

# Brain Computer Interface and Eye-tracking for Neuropsychological Assessment of Executive Functions: A Pilot Study

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**Abstract.** In this study we explored the use of Brain Computer Interface (BCI) and Eye-Tracking (ET) technology both as augmentative and alternative communication (AAC) tool and to assess cognitive deficits. Specifically, we focused on the possible development of a neuropsychological battery for cognitive assessment based on the integration of BCI and ET tools. To preliminary test this approach we assessed eight healthy subjects with a widespread used cognitive task. AAC and usability of both instruments have also been evaluated with the aim to fine-tune the overall system architecture for clinical use.

## 1 Introduction

Some of the most consistently reported cognitive changes regards frontal executive functions, e.g. verbal fluency, attention, working memory, planning and abstract reasoning [1-6]. However, the assessment of cognitive impairment still remains a problematic issue in patients, because of the possible presence of severe physical disabilities, including movement impairment, paralysis in the advanced stages and dysarthria, which interfere with the outcome of traditional neuropsychological testing.

New technologies to enable communication have been recently used in several studies; however, a comprehensive battery for cognitive assessment has never been implemented with these promising methodologies. Among these methods, Brain Computer Interface (BCI) and Eye Tracking (ET) are the most promising

technologies. BCI uses neurophysiological signals as input commands to control external devices, while ET allows the measurement of eye position and movements.

To date, no applications have been developed, using ET as a communication device in order to administer traditional cognitive tasks to patients.

The main disadvantage in the use of ET systems is that they require good ocular mobility, and the absence of important visual deficits; the former may be lost or altered in the final stages of disease, and the latter may be present in patients of advanced age, thus forbidding the use of this device. In fact, ET may not be proficiently used in case of poor or lack of eye-motor control, such as in late stages of the disease. In this case there is the need of a more direct interface between voluntary cortex activity and the computer. BCI may offer an interesting answer to this issue with a growing number of different paradigms proposed. The most frequently used is the P300, an event related potential (ERP) elicited by infrequent task stimuli, that occurs 200-700 ms; it is typically recorded over central-parietal scalp locations [8-10] and it can also be used by patients suffering from complete paralysis and impairment in oculo-motor dysfunctions, such as locked-in patients.

It is notable, however, that 20% of subjects are not proficient in using BCI; this phenomenon is called "BCI illiteracy" [11] and it is due to the fact that some users do not produce brain activity detectable at the scalp level, independently from the health conditions: even about 10% of healthy subjects do not produce "usable" P300.

With regard, as an example, to Amyotrophic lateral sclerosis (ALS) patients, studies have shown that some of them produce less typical ERPs than healthy matched subjects [12]; [13]. A previous ERP study in patients with sporadic ALS found that P3a and P3b amplitudes of ALS patients were lower and P3a latencies were significantly longer compared with the controls [14]; ERP recordings in non-demented patients with sporadic ALS also showed prolonged N200 and P300 latencies compared to healthy controls [15]. Ogawa and colleagues [16], by employing neuropsychological measures, event-related potentials (ERPs) and clinical scales, studied a sample of patients with early-stage sporadic ALS. They found that patients with the bulbar-onset type showed marked prolongation of P3 latency compared to patients with the limb-onset type and controls. Furthermore, bulbar functional rating scale correlated with prolonged P3 latency and low P3 amplitude. Additionally, patients with bulbar-onset ALS had consistently poorer cognitive test performance than those with limb-onset ALS [17]. These results represent a challenge for the use of P300 as an input signal in BCIs. Kübler and Birbaumer [7] investigated the relationship between the level of motor and physical impairment and the ability to use brain computer interface by comparing three different BCI systems (P300, SCP and SMRs, i.e. sensorimotor rhythms). They found no continuous decrement in BCI performance with physical decline, even in the completed locked-in state (CLIS) where no communication was possible.

Two important criteria in order to evaluate the feasibility of a BCI system are speed and accuracy [18]. The former is related to the fact that the more rapidly a BCI can be controlled, the greater quantity of information can be produced by the user and the greater the chance for effective communication. Obviously, compared to verbal speech production, communication rate is severely reduced with BCI. With regard to accuracy, it consists of the percentage of correct selections per time interval. A wrong selection could turn into an error in communication, with both practical and psychological consequences for the user. In order to avoid this, the BCI system must

be equipped with options that allow the user to correct wrong selections. A balance between speed and accuracy should be identified.

A recently funded project, “eBrain: BCI-ET for ALS”, [19] aims to evaluate BCI P300 technique and eye-tracking technology both as AAC systems and as cognitive assessment tool with ALS patients.

