

- **BCI** performance and brain metabolism profile in severely brain-injured patients
- 2 without response to command at bedside
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19 Abstract

- 20 Detection and interpretation of signs of 'covert command following' in patients with disorders of
- 21 consciousness remains a challenge for clinicians. In this study, we used a tactile P3-based BCI in 12
- 22 patients without behavioral command following, attempting to establish 'covert command
- 23 following'. These results were then confronted to cerebral metabolism preservation as measured with
- 24 glucose PET (FDG-PET).
- 25 One patient showed 'covert command following' (i.e., above-threshold BCI performance) during the
- 26 active tactile paradigm. This patient also showed a higher cerebral glucose metabolism within the
- 27 language network (presumably required for command following) when compared with the other
- 28 patients without 'covert command-following' but having a cerebral glucose metabolism indicative of
- 29 minimally conscious state.
- 30 Our results suggest that the P3-based BCI might probe 'covert command following' in patients
- 31 without behavioral response to command and therefore could be a valuable addition in the clinical
- 32 assessment of patients with disorders of consciousness.

33 Introduction

- 34 Severely brain-injured patients with disorders of consciousness (DOC) can be distinguished by their
- 35 ability to show either only reflexive and thus unconscious behavior (unresponsive wakefulness
- 36 syndrome, UWS)¹, or more purposeful reactions to the environment without (minimally
- 37 consciousness state minus, MCS-) or with signs of language preservation such as response to
- 38 command (minimally consciousness state plus, MCS+)^{2,3}. A clinical challenge presents itself when
- 39 diagnosing patients correctly, yet, accurate diagnosis is key for treatment and prognosis. Indeed,
- 40 patients with residual consciousness have increased chances of recovery and respond better to various
- 41 treatments such as tDCS⁴, possibly modulating cortical excitability in DOC patients⁵, and
- 42 amantadine⁶.
- 43 Structured behavioral assessment, such as the Coma Recovery Scale-Revised (CSR-R), led to an
- 44 important reduction of the misdiagnosis rate⁷, especially when the behavioral assessment is repeated
- 45 at least five times⁸. In addition, passive neuroimaging techniques can quantify structural and
- 46 functional brain damage, and could ultimately be used as supplemental tools for diagnosis $^{9-12}$.
- 47 Among them, 18F-fluorodeoxyglucose positron emission tomography (FDG-PET) has been used to
- 48 indicate that the absence of overt signs of consciousness does not necessarily indicate that the patient
- 49 is unconscious¹³. Resting state EEG can be used to passively assess DOC patients' consciousness
- 50 level, for which spectral measures and functional connectivity are most successful and widely
- 51 employed (for review see¹⁴).
- 52 Active ways of assessing covert consciousness and command following are more challenging as it
- 53 necessitates cognitive integrity for command following (e.g., language comprehension, memory)¹⁵.
- 54 However, it brings additional key information as patients showing early signs of (covert) command
- 55 following have a better chance of good outcome¹⁶. Furthermore, command following can potentially
- 56 be used to establish functional communication which could dramatically increase the patient's quality
- 57 of life.
- 58 About one decade ago, the first evidence for 'covert command following' in absence of overt
- 59 command following was reported using functional MRI¹⁷, further used a couple of years later to
- 60 enable an MCS- patient to functionally communicate^{18,19}. However, fMRI is expensive and hardly
- 61 accessible for repeated assessments. For this reason, other techniques that can measure voluntary
- responses not observable at bedside have been used to assess 'covert command following'. EEG-
- 63 based detection of motor imagery showed their potential to establish command following in about
- 64 20% of the patients with $DOC^{20,21}$. The P3 event related potential (ERP), which is observed about
- 65 300-500ms after the presentation of a deviant sensory stimulus in a train of standard stimuli, reflects
- 66 the novelty of the stimulus. The P3 can be present in varying levels of consciousness, for example in
- 67 response to the subjects' own name 22,23 , and it is less sensitive than spectral and connectivity
- 68 measures in discriminating between UWS and MCS patients²⁴. Nevertheless, it is also known that
- attention (which requires consciousness, by definition) can modify the amplitude of the P3 (for
- review²⁵). Other systems, that do not depend on brain activity directly, used subliminal limb
- 71 movements (i.e., electromyogram) ^{26,27}, modulation of breathing ²⁸ or of pH saliva²⁹, pupil dilation

