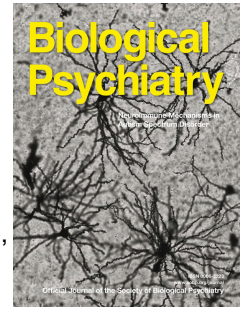


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The Effects of Methylphenidate on the Neural Signatures of Sustained Attention

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Abstract

Background: Although it is well established that methylphenidate (MPH) enhances sustained attention, the neural mechanisms underpinning this improvement remain unclear. We examined how MPH influenced known electrophysiological (EEG) precursors of lapsing attention over different time-scales.

Methods: We measured the impact of MPH, compared with placebo, on behavioural and electrocortical markers while healthy adults ($n=40$) performed a continuous monitoring paradigm designed to elicit attentional lapses.

Results: MPH led to increased rates of target detection and electrophysiological analyses were conducted to identify the mechanisms underlying these improvements. Lapses of attention were reliably preceded by progressive increases in α -activity that emerged over periods of several seconds. MPH led to an overall suppression of α -activity across the entire task but also diminished the frequency of these maladaptive pre-target increases through a reduction of α -variability. A drug-related linear increase in the amplitude of the frontal P3 event-related component was also observed in the pre-target timeframe (3 – 4 s). Further, during immediate target processing there was a significant increase in the parietal P3 amplitude with MPH, indicative of enhanced perceptual evidence accumulation underpinning target detection. MPH-related enhancements occurred without significant changes to early visual processing (visual P1 and 25Hz steady-state visual evoked potential).

Conclusions: MPH serves to reduce maladaptive electrophysiological precursors of lapsing attention by acting selectively on top-down endogenous mechanisms that support sustained attention and target detection with no significant effect on bottom-up sensory excitability. These findings offer candidate markers to monitor the therapeutic efficacy of psychostimulants or to predict therapeutic responses.

Trial Registration:

The study was registered with the Australian and New Zealand Clinical Trials Registry (ACTRN)

(Trial ID: ACTRN12609000625279,

Url: <http://www.anzctr.org.au/ACTRN12609000625279.aspx>).

Scientific title: The effect of methylphenidate, atomoxetine and citalopram versus placebo on behavioural and physiological indices of executive control in healthy individuals.

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1 Introduction

2

3 Although methylphenidate (MPH) is the most universally prescribed psychostimulant for
4 the treatment of attention deficit hyperactivity disorder (ADHD) (1), we lack a clear
5 understanding of the neurophysiological bases of its ability to enhance attention. Such
6 insights are critical for the identification of robust biomarkers of drug response which
7 may ultimately facilitate personalised approaches to treatment in disorders such as
8 ADHD.

9

10 It is well established that MPH leads to reductions in behavioural symptoms of
11 inattention, in particular, the capacity to sustain attention via modulations of
12 catecholamine transmission (2). Although functional imaging studies have demonstrated
13 that MPH strengthens the connectivity of fronto-striato-thalamic networks that are
14 integral to sustained attention (3, 4) it is less clear how the temporal dynamics of
15 electro-cortical activity, associated with attentional control in humans, are augmented
16 by MPH. Some electrophysiological studies have reported correlations of EEG power
17 (averaged at rest or across task-active conditions) with MPH-related improvements in
18 sustained attention (5-8). However, it is not apparent if these changes arise from direct
19 augmentation of sustained attention mechanisms or indirectly through facilitation of
20 task-relevant cortical regions. For example, behavioural improvements on sustained
21 attention tasks could potentially be achieved through pharmacological regulation of
22 sensory encoding, selective attention or working memory capacity.

23

24 The high temporal resolution of EEG offers the potential to pinpoint MPH's influence on
25 the electrophysiology of sustained attention as it unfolds in time. O'Connell and
26 colleagues (9) devised a continuous monitoring paradigm (the continuous temporal
27 expectancy task, CTET) to facilitate the identification of maladaptive patterns of EEG
28 activity that predict forthcoming lapses of attention. Neural activity in the α -frequency

29 (8-14 Hz) was predictive of lapses and was observable up to 20s in advance.
30 Interestingly, the quality of basic sensory encoding, indexed by the steady-state visual
31 evoked potential (SSVEP) was not predictive of attentional performance suggesting that
32 lapses arose primarily from a failure to sustain goal-directed attention as opposed to
33 fluctuations in visual baseline activity. Finally, the parietal P3 was reduced in amplitude
34 during lapses of attention, indicative of momentary disruption of decision-formation
35 processes.

36
37 The CTET is thus well suited to identify the neural mechanisms through which
38 monoaminergic manipulations impact sustained attention. Here, MPH was administered
39 within a placebo-controlled, double-blinded, cross-over design while participants
40 undertook the CTET EEG paradigm. We first examined the efficacy of MPH to influence
41 neural signals at different timescales: 1) across the entire task; 2) in the pre-target
42 interval; and 3) in the immediate period of target processing. Next, we established
43 whether MPH impacted all stages of stimulus processing through general effects of
44 increased arousal and bottom-up visual excitability or, alternatively, whether it acted
45 more selectively on higher-order endogenous mechanisms that support sustained
46 attention.

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57 Materials and methods

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59 Participants

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61 Forty individuals (mean age=24.3 years, SD=5.6) participated in the study. All
62 participants provided informed consent, in accordance with the ethics committee of The
63 University of Queensland. Inclusion criteria were male, aged 18-45, right-handed, non-
64 smoking, no history of drug abuse, no current use of recreational drugs, no history of
65 neuropsychiatric disorder and not currently taking psychoactive medication. A
66 consultant psychiatrist screened all participants using the M.I.N.I. Screen to confirm
67 absence of psychiatric illness (10). Participants were excluded due to contraindications
68 to the medication employed in the study (n=4) or a technical fault on day of testing
69 affecting one condition (n=3). Exclusions from the EEG analyses were due to excessive
70 EEG channel artifacts (n=4) or because participants had < 10 target hits/misses per
71 condition (n=3). We note the sample size for each analysis conducted in the results.
72 Further details regarding participant recruitment, screening, and testing can be found in
73 Barnes et al (2014) (11).