Before beginning the actual testing phase with ALS patients, we performed a pilot study with healthy subjects to fine-tune the overall project testing setup. Specifically, a small group of healthy subject was administered a subset of the eBrain designed sessions to generally assess feasibility, user-friendliness, pleasantness and fatigue. Emotional aspects related to the experimental setting, as well as its usability, have been evaluated, too. In this paper we report the results of this pilot study.

## 2 Materials and Methods

### 2.1 Subjects

Eight healthy subjects (4 females and 4 males) constituted the participants, ranging in age between 25 and 39 (M: 31.75, SD: 5.946). They were all volunteers with a schooling degree ranging from 13 to 24 years of education (M: 19, SD: 4.276). All the subjects were experienced in the use of PC (50% fair or good and 50% excellent), some of them (50%) declared to have already used Brain Computer Interface or an Eye-tracker system, and more than half (62.5%) had already participated into EEG experiments. Exclusion criteria were related to the states of participants’ cardiac, optical, mental, and psychological health. Participants were asked not to drink caffeine or alcohol and not to smoke prior to the experimental test to avoid any effects of these substances on the central and autonomic nervous system.

### 2.2 System Setting

Test architecture (Figure 1) was composed of an eye-tracking system, and a BCI device, both controlled by a laptop PC (HP DV3-4101SL, Hewlett Packard, USA), connected to an external monitor, meant for the stimuli presentation (Display PC).

The BCI device module consisted of a g.USBamp biosignal amplifier (Guger Technologies, Graz, Austria), connected to an active electrodes head cuff (g.GammaCap, Guger Technologies). 16 EEG channels were used (FZ, C3, C4, CZ, CPZ, P3, P4, PZ, PO3, PO4, POZ, PO7, PO8, O1, O2, OZ); ground was placed in FPZ, and reference was located on the left ear lobe.

The eye-tracker was an EYELINK-1000 (SR Research Ltd., Mississauga, Ontario, Canada), consisting of a high-speed infrared camera and the related illuminator, positioned just below the Display Monitor.

Tests were administered through two different software: a customized version of BCI2000 (<http://www.bci2000.org/BCI2000/Home.html>) [41]; [42] for the BCI assessment and a suitable custom software, developed within the project for the eye-tracking evaluation.

### 2.3 Experimental Procedures

Subjects who met the experimental criteria were enrolled and tested at the Applied Technology for Neuro-Psychology Laboratory, located at the Istituto Auxologico Italiano in Milan. All subjects were required to sign a release form. Since the experiment was constituted by two separated parts, the design was balanced between the subjects. Immediately after the former session, subjects were asked to fulfill the required questionnaires and to rest for 15 minutes.

After a calibration, required by both instruments, the neuropsychologist started the cognitive assessment through a Phonemic Fluency test and a Semantic Fluency test (as described below), adapted to the experimental conditions (see figure 1).

At the end of Eye-tracking session, the subjects had to copy a sentence twice (FIAT ALAN FORD MERCEDES BENZ): the first time using a virtual keyboard (ordered letters in rows from A to Z see figure 2a), the second time using a scrambled keyboard (mixed position of the letters, see figure 2b). The total time of the experiment was about two hours.

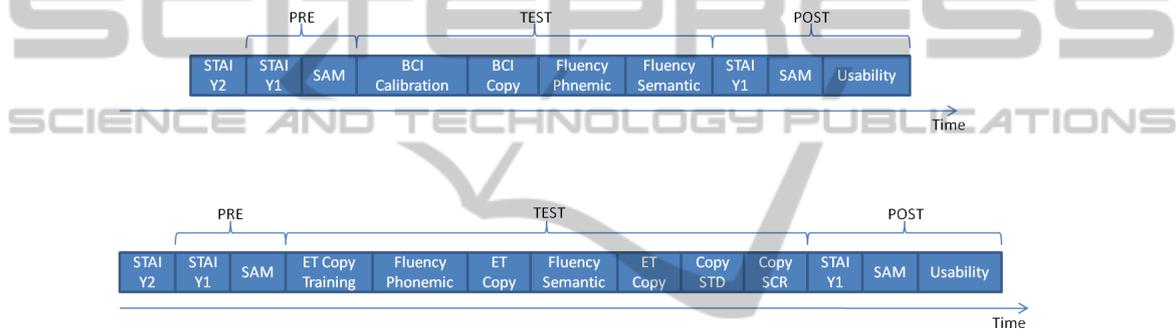


Fig. 1. Experimental procedure timeline for both BCI and ET sessions.