- 72 during mental effort ³⁰ for detecting command following and communication in DOC or locked in
- 73 syndrome patients (i.e., fully paralyzed but conscious). However, all these techniques are relying on
- experts for data acquisition and offline data analysis, and tools that can be directly implemented in
- 75 clinical setting for non-experts are needed.
- 76 In this prospective study, we used a commercially available P3-based BCI system with direct
- 77 feedback about the patient's performance in clinically well-characterized patients with DOC. Our aim
- 78 was to identify patients with signs of 'covert command following', and compare those results to
- cerebral glucose metabolism preservation as measured with FDG-PET¹³. A secondary aim was to
- 80 investigate whether there is a relationship between the BCI performance and the level of
- 81 consciousness (as defined by the CRS-R and the FDG-PET) at the group level.

82 Methods

83 Subjects

84 The study was conducted from November 2015 till July 2016 and included a convenience sample of

85 12 adult patients. Inclusion criteria were patients with DOC without response to command (i.e., UWS

- 86 or MCS-) after a period of coma and the availability of FDG-PET within one week of the BCI
- 87 assessment. Exclusion criteria were being less than 16years old, history of developmental,
- 88 neurologic, or major psychiatric disorder resulting in functional disability before the insult, and being
- 89 in a (sub-)acute stage after injury (<3 months). All patients were hospitalized for one week in the
- 90 University Hospital of Liège for a thorough clinical assessment of their medical and cognitive status.
- 91 This assessment included FDG-PET, MRI, EEG and repeated behavioral assessments with the CRS-
- 92 R. Diagnosis of UWS or MCS- was based on the best out of a minimum of five CRS-R assessments
- 93 during this one-week hospitalization. The ethics committee of the Faculty of Medicine of the
- 94 University of Liège approved the study, and written informed consent was obtained from the
- 95 patient's legal representative in accordance with the Declaration of Helsinki.
- 96 BCI assessment and data processing
- 97 Hard- and software were developed by g.tec (mindBEAGLE g.tec Guger Technologies OG, Graz,
- Austria). Data were recorded from 8 active gel electrodes (Fz, Cz, C3, C4, CPz, CP1, CP2, Pz)
- sampled at 256Hz, referenced to the mastoids, and filtered between 0.1-30Hz using a Butterworth 4th
- 100 order filter. The BCI analyzed the P3 event related potential for the assessment of 'covert command
- 101 following' and potentially communication.
- 102 The employed oddball paradigms administered mechanical vibrations with a frequency of 225Hz,
- 103 which lasted for 30ms, with an inter-stimulus interval of 270ms. A total of 480 stimuli were
- 104 presented, resulting in a paradigm duration of 2.4 minutes. In the first paradigm, the vibrotactile with
- 105 two stimuli (VT2), stimuli were presented on the left (probability of 7/8) and right (probability of
- 106 1/8) wrist. Before the start of the session, the patient was aroused if needed (i.e., the patient presented
- 107 multiple episodes of eye closure during the CRS-R before the BCI assessment) and instructed to
- 108 mentally count the stimuli presented on the right wrist. If the patient showed eye closure lasting

- 109 longer than 10 seconds, the paradigm was paused, the patient was aroused (using the CRS-R arousal
- 110 facilitation protocol) and the instructions were repeated before continuation of the paradigm. In case
- of a BCI performance above 70% during the VT2 paradigm (without artefacts from the mechanical vibrations), the result was considered above chance level and the test was extended with a third
- stimulator (VT3). The threshold of 70% was chosen because it is suggested to be the minimal
- required performance allowing effective communication using a BCI³¹. The VT3 paradigm includes a
- stimulator on the right foot which then acts as standard stimulus (probability of 6/8), and the
- stimulators on the left and right wrists deliver deviant stimulations each with a probability of 1/8. The
- subject was instructed through headphones which hand to attend for every block, and mentally count
- 118 the number of deviant stimulations. Four blocks of 15 target deviant (and 15 non-target deviant plus
- 119 90 standard) trials randomly assigned to the left and right wrist, were presented. After this initial
- 120 training phase, 6 autobiographical questions were asked to the patient. In order to answer, the patient
- 121 was instructed to concentrate on the left hand for answering "yes", and on the right hand for
- 122 answering "no" during a 30-second period.