74

75 Study design and drug administration

76

77 A randomised, double-blinded, placebo-controlled, four-arm cross-over design was
78 employed (11). Each participant attended four sessions at the same time of day, spaced
79 at least one week apart. At each session, a single blue gelatine capsule containing
80 methylphenidate (MPH, 30 mg, mixed dopaminergic and noradrenergic action),
81 atomoxetine (ATM, 60 mg, primarily noradrenergic action), citalopram (CIT, 30 mg,
82 primarily serotonergic action) or placebo (PLA, dextrose) was administered. Cognitive
83 testing began 90 minutes following drug administration, coinciding with the peak

84 plasma levels for each of the study drugs (12-14) and doses were selected based upon
85 clinical relevance (15-17) and demonstrated cognitive effects (18-20).

86

87 Continuous temporal expectancy task (CTET)

88

89 Full details of the task are provided in Supplementary Materials and in O'Connell et al
90 (2009) (see also Figure 1). Briefly, the CTET(9) involves the central presentation of a
91 patterned stimulus that changes orientation at regular intervals. Participants monitored
92 the orientation transitions and made a speeded button-press when they detected
93 infrequent *targets* defined by their duration being longer (1120 ms) than the standard
94 transitions (800 ms). The discrimination of target from non-target frames thus required
95 continuous monitoring, placing significant demands on sustained attention and
96 engendering frequent attentional lapses. To avoid eye movements, participants were
97 instructed to fixate on a centrally presented white cross throughout the task. The
98 stimulus also flickered at a rate of 25 Hz in order to generate a steady-state visually
99 evoked potential (SSVEP) that served as a measure of basic visual stimulus processing.

100

101 Behavioural analysis

102

103 Performance was assessed by determining the proportion of targets that were correctly
104 identified. Reaction time was measured relative to the point at which target frames
105 became distinguishable from non-target frames (800 ms post stimulus onset). Button
106 presses were only considered to represent target detections if they occurred within 2
107 non-target frames following the target frame (1600ms). The proportion of targets
108 detected was analysed across all four conditions (MPH, ATM, CIT, PLA). As reported in
109 the results, only MPH improved sustained attention. Therefore, all subsequent analyses
110 focused on the direct comparison between the MPH and PLA conditions to isolate
111 behavioural and electrocortical changes associated with MPH. In subsequent analyses,

112 mean detection latency was calculated, and the coefficient of variation (standard
113 deviation/mean detection latency) was derived as a measure of response variability for
114 target detection. Each measure was analysed using repeated measures statistics with
115 Bonferroni correction. Subjective ratings of alertness were measured using a visual
116 analogue scale (21); see supplementary material.

117

118

119 EEG recording

120

121 EEG was recorded using an ActiveTwo BioSemi system of 64 scalp electrodes with an
122 equiradial montage (<https://www.biosemi.com/headcap.htm>), sampled at 1024 Hz.

123 Vertical eye movements were recorded with two vertical electrooculogram (EOG)
124 electrodes placed above and below the left eye, while horizontal eye movements were
125 recorded with two horizontal EOG electrodes placed at the outer canthus of each eye.

126

127 Electrophysiological Analysis

128

129 Data were pre-processed using MATLAB (The Mathworks, Inc.) and the EEGLab plug-in
130 (22). Pre-processing involved resampling the data to 512 Hz, applying a 40 Hz low-pass
131 filter and re-referencing data offline to the average of all scalp electrodes. All electrode
132 channels were subjected to an artifact criterion of 100 mV to reject trials with excessive
133 EOG or other noise transients. To remove errors that may have arisen from blinking
134 rather than true failures of attention, a 4 s interval prior to each target trial was
135 scanned, and any trial that included an artifact (100 mV) that was evident across eight or
136 more channels was excluded from all analyses.

137

138

139 Long-term analysis of the EEG amplitude spectrum: A fast-Fourier transform (FFT) was
140 carried out for all standard frames across all 10 blocks of the CTET. Amplitude spectra,
141 comprising the time period -80 to 800 ms relative to standard frame onset, were
142 extracted. Grand average spectra were obtained for activity in the α -band (8-14 Hz) and
143 the SSVEP (25 Hz) for each Drug condition (MPH, PLA). α -amplitude was measured from
144 a cluster of parietal and occipital electrodes (CPz, Pz, POz) and SSVEP amplitude was
145 measured from a midline occipital electrode (Oz) guided by field pattern distribution on
146 the scalp topographies, centred where amplitude was maximal. Paired t-tests were
147 conducted to examine differences in α -band and SSVEP amplitude and α -amplitude
148 variability (stdev/mean) as a function of drug condition.

149

150 Short-term analysis of the pre-target interval: ERP and oscillatory measures of EEG
151 activity were examined in a time period of 4 seconds that encompassed four standard
152 frames and the subsequent target frame. This time period was chosen to allow
153 investigation of pre-target activity without including activity related to previous target
154 frames, as the minimum interval between targets was 5.6 seconds. An FFT was applied
155 to derive α -band (8-14 Hz) and SSVEP (25 Hz) amplitude spectra across the epoch -3200
156 to 800 ms relative to target frame onset. Amplitude measurements were taken from the
157 same scalp sites as described above for the analysis of the whole task period.