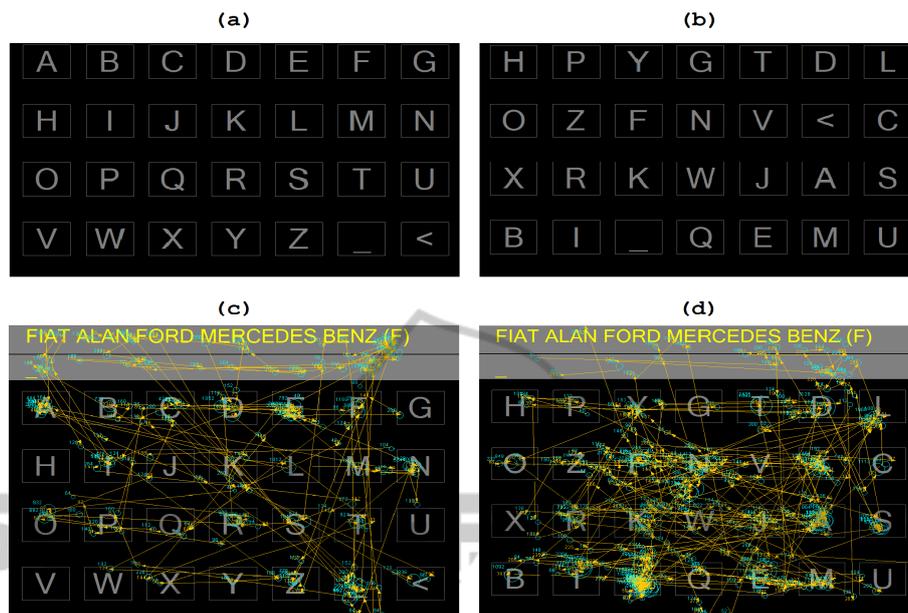
### 2.4 Psychological and Usability Self-report Questionnaires

#### 2.4.1 STAI form Y Questionnaire

The Italian version of the STAI form Y questionnaire was used to assess changes in two different types of anxiety, namely, anxiety detected as the subject's current state (STAI-Y1, i.e. state anxiety) and anxiety detected as a reasonably stable trait of the personality of an individual (STAI-Y2, i.e., trait anxiety). A total of four Self-reported STAI-Y1 were gathered before and after both BCI and Eye-tracking sessions. One self-reported STAI-Y2 was gathered five minute before the experimental session [22].

#### 2.4.2 Self Assessment Manikin (SAM)

The Self Assessment Manikin (SAM) is a non-verbal pictorial assessment technique that directly measures the pleasure, arousal, and dominance associated with subjects' affective reactions [23]; [24]; [25]. A total of four Self-reported SAMs were gathered before and after both BCI and Eye-tracking sessions.



**Fig. 2.** The used ET Keyboards and the Saccades plotted over them: (a) Standard Virtual Keyboard, (b) Scrambled Keyboard, (c) Saccades on Standard Virtual Keyboard, (d) Saccades on Scrambled Keyboard.

## 2.5 Usability Inventory Post-test Questionnaire

Since there are no usability validated tests for Eye-tracking and BCI systems, we developed a questionnaire with 19 items based on the literature available [26-29]. Our purpose was to evaluate the instruments' general usability, and the following specific variables: fatigue, screen readability, perceived usefulness, and so on.

### 2.5.1 Neuropsychological Tests

We used a classic spoken letter-based word generation procedures (Phonemic Fluency), such as the Controlled Oral Word Association test [30-34] and then repeated the procedure with the Category Fluency, also known as Semantic Fluency [30]. These tests have been recognized as the most sensitive tools in detecting cognitive impairments in ALS patients [5].

For both the Semantic and the Phonemic Fluency in the BCI session we used to measure the time taken by the subjects to think the word starting with the given letters: "A" and "H" respectively. A timer was started by the researcher right after the letter was presented to the subject. Then, the timer was stopped when the subjects indicated to be ready to effectively start to write the word with the BCI system. Finally the procedure was repeated for the Semantic Fluency, with the categories "furniture" and "means of transport."

Concerning the Eye-tracking system we used an adapted version of Fluency Index [6] to adjust for eye motor component. Thus the subjects were required to write all the

words starting with a specific letter (“Q” and “Z”) in exactly one minute (generation condition). Then the subjects were asked to copy exactly the same words while a researcher measured the time taken (control condition). The same procedure was repeated for the Semantic Fluency task, with the categories “type of shoes” and “cooking ingredients.”

The difference between the specified time for the generation condition and the time taken for control condition was then calculated and used to determine the Fluency Index, which represented the average time taken to think about each word [6].

### **3 Results**

Data were analyzed with the aid of the statistical software SPSS, version 17 (Statistical Package for the Social Sciences–SPSS for Windows, Chicago, Illinois, USA). Due to the small sample size, nonparametric tests were preferred, even if several measures showed a normal distribution (also according to Kolmogorov-Smirnov test).

In the following paragraphs the main results of this preliminary study are presented.

#### **3.1 Fluency Tests**

In BCI session, Phonemic Fluency average time in seconds was  $6.42 \pm 2.76$  and Semantic Fluency average time in seconds was  $4.08 \pm 1.94$ . Regarding Eye-tracking session, we used the Fluency Index, as above described. Phonemic Fluency Index was  $4.28 \pm 5.84$  and the Semantic Fluency Index was  $3.37 \pm 2.58$ . These data will be used to assess future patients’ performances.

