networks in 392 alpha and beta bands following stimulus presentation.

We found enhanced PLV in alpha (but not beta) oscillations between auditory-visual (but not tactile-visual) nodes, while the same was found in beta (but not alpha) oscillations between tactile-visual (but not auditory-visual) nodes, confirming that oscillatory tuning to the particular version of the illusion reflects a marker of network-specific activation.

397 This frequency and network specific PLV enhancement was found for trials not 398 inducing the illusion. This finding might reflect temporal alignment to coherent temporal and 399 quantity information across the senses within the temporal binding unit defined by the oscillatory cycle (Romei et al., 2012). This same mechanism may be time-sensitive to 400 401 quantity-disparity information presented within the temporal binding unit defined by the 402 oscillatory cycle, leading to altered integration processes across the senses, ultimately 403 resulting in an illusory percept. 404 What neurophysiological mechanism might be in place to account for this set of

405 results? A relevant model which might explain the current data is the "Communication 406 Through Coherence" framework (Fries, 2005; 2015). Here, neural communication is 407 subserved by neural synchronization between remote but functionally interconnected areas. 408 Specifically, such neural synchronization is the result of alignment of post-synaptic neural 409 activity to pre-synaptic input, creating temporal windows of optimal, preferred 410 communication between involved areas. In this case, such temporal profiles observed in our 411 study related to the auditory and tactile-DFI may be the result of top-down directed alpha and 412 beta (7-25 Hz) influences (feedback connections) on primary sensory input (Fries, 2015), 413 shaping the final illusory perceptual outcome. 414 From this perspective, if a crossmodal stimulus (auditory/tactile) phase-aligns 415 oscillatory activity (alpha/beta) in visual areas, it will define the temporal windows 416 corresponding to such oscillatory cycle lengths (alpha/beta) within which two consecutive 417 stimuli may give rise to the illusory percept (i.e. the TWI). The illusory phenomenon will be 418 engendered by a second crossmodal phase alignment attempt induced by the second cross-419 sensory stimulus reactivating the visual trace being still processed by the ongoing phase 420 alignment induced by the first multisensory pair. Thus, individual frequency peaks would

421 characterize the temporal resolution of interregional synchronization within which the TWI422 phenomenon arise.

423 A closely related reference framework has been introduced by Klimesch et al., (2007), 424 who proposes that communication between remote, but interconnected areas can be achieved 425 through travelling waves, that is neural oscillations allowing information transference as 426 measured through propagation between electrodes via a neural network (Klimesch et al., 427 2007, Muller et al., 2018). According to this framework, local oscillatory activity (i.e. 428 resonance frequency) in auditory (alpha) or somatosensory (beta) cortices will propagate 429 towards the visual cortex accounting for the specific differential impact of alpha and beta 430 oscillations on the auditory- and tactile-DFI, respectively. This mechanism allows prompt 431 rescaling of temporal sampling across the senses, optimizing cross-sensory communication 432 efficiency.

Under these circumstances, one expects the respective size of observed TWIs to reflect the length of the oscillatory cycle determining it, i.e., ~100ms when alpha oscillations mediate the auditory-TWI and ~70ms when beta oscillations mediate the tactile-TWI. While the case for the auditory-DFI, the tactile-DFI instead shows a TWI comparable to the

437 auditory-DFI rather than one significantly shorter.

438 Here several issues may combine to account for the lack of one-to-one 439 correspondence between beta cycle length and the length of tactile-TWI. First, it simply takes 440 longer for signals from the hand to reach the brain than it does for signals from the ears (von 441 Békésy, 1959). Such conduction time differences could total 10-15ms which may in part 442 account for the longer than expected tactile-TWI. Second, the tactile-DFI was far noisier than 443 its auditory counterpart, with its overall goodness of fit being significantly lower. A possible 444 caveat accounting for noisier fitting may lie on the asymmetry in our experimental design. 445 White-noise was continuously played in the tactile- but not auditory-DFI in order to cancel

446 out the spiky noise induced by the tactile stimulator. One potential solution could have been 447 to use white-noise across both versions of the illusion, or even better, intermix both versions 448 within the same block while continuously playing white-noise. Additionally, this might have 449 taken care of a potentially induced bias in the allocation of intersensory attention (Pomper et 450 al., 2015) across the two versions of the illusion.

451 However, it should be noted that by pairing white-noise with the auditory-DFI,

452 participants may have relied more on visual information (Hartcher-O'Brien et al., 2014),

453 which may hamper the auditory-DFI.

454 Moreover, several reports have shown the DFI to be resistant to feedback training

455 (Rosenthal et al., 2009) and that participants perceive the illusion independently of

456 crossmodal spatial congruence (Innes-Brown & Crewther, 2009) or even with prior

457 awareness of the illusion itself (Rosenthal et al., 2009), suggesting a minor role played by

458 intersensory attention allocation in this particular task.

Therefore, given the comparative nature of our design looking at possible differences of the impact of auditory and tactile stimuli on DFI, it was imperative to control for the specific contribution of each sensory modality.

462 Playing white-noise in the tactile-DFI might have contributed to the tactile-TWI being 463 more skewed towards slower durations due to noisier curve fitting, leading to a less efficient 464 temporal profile calculation of the tactile-DFI. These aspects may in part provide an 465 explanation as to the lack of a one-to-one relationship between TWI and the beta cycle 466 length. Nevertheless, they would not affect or alter the relationship between TWI and the 467 oscillatory marker as they represent a fixed-level noise to be accounted for in the calculation 468 of the absolute size of the tactile-TWI.