158

159 ERP components of interest were guided by O'Connell et al (2009) (9). Time intervals for
160 the measurement of ERPs and the definition of baseline periods were in multiples of 40
161 ms, incorporating an integer number of SSVEP cycles, which prevented contamination of
162 activity by residual SSVEP power following notch filtering. The 5 frames that comprised
163 an epoch were baseline corrected separately to the time period -80 to 0 relative to each
164 frame onset. Peak amplitude measurements, relative to pre-stimulus baseline activity
165 for each component of interest were extracted. First, the visual P1 was extracted from a
166 cluster of occipital scalp electrode sites (O1, Oz, O2) between 95-135 ms. Second, a

167 frontal positive potential labeled standard-P3 was measured from a cluster of frontal
168 scalp electrode sites (FC1, FCz, FC2) between 225-285 ms. Data for each component
169 were analysed using a repeated measures ANOVA with factors, Drug (MPH, PLA),
170 Accuracy (hit, miss) and Frame (standard -4, standard -3, standard -2, standard -1, target
171 frame). The number of trials was equated for Hit and Miss conditions for each
172 participant. The mean (min, max) number of trials for the MPH condition was 46.38 (12,
173 99), and the Placebo condition was 50.34 (13, 92). There was no statistical difference in
174 number of trials across the two Drug conditions, $t < 1$.

175

176 Analysis of immediate target period: Stimulus-locked data were segmented into epochs
177 of 100 ms before to 2000 ms after target frame onset and averaged according to Drug
178 (MPH, PLA) and accuracy (Hits, Misses). Target epochs were baseline corrected to the
179 pre-stimulus interval and any epochs with absolute amplitude values exceeding 100mV
180 were excluded from analysis. The parietal P3 was confirmed by visual inspection of
181 grand-average waveforms and scalp topographies and measured from scalp electrode
182 site Pz. The width of the latency window used to measure component peak amplitudes
183 was 1250ms to 1800ms relative to the onset of the target frame. The P3 onset latency
184 was calculated as the time point at which the P3 signal reaches half of its peak voltage
185 (23). P3 peak latency variability was calculated using the coefficient of variation (peak
186 amplitude variability/mean amplitude).

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199 Results

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201 Behavioural analysis

202

203 There was a significant effect of drug across all conditions ($n=33$) on the proportion of
204 targets detected (see Table 1), $F(3,96)=14.42$, $p<.0001$, $\eta^2p = .31$. Pairwise comparisons
205 showed that MPH increased the proportion of targets detected relative to placebo
206 ($p=.001$), ATM ($p=.0001$) and CIT ($p=.0001$). ATM was not significantly different from PLA
207 ($p = .671$). There was a marginal reduction of performance in the CIT condition
208 compared to PLA ($p = .033$) but this did not survive Bonferroni correction ($p < .01$).

209

210 Subsequent analysis was restricted to MPH vs. PLA ($n=36$). MPH had no significant
211 impact on Reaction Time (RT), $t(35) = 1.54$, $p = .13$, $d = 0.26$. However, we found that
212 participants' RT variability, as measured by the coefficient of variation, was reduced in
213 the MPH condition compared to the PLA condition, $t(35) = 3.42$, $p = .002$, $d = 0.56^1$ (see
214 Table 2). Individual subject data are summarised in supplementary Fig. S2.

215

216 A 2×10 ANOVA with the factors, Drug (MPH, PLA) and Block (1 to 10) was conducted to
217 examine time-on-task effects on the target detection accuracy. There was a Drug \times
218 Block interaction, $F(9, 279) = 2.38$, $p = .013$, $\eta^2p = .07$, driven by a marked linear
219 decrease in performance in the PLA condition with time ($p = .0001$, $\eta^2p = .36$), which was
220 offset by MPH ($p = .84$) (see supplementary Fig. S1a).

221

222

223

224

225

¹ N.b. The behavioural effects for target detection ($p = 0.0001$) and RT variability ($p = 0.003$) remained when conducted on the smallest subset of the sample ($n=29$) used for EEG analysis.

226 Electrophysiological Analysis²

227

228 Long-term drug effects on the EEG amplitude spectrum

229

230 We first examined EEG spectral amplitude changes induced by MPH across the entire
231 task ($n=32$), averaged across all non-target frames (See Figure 2).

232

233 *Parietal Alpha (8-14 Hz)*: Participants exhibited a reduction in mean α -amplitude in the
234 MPH compared with PLA condition, $t(31) = 2.63$, $p = .013$, $d = 0.46$. We also observed a
235 decrease in mean α -amplitude variability in the MPH compared with the PLA condition,
236 $t(31) = 2.58$, $p = .015$, $d = 0.46$.

237

238 A subsequent Drug x Block analysis of mean α -amplitude revealed a main effect of
239 Block, $F(9, 279) = 2.19$, $p = .023$, $\eta^2 p = .07$, indicative of a time-on-task increase in α -
240 amplitude from its lowest amplitude in block 2 to its highest in the last block ($p = .01$,
241 $\eta^2 p = .2$). See supplementary Fig. S1b. There was no Drug x Block interaction, $F < 1$.

242

243 *SSVEP (25Hz)*: SSVEP amplitudes over occipital scalp were not significantly influenced by
244 Drug condition, $t < 1$, indicating that basic visual processing was not significantly
245 enhanced by MPH. However, Bayesian analysis did not provide evidence in favour of the
246 null hypothesis of no difference between conditions, $B_{H(0,10)} = 0.98^3$.

247

248

249

250

251 Short-term drug effects in the pre-target interval

² Tables of means and standard deviations are presented for all EEG analyses in the supplementary materials.

³ Criteria for calculating Bayes Factors are described in the supplementary materials.

252

253 Divergences in spectral and ERP amplitude changes were analysed within a 4 s time-
254 frame before target onset as a function of Drug condition ($n=29$) (See Figure 3).