123 Data for ERP's was extracted from -100 to 600 around stimulus onset. Trials with an amplitude

124 exceeding $100\mu V$ were rejected from the further analysis. Baseline correction was done using the

125 100ms before stimulus onset. The 600ms after stimulus onset was down sampled to 7 samples. The

126 data processing classified deviant trials using a linear discriminant analysis with 56 features (7 time-

- 127 points of the down-sampled ERP, for 8 channels). The BCI performance (i.e., the percentage of
- 128 detected deviant trials), ranging from 0 to 100%, was calculated using a 10-fold cross-validation. For
- 129 more detailed information on the stimulus presentation and analysis, please refer to previous
- 130 studies^{32,33}.

131 FDG-PET acquisition and processing

132 Resting 18F-FDG-PET acquisition was performed about 30 minutes after intravenous injection of

approximately 150MBq radioactive labelled glucose (Gemini TF PET-CT scanner, Philips Medical

134 Systems) in order to quantify cerebral glucose uptake. A low dose CT was acquired prior the 12-

minute emission scan and used for attenuation correction. PET images were reconstructed using the iterative LOR RAMLA algorithm and correction for dead-time, random events and scatter were

137 applied.

138 Preprocessing and statistical analysis were done in the Statistical Parametric Mapping toolbox

139 (SPM12, www.fil.ion.ucl. ac.uk/spm) implemented in MATLAB (R2017a). Preprocessing was done

140 as described previously¹³. Briefly, images were manually reoriented according to the SPM12 FDG-

141 PET template, spatially normalized (using a template for patients and controls) and smoothed (with a

- 142 14mm FWHM Gaussian kernel).
- 143 Statistics

144 We identified regions that showed preserved cerebral glucose metabolism in patients who showed

145 'covert command following' as compared with patients with a FDG-PET typical for MCS¹³ who did

146 not show signs of 'covert command following'. This was done using a factorial design with four

- 147 design matrices. Clusters with preserved metabolism were considered significant at FWE p<0.05.
- 148 The mean glucose uptake (in MBq/cc) of the largest significant cluster was extracted for these six
- 149 subjects using Marsbar (version 0.44, http://marsbar.sourceforge.net/).
- 150 Additionally, for every subject, we identified regions with relative preserved metabolism compared
- to 34 healthy subjects to obtain a FDG-PET-based diagnosis, as described in more details
- 152 elsewhere¹³. A Wilcoxon rank-sum test and chi-square test were used to assess the difference in age
- and gender between patients and healthy subjects used for the FDG-PET analysis. The CRS-R and
- 154 FDG-PET based diagnosis were confronted to the VT2 BCI performance at the group level using a
- 155 Wilcoxon rank-sum tests.

