

# Switch mode to control a wheelchair through EEG signals

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**Abstract**—This paper presents a switch strategy to control the movement of a Brain-Controlled Wheelchair. After the activation of a Motor Imagery task, an advance movement is started and kept until the same task stop it. This way, users with an unstable control of their EEG could be aided in handling the wheelchair.

## I. INTRODUCTION

PEOPLE experiencing from numerous neurological diseases can present great disabilities. In some serious cases of disabilities, such as patients suffering Amyotrophic Lateral Sclerosis (ALS), a total loss of control of the muscles responsible of the voluntary body movements, including eye movement and breathing itself, may exist. People suffering from such deficiencies lose any possibility of communication with the external world, being the only possible alternative to give the brain a non-muscular channel that enables those people to send messages and orders to the external world. Such a system is known as a Brain-Computer Interface (BCI) [1].

A BCI is based on the analysis of the brain activity, such as electroencephalographic (EEG) signals, recorded during certain mental activities, in order to control an external device. Such systems can be used for many different applications such as writing through a speller matrix [2] or driving a wheelchair. The development of a brain-controlled wheelchair (BCW) that can be handled by such patients would grant them autonomy to move through a controlled environment.

Although there are some BCWs controlled by potential P300 or SSVEP (see [3] for different examples), most systems make use of endogenous signals and especially of sensorimotor rhythm (SMR) which are usually based on discrimination of different mental tasks [3]. In these BCI systems, the number of navigation commands to control the wheelchair is associated to the number of classes to discriminate. Many studies have reported that an increasing number of classes resulted in a decrease of the classification accuracy [4]. These studies suggest that the highest classification accuracy is achieved by classifying only two classes.

In order to provide different navigation commands

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without making the BCI performance worse, our group (UMA-BCI) has been working on a paradigm based on the discrimination of only two mental tasks which allows subjects to control the selection of four different navigation commands which are sequentially presented one after the other. This paradigm has been used successfully to control a wheelchair using discrete movements [5] however, other strategies should be considered as for example, providing continuous movements [6]. In the present study, a new strategy based on switch mode control which have already been tested in a virtual wheelchair [7] is presented.

## II. MATERIAL AND METHODS

### A. Participant and data acquisition

In this preliminary study, one subject participated in this experiment (male, aged 35). EEG signals were recorded from nine active scalp electrodes placed at F3/F4, T7/T8, C3/C4, P3/P4 and Cz, according to the 10/20 international system. The ground electrode was placed at AFz. These EEG channels were combined to produce two Laplacian channels around C3 and C4. Signals were amplified and digitized at 200 Hz by an actiCHamp amplifier (Brain Products GmbH, Munich, Germany).

### B. Initial training and signal processing

The subject initially participated in one initial training session for calibration purposes in which, immersed in a virtual environment (VE), he had to control the displacement of a car to the right through right hand motor imagery (MI) task, or to maintain the car in a straight line through a relaxed state [5], [6]. Signal processing consisted of extracting EEG parameters and classifying them according to the two mental tasks. Feature extraction consisted of estimating the average band power of each channel in predefined frequency bands. Classification was based on a linear discriminant analysis (LDA). As a result of an LDA classification, a positive/negative value of “D” was computed online every 31.25ms and translated into a right displacement of the car if it is positive, indicating that the trial was classified as a MI trial, or maintaining the car in a straight line if it is negative, indicating that it was a relaxed state trial. The same online processing was used to control the navigation paradigm.

### C. Navigation paradigm

The navigation paradigm was identical to the one used in [5], [6]. In order to control the wheelchair, a graphical interface was presented to the users in order to offer them several navigation commands, which were selected through

the discrimination of only two mental states. The navigation consists of a circle divided into four parts, which correspond to the possible navigation commands (move forward, F, turn right, R, move back, B and turn left, L), with a bar placed in the centre of the circle that is continuously rotating clockwise (see [5] and [6] for more details). If the classifier determines that the mental task is right-hand MI, the bar extends; otherwise (relaxed state), the bar length remains at its minimum size. When the length exceeds a selection threshold, the command pointed by the bar is selected. Due to the main objective being to control a real wheelchair, the graphical interfaces used were replaced by an audio-cued interface, allowing to select a command without a graphical interface.

Two different configuration commands can be select with this interface. In continuous mode, once the command is selected, the wheelchair moves in a continuous way (see [6]). In switch mode, once a command is selected, the movement starts. The main difference is that when the bar is shortened under the selection threshold, the movement does not stop, but it is kept until the user enlarges the bar length above the selection threshold again (carrying out a MI mental task); at that moment, the movement stop.

In some situations, continuous mode could have some disadvantages. If the user wants to move forward during a long period in order to cover medium or long distances, he/she needs to keep the effort of the MI task in order to keep the wheelchair moving forward. The aim of this preliminary study is to check the usefulness of this brain-switch mode.



Fig. 1. The subject driving the wheelchair (left) and the demarcated path to follow (right).

#### D. Experimental procedure

Prior to driving the robotic wheelchair, the subject went through a training schedule: a first session for calibration purpose and a second training session in a VE. This second session consisted of freely navigating in the VE in order to get used to the control interface. First, the subject navigated the virtual wheelchair using the audiovisual interface and in a second task using the audio-cued interface only.

After the training sessions, the subject participated in one experimental session using a switch mode to control the advances of the robotic wheelchair (Fig. 1, left), while the turn and backward commands were executed in a discrete way (90° turns and 1m backward motion). Using small squares drawn on the floor, we demarcated a path consisting of four 3m stretches, one 6m stretch and four turns (Fig. 1, right).

### III. RESULTS AND DISCUSSION

The obtained results of the experimental session are shown in Table I. For each stretch (comprising the turn after the advance) three columns are showed: i) the time spent, ii) the selected commands and iii) the precision, calculated as the ratio between the correct selections and the total selections. Considering the way the interface managed the advance commands, one selection of the F command implied two activations of the MI task.

The subject needed 13 commands while the path could optimally be completed with 9 commands. He made 2 mistakes that he amended with 2 extra commands. In stretches B-C and C-D the subject needed two advances (instead of only one). As the table shows, the high precision value indicates that the paradigm allowed the subject to choose the commands he wanted without difficulty.

This same subject participated in a previous experiment in continuous mode, not showing any control.

TABLE I  
NAVIGATION RESULTS

Stretch	Time (s)	Commands	Precision
A-B	131	F, R (error), L, L	0.75
B-C	51	F, F (error), R	0.66
C-D	119	F, F, R	1
D-E	62	F, R	1
E-A	64	F	1
Total	427	13 commands	0.84

### IV. CONCLUSION

Even when this is a preliminary result, the switch mode seems to be an appropriate way to make easier the forward movement of the wheelchair compared to the continuous mode.

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