255

256 *Parietal Alpha (8-14 Hz)*: A 2×2 ANOVA, with the factors Drug (MPH, PLA) and
257 Accuracy (Hit, Miss), revealed a main effect of Accuracy, $F(1,28) = 6.91$, $p = .014$, $\eta^2 p =$
258 $.20$, indicating reduced α -amplitude prior to target hits compared to target misses.
259 There was also a main effect of Drug, $F(1,28) = 4.63$, $p=0.04$, $\eta^2 p = .14$, driven by reduced
260 α -amplitude in the pre-target period for the MPH compared with PLA condition. There
261 was no Drug \times Accuracy interaction, $F < 1$.

262

263 *SSVEP (25 Hz)*: A further 2×2 ANOVA found no main effect of Drug, $F < 1$, Accuracy, $F <$
264 1 , or Drug \times Accuracy interaction, $F(1, 28) = 1.82$, $p = .19$, $\eta^2 p = .06$

265

266 *P3 to standards*: P3 peak amplitude measures were entered into a $2 \times 2 \times 5$ ANOVA
267 with factors of Drug (MPH, PLA), Accuracy (Hit, Miss) and Frame, representing each
268 frame in the 4 s interval up to the target frame (i.e. standard -4, standard -3, standard -
269 2, standard -1, target frame). There was a significant main effect of Accuracy, $F(1,28) =$
270 49.07 , $p < .0001$, $\eta^2 p = .64$, indicating larger P3 peak amplitudes prior to hits than
271 misses. However, there was no main effect of Drug, $F(1,28) = 2.61$, $p = .117$, $\eta^2 p = .09$, or
272 Frame, $F(4, 112) = 2.28$, $p = .07$, $\eta^2 p = .08$, and no significant interactions for Drug \times
273 Accuracy, $F(1,28) = 2.60$, $p = .12$, $\eta^2 p = .08$, nor Drug \times Accuracy \times Frame, $F < 1$. There
274 was however a significant Drug \times Frame interaction, $F(4, 112) = 2.59$, $p = .04$, $\eta^2 p = .09$.
275 Polynomial contrasts revealed a linear trend in the MPH condition with increasing P3
276 amplitude across non-target frames until the target frame ($p = .017$, $\eta^2 p = .19$), which
277 was absent in the placebo condition ($p = .62$). The numerical increase in the P3
278 amplitude across frames in the MPH condition was significantly different from the
279 placebo condition on the target frame ($p = .003$, $d = 0.6$).

280

281 *Occipital P1*: A further $2 \times 2 \times 5$ ANOVA was conducted for the peak P1 amplitude
282 measures. There was no significant effect of Drug, $F < 1$. Further, Bayesian analysis did
283 not find evidence in support of the null hypothesis predicting no difference between
284 conditions, $B_{H(0,27)} = 0.63$. There were no effects of Accuracy, $F < 1$, Frame, $F(4, 112) =$
285 $3.08, p = .067, \eta^2 p = .10$, Drug \times Accuracy, $F(1, 28) = 2.05, p = .16, \eta^2 p = .07$, or Drug \times
286 Accuracy \times Frame interaction, $F < 1$.

287

288 *Drug effects on target processing*

289

290 To examine the effects of Drug and Accuracy on immediate target processing ($n=33$),
291 three features of the parietal P3 component – peak amplitude, peak latency variability
292 and onset latency – were analysed with 2×2 factorial ANOVAs. Figure 5 illustrates the
293 amplitude and onset latency effects for the parietal P3.

294

295 *Parietal P3 peak amplitude*: We observed a main effect of Accuracy, $F(1,32) = 57.35, p$
296 $<.0001, \eta^2 p = .64$, driven by greater peak amplitudes on target hits compared with
297 misses. There was also a main effect of Drug, $F(1,32) = 25.99, p <.0001, \eta^2 p = .45$,
298 indicating greater peak amplitudes under MPH compared with PLA, and there was no
299 Drug \times Accuracy interaction, $F(1,32) = 1.92, p = .18, \eta^2 p = .06$

300

301 *Parietal P3 onset latency*: Onset latency was significantly earlier for target hits
302 compared with misses, $F(1,32) = 45.62, p <.0001, \eta^2 p = .59$ but there was no effect of
303 Drug $F(1,32) = 1.26, p = .27, \eta^2 p = .04$ and no Drug \times Accuracy interaction, $F < 1$.

304

305 *Parietal P3 peak latency variability*: There was a main effect of Accuracy, $F(1,32) = 7.04,$
306 $p = .01, \eta^2 p = .18$, indicating that peak latency variability was reduced on target hits

307 compared with misses. There was no effect of Drug, $F < 1$, or Drug \times Accuracy
308 interaction, $F < 1$.
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310 Discussion

311

312 This study examined the modulation of electrophysiological precursors of lapsing
313 attention by MPH. Our findings demonstrate that MPH affects both the oscillatory
314 dynamics in the α -band during sustained attention and shorter-term ERP signals in the
315 period before and during target processing. MPH acts to avert lapses of attention and
316 time-on-task performance decrements by reducing maladaptive neural synchronisation
317 in the α -band over a broader time-scale, indicative of a change in attentional state or
318 tonic alertness. Further, MPH led to a reduction in α -variability indicating that such
319 fluctuations were less frequent. MPH affected the frontal P3 signal, which showed a
320 linear increase in amplitude in the pre-target period, indicative of improved task
321 monitoring. The parietal P3 peak amplitude during the target frame was also modulated
322 by MPH suggesting that the drug refines endogenous mechanisms that support the
323 temporal integration of perceptual evidence required for target detection. By contrast,
324 there was no significant effect of MPH on early sensory processing, measured by SSVEP
325 (25 Hz) and visual P1 amplitude.

326

327 These data demonstrate that attentional enhancement by MPH is supported by
328 augmentation of electro-cortical signals across multiple times-scales, from shorter-term,
329 phasic increases in target-related activity (P3) to longer-term tonic suppression of neural
330 synchronisation and variability in the α -band. In so doing, this study identifies novel
331 markers to further understand the physiology of disorders of attention, such as ADHD,
332 or to be leveraged as surrogate endpoints for pharmacological interventions.