156 **Results**

- 157 Twelve patients were included in the study, of which four MCS- patients (age median=47.5, IQR=20
- 158 years; disease duration median=7.5, IQR=7.75 months; 3 males; 3 TBI, 1 anoxia), and eight UWS
- patients (age median=43.5, IQR=25.5 years; disease duration median=50, IQR=30.5 months; 4
- 160 males; 2 TBI, 5 anoxia, 1 hemorrhage). The VT3 was performed in only one patient (MCS1), for
- 161 whom the BCI performance during the VT2 and VT3 reached 100% and 70% respectively. The BCI
- 162 decoded an answer for one out of six questions, but the BCI did not decode replies during further
- 163 attempts. This patient showed a preserved metabolism within the left hemisphere (i.e., language
- 164 network) as compared to the other patients with a FDG-PET indicative of MCS (Figure 1). This
- 165 preservation was confirmed when compared with healthy subjects (Figure 2).
- 166 All patients behaviorally diagnosed as MCS showed cortical metabolism preservation in accordance
- 167 with a diagnosis of MCS. Six out of eight patients diagnosed as UWS had a FDG-PET in agreement
- 168 with the CSR-R based diagnosis, while the other two patients showed preserved cortical glucose
- 169 metabolism suggestive of MCS. The patients and healthy subjects used for the FDG-PET-based
- 170 diagnosis did not differ in age (Z = 0.32, p=0.75) or gender (χ^2 (1) =1.98, p=0.16). Patients'
- demographics, BCI performance, and FDG-PET diagnoses are reported in Table 1. BCI responses
- and preserved metabolism as compared to healthy subjects are presented in Figure 2 for three patients
- 173 (i.e. one UWS patient, one MCS- patient, and the patient with 'covert command following').
- 174 At the group level, the BCI performance during the VT2 paradigm was lower for UWS than for MCS
- 175 patients (UWS median=10, IQR=30; MCS median=22.5, IQR=47.5; Z = 2.10, p = 0.04). When
- 176 comparing the BCI performance with the FDG-PET diagnosis, the performance during the VT2
- paradigm was also lower for UWS than for MCS patients (UWS median=10, IQR=40; MCS
- 178 median=20, IQR=15; Z=2.09, p = 0.04).

179 **Discussion**

- 180 In this prospective study, we used a commercially available P3-based BCI system in a convenience
- 181 sample of 12 clinically well-characterized patients with DOC.

182 We identified a patient with signs of 'covert command following', and compared those findings to 183 cerebral glucose metabolism preservation of patients without signs of 'covert command following'.

184 We have found that one behaviorally MCS- patient (i.e. showing visual pursuit but no response to 185 command at bedside) was able to show 'covert command following' using the VT3 paradigm (i.e. 186 attended towards the left or the right stimulated hand, as requested). This patient, who showed 187 'covert response to command', had an FDG-PET in agreement with the diagnosis of MCS¹³. This patient had already been assessed by our group about 1.5 years before and had been diagnosed in a 188 189 clinical state of MCS-. The week of the BCI assessment, MRI examination showed a grey matter 190 atrophy most severe in subcortical areas and in the middle and posterior cingulum, but relatively limited in other cortical areas, suggesting a higher level of consciousness³⁴. The clinical EEG showed 191 a 5Hz rhythm, which has been associated to a higher chance of being MCS+ (as compared to MCS-192 193 ¹¹). The FDG-PET also showed an increase in cerebral metabolism (as compared with previous 194 assessment), mostly pronounced in the regions of the right dorsolateral prefrontal cortex, the inferior 195 parietal junction and the inferior temporal gyrus. These regions, suggested before to be key regions 196 differentiating MCS- (absence of language understanding) and MCS+ (presence of language 197 understanding) patients³, were also more preserved in the patient with signs of 'covert command following' than in the other patients with cerebral metabolism suggestive of MCS. However, the 198 outcome at 1 year after the BCI assessment still suggested a diagnosis of MCS-. The relatively good 199 200 results of the paraclinical assessment together with the limited motor response during clinical 201 assessment (i.e. 1/6 assessment an automatic motor reaction and 5/6 (abnormal) flexion to noxious 202 stimulation) and severe spasticity (i.e. 3/4 on the Modified Ashworth Scale for the upper limbs and 203 4/4 for the lower limbs) could therefore suggest that this patient's behavior was mainly limited by her

204 physical rather than and cognitive impairments.