#### **3.2 Behavioral Measures**

Wilcoxon Signed Ranks Tests indicated no statistical differences for both the pre-post STAI-Y1 and pre-post SAM scales, indicating that no negative affective state or anxiety have been generated by the performance with BCI or ET. However a small increase in anxiety was detected after the use of BCI.

#### **3.3 Usability**

As can be seen in Table 1, subjects recognize both systems as enough usable, but Eye-tracker is perceived as more usable than BCI (statistical significance is calculated with Wilcoxon Signed Ranks Tests).

**Table 1.** Average values of 7-point Likert scale items of the usability questionnaire.

ID	Item	Mean BCI	Mean ET	p
1	It is easy to use the device	5.25	6.25	.131
2	The instructions are clear	6.25	6.50	.157
3	Sometimes I wondered if I was selecting the right letter	2.25	1.75	.336
4	Letters on the screen are clear and sharp	5.25	6.88	.066
5	I felt in command of this device when I was using it	5.13	5.38	.916
6	I properly understood the instructions	6.63	6.63	1.000
7	Using this device was frustrating	2.38	1.88	.357
8	I felt tense at times when using this device	2.63	2.50	.931
9	The device requires too many steps to work	2.00	1.38	.197
10	New users will find this device easy to use	4.63	6.25	.038
11	It is easy to make the device do what I want	5.13	5.38	.666
12	The device did what I expected	5.25	5.63	.732
13	The device appears to be limited	2.88	2.38	.480
14	The equipment is comfortable	3.75	4.63	.167
15	Using the device was demanding and tiring	4.13	2.63	.071
16	The icon to correct answers was helpful (ET)	-	5.88	-
17	An initial tutorial on the usage of the device would be helpful	3.25	2.75	.194
18	Using the device was amusing and exciting	4.25	5.25	.071
19	I believe that the device is fit to communicate in the presence of disorders that prevent from communicating with the voice	5.13	6.75	.102

### 3.4 Anxiety Traits and Consequences

No correlations were found between STAI-Y2 and all the Fluency measures, for both the BCI and the Eye-tracking.

On the other hand we found interesting correlation between STAI-Y2 and some items of the usability questionnaire. In particular, the item 15 for the BCI (the instruments has been demanding and tiring) is positive correlated with STAI-Y2 ( $r = 0.747$ ,  $p = .033$ ). In sum, usability is negatively correlated with the trait anxiety level.

### 3.5 Copying Text using Different Keyboards with ET

The average time to copy the same text with the standard virtual keyboard was  $46.09 \pm 6.55$ . The average time for the same copy with the scrambled keyboard was

60.17±21.23. Wilcoxon Signed Ranks Tests indicated statistical significant differences ( $Z = -2.201$ ,  $p = .028$ ).

#### **4 Conclusions and Future Work**

No studies have been performed so far to evaluate BCI and the eye-tracking system for AAC and cognitive assessment in ALS. Our pilot study provided evidences for the effectiveness and usability of these techniques. Specifically, the BCI/computerized assessment could provide new insight into the understanding of cognitive deficits, when applied to ALS patients, through the integration of multidisciplinary data: neurophysiological, neuropsychological, behavioural and psychological.

The proposed study is characterized by at least two innovative aspects: (1) the comparison between two promising technologies, one already extensively investigated (ET), the other being a very promising candidate (P300 BCI), (2) the adaptation of a computerized verbal fluency task for the neuropsychological assessment of higher order cognitive functions in ALS patients.

Results showed a good usability of both instruments, better for Eye-tracking, but promising for BCI too. Furthermore the strong negative correlation between trait anxiety and perceived usability clearly shows that the higher the subject is anxious, the more the instruments will be perceived as demanding, tiring, and difficult to use. Finally, no affective effects on cognitive performances were revealed by the psychological measures administered.

As expected, BCI calibration was a critical issue. The average score obtained after the calibration process was 89.73%, leading to an accuracy of BCI system during the tests of 81.72% (i.e. 18.28% of errors). However, the 6 subjects that obtained 100% of correct calibration did very few errors in the testing phase. These data suggest that it is crucial to extend the calibration phase in order to reach very high correct ratio (close to 100%).

More, the choice of virtual keyboard used in the task, clearly influences the performances obtained, showing a high potential use of such instruments for the development of novel cognitive tests.

Finally, these preliminary results may have interesting implications for both clinical practice (the availability of an effective tool for neuropsychological evaluation of ALS patients) and ethical issues, the last one arising from a proper assessment of cognitive ability preservation, in particular regarding relevant decisions about medical treatments, economical and end-life issues.

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