333

334 Greater α -band activity has previously been shown to be a strong predictor of
335 attentional lapses during the CTET (9) and we replicate this effect here. Importantly, we
336 also found that MPH suppressed α -amplitude and rendered oscillatory α -activity less
337 variable across the entire task. Furthermore, α -amplitude increased with time-on-task in

338 both conditions but remained at a lower amplitude throughout in the MPH condition,
339 suggesting that the threshold at which mental fatigue compromises sustained attention
340 may be increased with MPH. Increased α -amplitude has traditionally been thought to
341 reflect cortical idling (24) and is associated with the emergence of a resting state (25,
342 26) in which goal-directed processes are diminished in the absence of task engagement.
343 An alternative view, based on the α -inhibition hypothesis (27), proposes that α -
344 synchronisation reflects re-allocation of attention from an outward to an inward focus
345 (28, 29), thus inhibition of task processing may occur during periods of task-unrelated
346 thought that culminate in error.

347

348 Simultaneous EEG-fMRI has demonstrated that α -oscillations correlate with a cingulo-
349 insular-thalamic network, which have been implicated in the maintenance of tonic
350 alertness (30). It is noteworthy that MPH not only suppressed α -activity but also
351 minimised the frequency of α -signal fluctuations (after controlling for differences in
352 amplitude), facilitating the maintenance of more stable α -levels associated with
353 improved behavioural performance. This effect is of significance given greater trial-by-
354 trial performance variability (31, 32) and neural variability (33) are prominent features in
355 clinical disorders of attention such as ADHD. A potential mechanism by which MPH
356 could modulate EEG alpha is through an agonistic effect on D2 receptors located in the
357 thalamus (34) and stimulation of dopaminergic transmission via thalamocortical and
358 mesocortical pathways.

359

360 There was no significant neuromodulatory effect of MPH on early visual activity,
361 measured by SSVEP amplitude across the entire task and neither the drug nor attention
362 performance affected SSVEP or P1 amplitude during the pre-target 4 s period. However,
363 Bayes Factors calculated for these non-significant effects of drug revealed no
364 substantive evidence in support of the null hypothesis. Nevertheless, it appears
365 reasonable to conclude that, if MPH does impact on early visual processing, its effects

366 are weak in comparison to the much stronger changes observed in posterior α -band
367 activity.

368

369 In addition to changes in α -activity over longer timescales, we also observed short-term
370 changes in P3 signals. We found that a frontal P3 component was diminished in
371 amplitude prior to misses in the pre-target interval, reproducing the same effect
372 observed by O'Connell and colleagues (9) Furthermore, we found that MPH induced a
373 linear increase in P3 amplitude in the pre-target period. These short-term changes
374 suggest that MPH may help offset transient disengagement of monitoring processes
375 that foreshadow lapses of attention. Previous work has shown that P3 amplitude is
376 enhanced by improved regularity of perceived rhythm (35) and enhanced attention to
377 the regularity of the temporal pattern of the CTET may, in part, underlie the increase in
378 P3 amplitude with MPH.

379

380 MPH also increased the amplitude of the parietal P3 during target detection. Recent
381 research suggests that a centro-parietal positive (CPP) waveform bears a strong
382 functional similarity to the parietal P3 and has a specific role in the formation of target
383 decisions (36). The dynamics of this signal traces cumulative evidence of perceptual
384 information as it evolves over time and can be clearly dissociated from signals that
385 represent the sensory evidence (e.g., SSVEP) or motor preparation (e.g., left hemisphere
386 beta band activity) (37). In the current study, the target frame could only be
387 discriminated from a standard frame on the basis of a temporal judgment - in all other
388 respects, the target and standard frames were perceptually the same. We interpret the
389 parietal P3, as functionally equivalent to the CCP, and reflecting an endogenous process
390 of accumulating perceptual information to support a target decision. MPH therefore
391 engenders greater accumulation of perceptual evidence, and we note that under MPH,
392 even the attenuated P3 signal for missed targets was greater in amplitude than in the
393 placebo condition and, hence, nearer a threshold level for detection. In addition to its

394 effect on the dopaminergic system, animal studies have reported that MPH exerts
395 modest changes in locus coeruleus-noradrenergic (LC-NA) discharge (38). It is therefore
396 possible that the MPH-related enhancement of the P3 may, in part, reflect
397 noradrenergic modulation because of the strong similarities between the P3 and the
398 phasic LC-NA responses (39, 40).

399

400 In conclusion, the indirect agonistic effect of MPH on dopamine and noradrenaline
401 affected the electrophysiological signatures of sustained attention over different time-
402 scales. We observed suppression of α -amplitude and variability supporting maintenance
403 of tonic alertness over longer time-scales and the enhancement of P3 event-related
404 components supporting task-related endogenous processes over shorter time-scales. At
405 both time-scales there was an absence of change to bottom-up sensory excitability with
406 MPH. These findings show specificity in the electrophysiological basis by which MPH
407 improves sustained attention and decision-making offering candidate markers for
408 remediation of clinical disorders of attention

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419

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422

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Table/Figure Legends

Table 1. Proportion of targets detected for the Methylphenidate (MPH), Atomoxetine (ATM) Citalopram (CIT) and Placebo (PLA) conditions (n=33).

Table 2. Behavioural Results (n=36) for Methylphenidate (MPH) vs. Placebo (PLA). Mean (standard deviation) for the proportion of targets detected, reaction time (RT) and the coefficient of variation (RT standard deviation/RT mean).