205 Previous literature have reported that about 20% of the DOC patients show covert response to command if tested using active paradigms^{20,21}. However, one of the main challenges in this field is 206 the heterogeneity in data analyses and statistical assumptions used. These choices can influence the 207 results and lead to false positives or negatives^{20,21}, even in locked in syndrome patients assessed with 208 the same and a different system as employed in the current manuscript³⁷. It is key to keep this in 209 210 mind when interpreting such data, especially in the context of DOC patients, where such false 211 negative or positive results might have harmful effects in the short and long term, triggering end-oflife decisions or inversely nurturing false hopes³⁸. One way to avoid false negatives or positives is to 212 213 confront the results obtained through different techniques and/or modalities as presented here. 214 Multimodal approaches, even if they necessitate more time and resources, may help reduce the underestimation of the patient's levels of consciousness^{13,34}. In the present study, the FDG-PET data 215

ensure the validity of the presented BCI results.

The fact that only one out of twelve patients showed signs of 'covert command following' (i.e., 8%,

218 vs 19%²⁰-30%³⁹ as previously reported in UWS patients using BCI approaches) in our small sample

- could be explained by the high proportion of patients with anoxic brain damage in the included
- sample, which previously have been reported to show 'covert command following' less often than
- 221 patients with a traumatic $etiology^{21}$. When considering TBI patients only, 20% of the patients show

- signs of covert command following (i.e. 1 of 5 in the current study, and 2 of 10 in Cruse et al.,²⁰).
- 223 Additionally, we included solely chronic (i.e. > 3 months after injury) DOC patients as compared to
- studies including acute DOC patients which find that 30% of the patients show 'covert command
- following'. Even if recovery of consciousness in the chronic phase of the disease can happen⁴⁰,
- recovery is more common to start in the acute phase after the injury⁴¹, and hence discordant results
- suggestive of covert command-following are expected to be more frequent in the acute phase. Still,
- the current small and heterogeneous convenience sample could limit the generalizability of the
- results. Especially since the provided data does not include offline analysis allowing for a tailored single-subject significance threshold for each session, the interpretation of these results remains
- limited. Furthermore, vigilance fluctuation⁴² could also have an impact on the number of negative
- results. For behavioral assessment, it is advised to repeat the assessment at least five times, in order
- to avoid false negatives⁸. In this study, every patient was assessed only once with the P3 system.
- 234 Moreover, the VT3 paradigm was only tested when the results for the VT2 paradigm were promising,
- here in one patient only. In the future, the measurements should be repeated regularly to reduce
- 236 diagnostic uncertainty, and to monitor the patient's recovery. This could aid diagnosis in the acute
- phase of the injury, as well as improve the quality of life of patients in the chronic phase of the
- 238 disease by providing assistive technologies and communication tools⁴¹.
- 239 On the other hand, we would like to highlight several strong points of the current study. Both the
- 240 VT2 and VT3 paradigm take only 2.4 minutes per session, which is much shorter than a motor
- imagery paradigm that usually takes about 10 minutes^{20,21}, or fNIRS session which takes 9 minutes⁴³.
- 242 Secondly, the employed system has the potential to analyze (albeit imperfect) the data directly, and
- 243 provides feedback about the patient's performance promptly. Last, the BCI results have been
- 244 confronted to FDG-PET data on the single-subject level, and we have shown that neuroimaging and
- 245 neurophysiological markers of consciousness and 'covert command following' were in accordance
- with each other.
- 247 At the group level, the results for the VT2 paradigm showed higher BCI performance in MCS based
- 248 on the CRS-R and/or FDG-PET than in UWS. Previous literature during various states of
- 249 (un)consciousness such as sleep, anesthesia, and DOC (for review see ²⁵) has shown evidence for the
- absence of a link between the P3 and consciousness. However, in the acute phase of the disease,
- 251 outcome prediction using auditory irregularities has been successful in more than 90% of the cases⁴⁴.
- In a recent pilot study including a small sample of 12 patients, the accuracy of the vibrotactile
- 253 paradigm, as employed here, was proposed to be higher in patients with an increased CRS-R score
- after 6 months 39 .
- 255 Together, this study highlights the interest of using a multimodal approach when interpreting results
- 256 obtained through different techniques and points towards a potential added value of the VTP3
- 257 paradigm in the clinical assessment of DOC patients at the single-subject level.