469 The specific mechanism subtending this outcome may be comparable across sensory470 modalities but simultaneously reflects the peculiarity of each sensory modality, including

471	temporal resolution. In other words, auditory and tactile crossmodal induced visual illusions
472	might have been caused by the specific oscillatory properties of each sensory signal's pairing.
473	The different oscillatory tuning could be explained as the specific computational speed
474	needed by the cross-sensory network to efficiently integrate information, thus representing
475	the optimal quantum for temporal binding between a given cross-sensory pair when
476	impacting visual processing specifically. In this respect, there is ample evidence that, in
477	isolation, visual and auditory sensory processing are governed by oscillatory activity in the
478	alpha band (e.g. Ergenoglu et al., 2004; Hanslmayr et al., 2007; van Dijk et al., 2008; Romei
479	et al., 2008a,b; Dugue' et al., 2011; Romei et al., 2010; Weisz et al., 2011; Frey et al., 2014),
480	while somatosensory processing typically occurs within the beta band (Salenius & Hari,
481	2003; Foffani, et al., 2005; Engel & Fries, 2010; Baumgarten, et al, 2015). While there is
482	abundant documentation of the relationship of visual processing with alpha oscillations, and
483	with the speed of alpha frequency (e.g. Samaha and Postle 2015; Wutz et al., 2016, 2018;
484	Ronconi et al., 2018; Minami & Amano 2017; Gulbinaite et al., 2017), there is little empirical
485	evidence highlighting the specific oscillatory nature of the interaction between multiple
486	senses. We and other groups have shown that the impact of simple auditory stimulation on
487	visual processing seems to be governed by the way sounds phase aligns alpha oscillatory
488	activity in the occipital cortex (Teplan, Krakovská, & Štolc, 2003; Romei et al., 2012;
489	Mercier et al., 2013; Gleiss & Kayser, 2014; Frey, et al., 2014). Yet, it was unclear whether
490	this was a general feature of crossmodal interactions within the visual system or whether the
491	specific cross-sensory input determines the fate of the visual response to the visual
492	processing. In the current study we provide the first evidence highlighting the relevance of
493	neural communication at the network level through frequency-specific oscillatory activity.
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622 Figure legends

623	Figure 1. Behavioral data. Sigmoid curve represents the best fit of the average probability
624	of perceiving the double flash illusion (DFI) plotted as a function of inter-beep (red) and
625	inter-tap (blue) delays. Each individual point represents the average TWI at each SOA. Upper
626	inset represents the significant positive correlation between respective TWIs for each illusion.
627	Lower inset displays the absolute values of the average TWIs for the auditory-induced (red)
628	and the tactile-induced (blue) TWI, respectively.

629

630 Figure 2. EEG correlates of auditory- and tactile-DFI.

631 A. Auditory-DFI. Whilst viewing the flashing disc (12ms duration) participants also 632 experienced two 3500Hz tones (both with a 7ms duration). These auditory stimulations were separated by a variable SOA (36ms - 204ms). Participants were 633 634 asked to ignore the sound and state aloud whether they perceived one or two flashes. 635 B. Tactile-DFI. Whilst viewing the flashing disc (12ms duration) participants also 636 experienced two brief taps to their left index finger (both with a 7ms duration). These 637 tactile stimulations were separated by a variable SOA (36ms - 204ms). In addition, 638 white-noise was continuously played in order to mask the noise induced by the tactile 639 stimulation. Participants were asked to ignore the tactile stimulation and state aloud 640 whether they perceived one or two flashes. 641 C. Correlation plots (upper panels) for occipital regions (electrode Oz) and Pearsons' r 642 topographic distributions (lower panels) between auditory-TWI and alpha (leftmost 643 panel) or beta (rightmost panel) bands. A selective, positive and significant

relationship between the auditory-induced TWI and the speed of alpha oscillations

645 was found suggesting that faster alpha speed accounts for shorter TWI, replicating previous evidence (Cecere et al., 2015; Keil & Senkowski, 2017). 646 647 **D.** Correlation plots (upper panels) for occipital regions (Electrode Oz) and Pearsons' r 648 topographic distributions (lower panels) between tactile-TWI and alpha (leftmost 649 panel) or beta (rightmost panel) bands. A selective, positive and significant 650 relationship between the tactile-induced TWI and the speed of beta oscillations was 651 found suggesting that faster beta speed accounts for shorter TWI. 652 653 Figure 3. Phase Locking Value (PLV) Analysis in Source space. 654 Phase Locking Value (PLV) in the alpha (leftmost quadrants) and beta (rightmost 655 quadrants) oscillatory activity for auditory-visual (upper quadrants) and somatosensory-visual 656 (lower quadrants) networks. For each quadrant, trials within (blue trace) and outside (red 657 trace) each individual TWI are depicted as a function of time (ms) from visual stimulus onset. 658 In the auditory-DFI, trials outside the TWI showed significantly higher PLVs in the 659 alpha band for the auditory-visual (but not somatosensory-visual) network between 310 and 400 ms poststimulus. 660 In tactile-DFI, trials outside the TWI showed significantly higher PLVs in the beta 661 662 band for the somatosensory-visual (but not auditory-visual) network between 210 and 260 ms 663 and again between 280 and 360 ms poststimulus. 664 PLV differences between trials within or outside the TWI occurred at a late time 665 following stimuli presentation. However, it should be noted that by nature of experimental 666 design, the second crossmodal stimulus was not locked to the first one but jittered by tens of 667 milliseconds (different SOAs), which might have masked an early differential PLV onset. 668 669

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Tactile-DFI

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