Figure 1. Task Schematic for Continuous Temporal Expectancy Task (CTET). Participants monitored a continuous stream of patterned stimuli centrally presented and flickering at a rate of 25 Hz. Standard stimuli were presented for 800 ms, and participants were required to monitor for the occurrence of target stimuli defined by their longer duration (1120 ms) relative to other stimuli. Target detection was indicated by a speeded button press. All participants were practiced to a criterion level of performance and completed 10 blocks of the task.

Figure 2. (A) Fast Fourier Transform (FFT) showing suppression of α band amplitude (8-14Hz) in MPH vs. PLA condition, shown for posterior scalp site (Pz). Inset figure: α band amplitude variability (stdev/mean) for each subject, showing that MPH reduces alpha signal variability in the vast majority of subjects. (B) FFT showing parity of SSVEP (25 Hz) amplitude in MPH vs. PLA condition.

Figure 3. (A) FFT showing greater suppression of α band amplitude (8-14 Hz) in 4 s period prior to a 'hit' vs. a 'miss' Greater suppression is also observed in this period for MPH vs. PLA (shown for parietal scalp site Pz). (B) FFT showing no changes in SSVEP (25 Hz) amplitude in the pre-target 4 s interval as a function of accuracy or drug condition (shown for occipital scalp site Oz).

Figure 4. (A) Grand-average frontal P3 waveform for five frames in the 4 s interval preceding the target. The P3 was predictive of accuracy exhibiting greater peak amplitudes prior to a hit than a miss. There was a systematic linear increase in P3 amplitude across frames in the MPH condition but not in the PLA condition. Differences between MPH and PLA were apparent on the final target frame. (B) Grand-average Occipital P1 waveform. No changes in the P1 component were observed in the pre-target 4 s interval as a function of accuracy or drug condition.

Figure 5 . Grand-average parietal P3 component stimulus locked to the onset of the target (shown for parietal scalp site Pz). In the MPH condition, compared to placebo, there was an increased peak P3 amplitude. There was also a greater peak amplitude on target hits compared to target misses. Furthermore, onset latency was earlier for target hits compared to misses. There was no effect of drug on onset latency of the P3. Note that a target frame can only be identified by participants when the frame duration passes that of a standard frame (800 –1120 ms). We describe this period as the target interval and it is marked by dashed vertical lines

TABLE 1

	Methylphenidate (MPH)	Atomoxetine (ATM)	Citalopram (CIT)	Placebo (PLA)	<i>p</i> value & effect size
Mean proportion of targets detected (n=33)	0.75 (0.22)	0.63 (0.20)	0.60 (0.23)	0.64 (0.24)	$p < .0001$, $\eta_p^2 = .31$

TABLE 2

	Methylphenidate (MPH)	Placebo (PLA)	<i>p</i> value & effect size
Mean proportion of targets detected (n=36)	0.74 (0.21)	0.63 (0.23)	$p = 0.0001$, $d = 0.78$
Mean reaction time (RT); ms	581 (109)	602 (96)	$p = .13$, $d = 0.26$
Mean coefficient of variation; std/mean RT	0.22 (0.04)	0.24 (0.06)	$p = .002$, $d = 0.56$