258 Tables and figures

- 259 **Table 1 Demographic, BCI and FDG-PET information per patient.** The clinical diagnosis of the
- 260 patients is based on the best CRS-R of at least five assessments that were performed within the week

261 of the BCI assessment. Fluctuations in the clinical diagnosis are presented as the proportion of best

diagnosis out of the total number of assessments. Median BCI performance for the two (VT2 and

VT3) paradigms and between brackets the number of rejected trials are presented together with the

264 FDG-PET based diagnosis. Patient MCS-1 showed signs of response to command when assessed

with the BCI.

ID	Age range	Disease Duration	Etiology	Handedness	Diagnosis stability	VT2 [%] (# rejected trials)	VT3 [%] (# rejected trials)	FDG-PET diagnosis
MCS- 1*	40-45	60m	TBI	Right	4/6	100 (3)	70 (1)	MCS
MCS- 2	20-25	40m	TBI	Left	6/6	20 (1)	-	MCS
MCS- 3	55-60	8m	Anoxia	Right	1/6	25 (42)	-	MCS
MCS- 4	55-60	70m	TBI	?	4/6	10 (257)	-	MCS
UWS 1	65-70	3m	Hemorrhage	Right	4/4	0 (3)	-	MCS
UWS 2	30-35	9m	TBI	Left	5/5	20 (3)	-	MCS
UWS 3	55-60	6m	Anoxia	?	5/5	75+ (0)	-	UWS
UWS 4	20-25	15m	Anoxia	?	6/6	10 (51)	-	UWS
UWS 5	45-50	6m	Anoxia	Right	6/6	0 (23)	-	UWS
UWS 6	65-70	5m	Anoxia	Left	7/7	0 (21)	-	UWS
UWS 7	40-45	26m	Anoxia	Right	6/6	40 (480*)	-	UWS
UWS 8	30-35	13m	TBI	Right	6/6	10 (0)	-	UWS

²⁶⁶ * Very high amplitude response. ⁺ artifacted by mechanical artifact.

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- 269 Figure 1. Preserved glucose metabolism (in red-yellow) as measured with FDG-PET for the MCS-
- 270 patient with signs of 'covert command following' compared to patients with a FDG-PET indicative
- 271 of MCS without signs of 'covert command following' (top left). Bottom left figure, mean glucose
- 272 uptake of the more significant cluster (in MBq/cc) for every patient (patients with a MCS FDG-PET
- in absence of 'covert command following' represented with circles, the MCS- patient who did show
- signs of 'covert command following' represented with a cross). Average standardized uptake valuefor the patients without 'covert command following' (right top), and the standardized uptake value
- for the patients without covert command following (fight top), and the standardized uptake value 276 for the patient with 'covert command following'.
 - **Right hemisphere**

Left hemisphere





No covert command following



Covert command following



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- 280 Figure 2. BCI performance and areas of preserved (in red-yellow) cerebral glucose metabolism
- compared to healthy subjects (significant at <0.001 uncorrected). Results are presented for a
- representative MCS and UWS patient without covert response to command, and for the patient with
- covert response to command. In the ERP plot blue lines represent the P3 for the attended hand, and
- red line represent the P3 for the unattended hand.



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287 Conflict of Interest

- 288 The authors declare that the hard- and software was made available by Gtec. Author WC is
- 289 employed by g.tec Medical Engineering GmbH, CG is the CEO of g.tec Medical Engineering GmbH
- and g.tec Guger technologies OG. The other authors declare no competing interests. Steven Laureys
- *is on the scientific advisory board of Gtec Medical Engineering.*

292 Author Contributions

- 293 JA designed the work, did the acquisition, analysis, and interpretation of data for the work and
- 294 drafted the work. SB and NL did a significant part of the data acquisition and revised the manuscript
- critically for important intellectual content. CC, MB, AT, WC, CG were involved in data analysis
- and revised the manuscript. SL designed the work and revised it critically for important intellectual
- 297 content. All authors gave their final approval of the version to be published and agree to be
- accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity
- 299 of any part of the work are appropriately investigated and resolved.

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