FIGURE 1

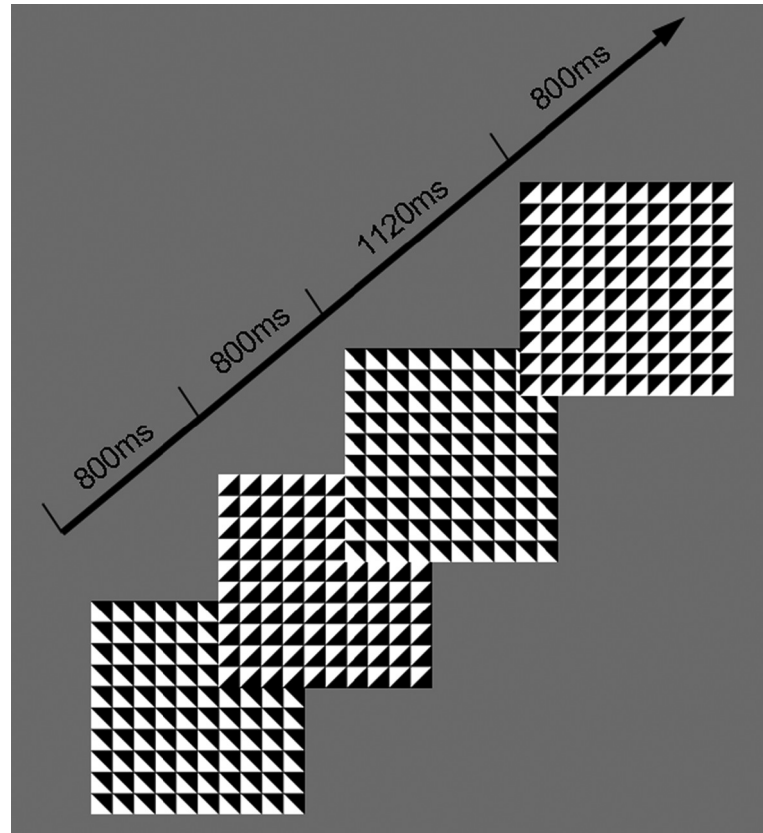


FIGURE 2

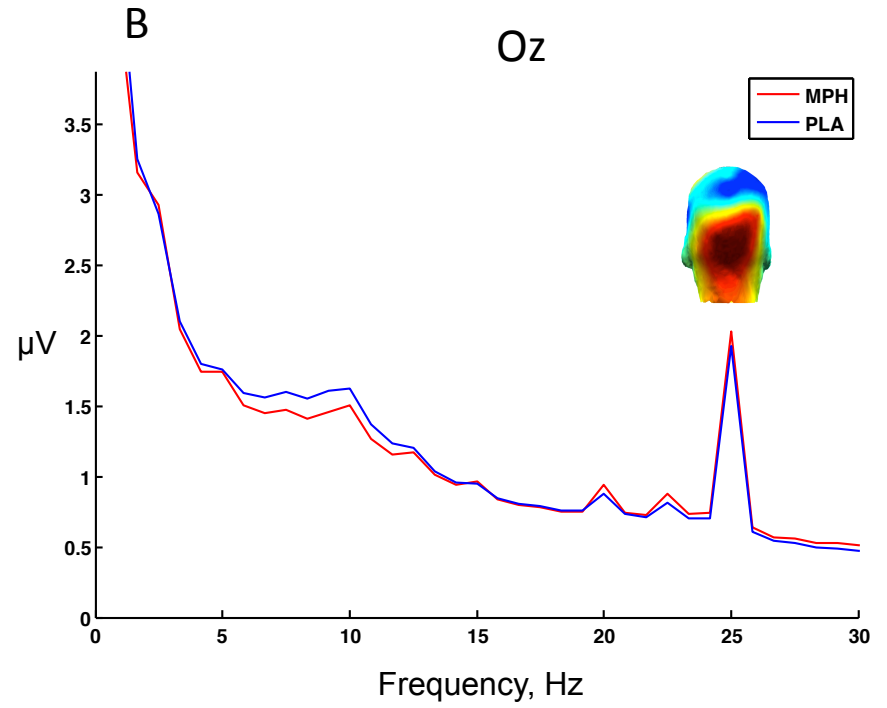
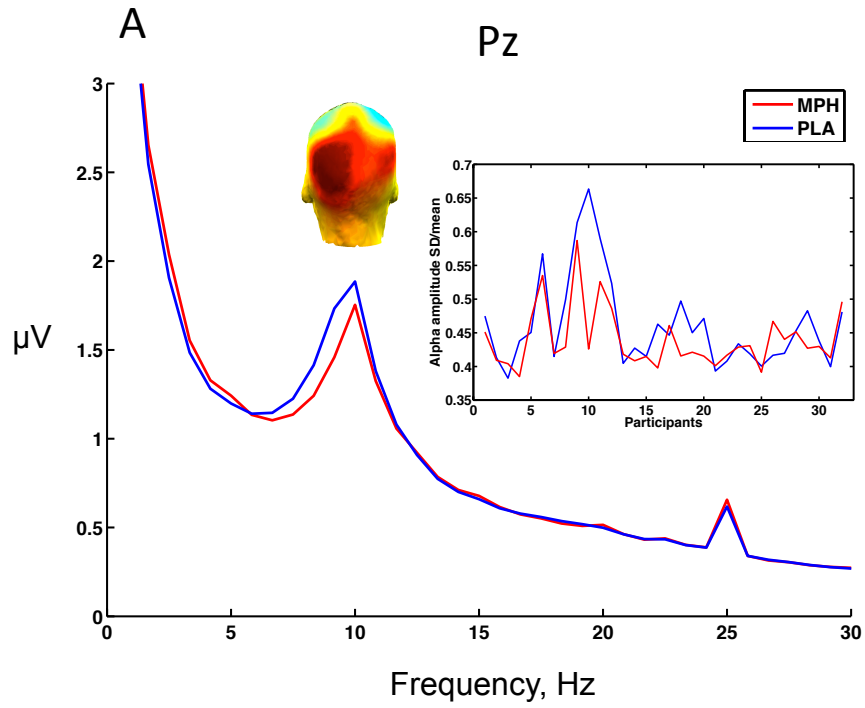


FIGURE 3

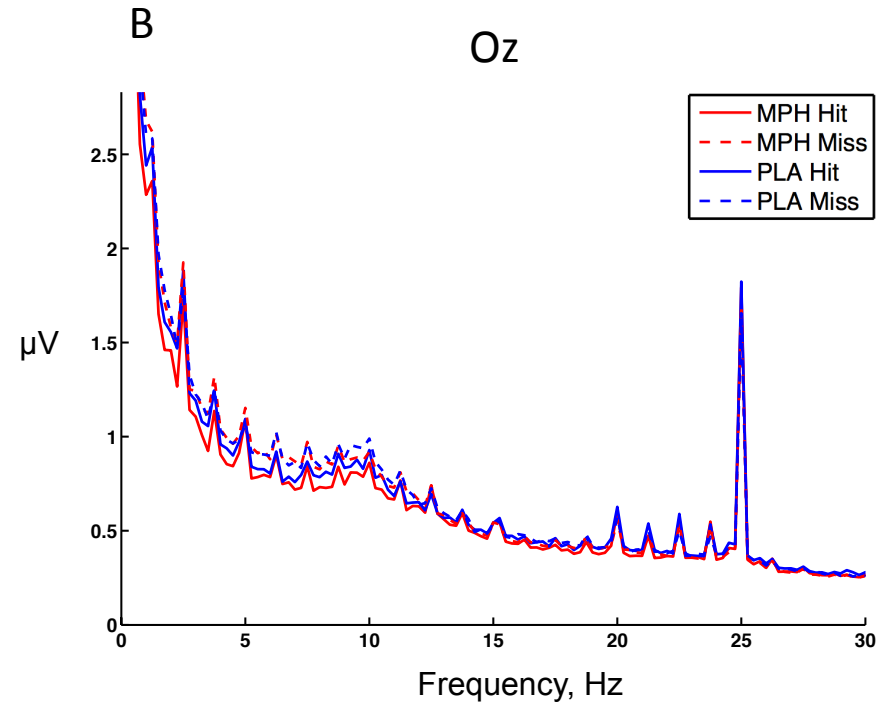
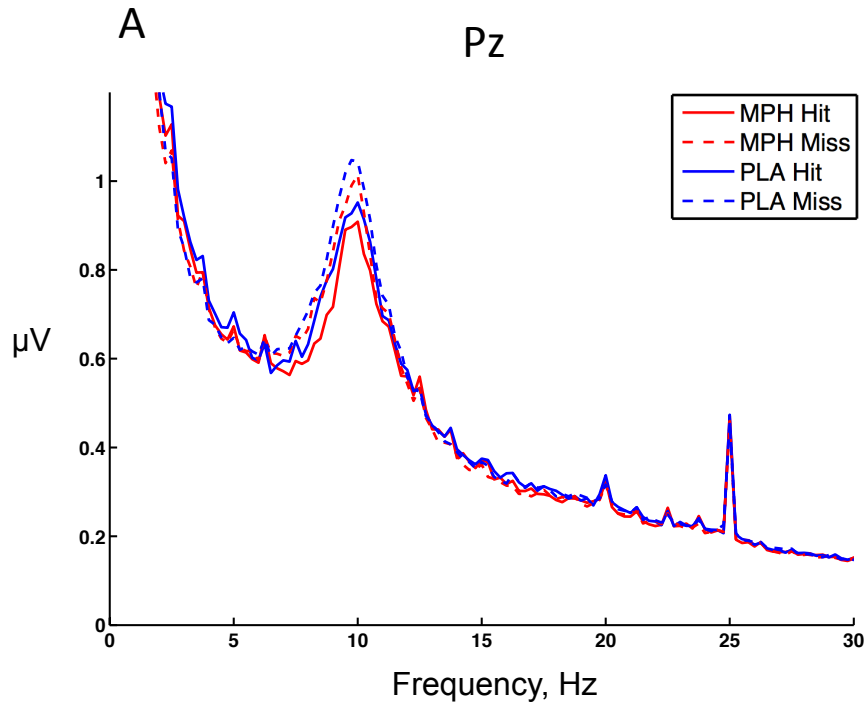


FIGURE 4

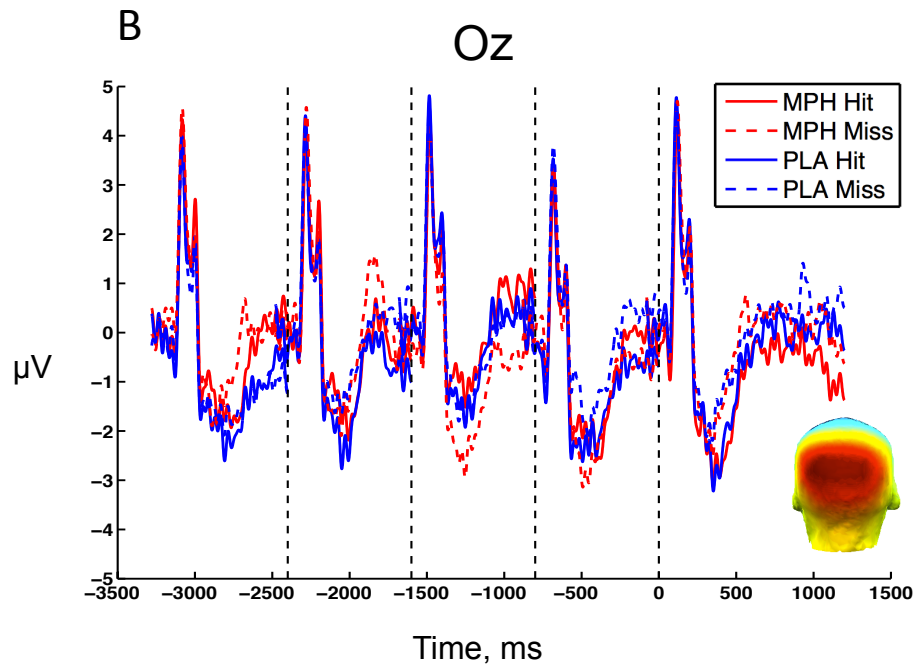
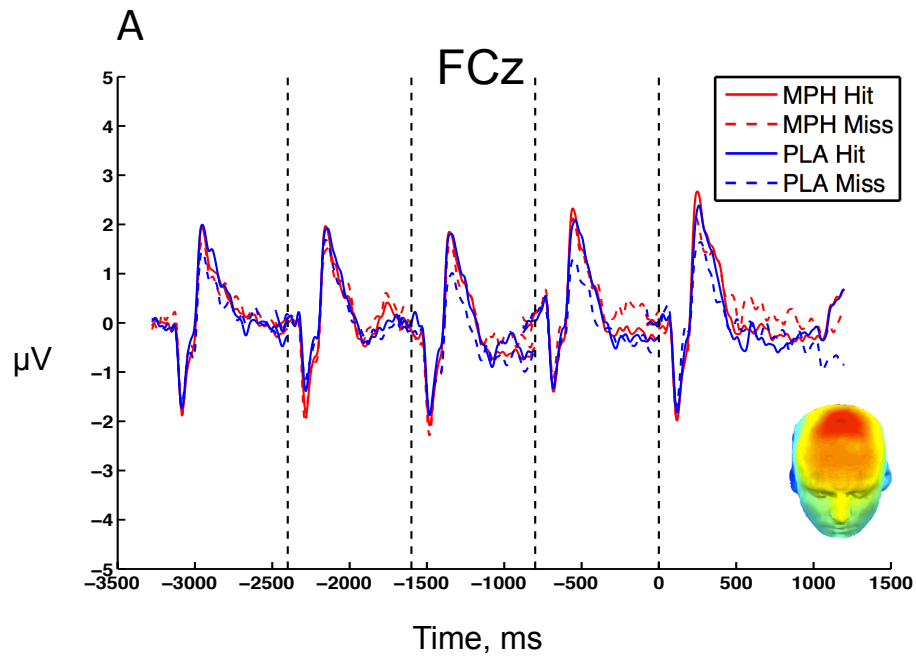


FIGURE 5

