

# EEG: Identification of concentration level under Pair Programming\*

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## Abstract

In this paper we present preliminary research outcomes of an experimental investigation identified with the use of electroencephalography (EEG) device in estimation of various well defined programming tasks. We examine current strategies and problems of carrying out this experiment and specifically, we focus on the pair programming activity implied by modern EEG devices with given particular condition and specific calibration.

## 1 Introduction

Programming and solving tasks is the result of our capacity to expand thoughts into calculations and is therefore mostly the immediate consequence of mental exercises [2]. As an outcome, programming best practices (factors) must work on the grounds that in some design they initiate productive behavior in programmers. Clearly it is of extraordinary enthusiasm to see an ever increasing number of recommended practices influence mental movement to advance productivity. One of the most studied factor that affects the productivity is pair programming [4, 16, 1]. This paper examines the relation between brain and behavior for programmers when they program in pairs and alone and compares the result.

## 2 Related work

Di Bella et al. [11] evidences that pair programming boosts productivity, practically identical or much better than that accomplished by two individual programmers; previous research has also evidenced the advantages of pair programming when introducing novices in teams [15], improves job satisfaction [25], and

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promotes specific collaborations between team members [5]. Speculations have been made; a case of such theories is that pair programming prompts more elevated amount of focus, in this way decreasing the measure of imperfections embedded in the code [19, 7, 24]. Our paper continues the same research that was carried out two years ago which also deals with the concentration in brain wave between pair programming and solo programming [3].

Based on the previous literature works, it is known that pair programming is not only the key factor that affects the concentration level of brain-behavior relation but also we observe that the fundamental case of brainwave estimations are affected by a combination of different unspecific factors such as programming with (without music) and specific factors such as age, gender and job or programming experiences [13], [12], [22]. EEG is one of the common way to carryout the experiment but there are different other devices such as functional near infrared spectroscopy (fNIRS), functional magnetic resonance imaging (fMRI), and magnetoencephalography (MEG) that has been used to perform the experiment of data collection during the analysis of brain [20], [14].

### 3 Methodologies

The experiment was performed using 24 channel two Mitsar SMART-BCI Bluetooth device with the default settings of this device as these settings were applicable for our experiment. The subjects were undergraduate students who were given some tasks from CodeForce to solve on the given amount of time. The tasks difficulty was based on the rating on the site itself. Participants had to solve the task on a pair programming set (being a navigator and driver) and on a solo programming set based on their own choice of programming language [10].

We used the EEG device with more than one channel, the underlying advance to endeavor is to pick the channels that are the focal point of the processing [6]. For this analysis, we chose the central terminals as we found that the frontal electrodes cannot be cleaned with EEG inclined methods [8]. For the central electrodes, cleaning was done with the use of filters that are notch filter (for removal of noise), high and low pass filters (for alpha and beta range) and amplitude filtering (for artifacts) [17], [18]. The processing and collection of data was carried out with the use of the official EEG software and for the analysis we use python programming language with the library MNE python version 0.16.1.

### 4 Experiment

Between each participants, a pair was formed. Each experiment was held in one month period with similar environment and conditions on each day. The experiment consists of two phases. The initial phase is calibration phase which consist of two parts. The first one is that participant rests with the closed eyes doing nothing in a calm state and the second one is same with opened eyes.

The calibration phase quantifies the synchronization of alpha and theta wave. The second phase is the phase with actual roles and tasks. Participants now get started with solo programming. This continues for exactly sixty minutes. Now after the end of solo programming, participants are given five minutes break before the start of pair programming. During pair programming, one behaves as a driver and another as a navigator. The roles doesn't matter because both participants have to start the experiment again with different roles. This also continues for sixty minutes. After the second phase of pair programming, participants are given 30 minutes break. During the break, participants are in complete rest state. After the break, the phase of pair programming starts just with the reversed roles of navigator and driver.

## 5 Analysis

### 5.1 Event Related Desynchronization (ERD)

Data is stored in edf format and for the analysis purpose the formula of ERD is used.

$$ERD = \frac{(amplitude)_{rest} - (amplitude)_{programming}}{(amplitude)_{rest}} \times 100\%$$

For the experimental data, fast fourier transform is used to figure out the ERD for 2000ms window of the signal. Subsequently, we acquire a period arrangement or conveyance of ERD for each sub-band for each unique programming action. We give more consideration on theta waves as we believe them to be associated with higher memory load and on alpha waves as they have a solid reliance with consideration level and semantic memory handling. Using such data from section 4 gives us a comprehensive observation of how to analyze sub-band esteems.

### 5.2 Correlation

The analysis of the connection of brainwaves recognizes the connections existing among theta and alpha waves (upper and lower). Solid connections of these brainwaves clarify distinctive mental exercises and statuses. The connection analysis was not connected for EEG data previously, which implies that we connected this method so as to comprehend on the off chance that it may be utilized for future research. Using the relationship we analyze the Pearson's connection coefficients between every one of the roles of pair programming. We consider the distinction between waves as the increment of neuron synchronization which suggests the expanding of consideration and memory burden forms. Utilizing this experimental data we can compute the connection on some sub-groups and contrast the outcomes with ERD.

## 6 Early Results And Discussion

The analysis demonstrates to us that if there should be an occurrence of pair programming, the ERD is higher for navigator mode and the qualities are identical for the other mode because of the non-concurrent lower alpha band. It may infer that pair programming in navigator mode requires more thought, and this mirrors the sense that the navigator role requires evaluating and controlling the improvement, which intuitively requires a gigantic effort of thought, also because of the way that the navigator isn't locked in with a physical contact with the input device. With respect to the theta esteem, solo programming, navigator, and driver have values in the dropping request separately. In this way we discovered that theta and alpha waves are conversely relative to one another. The examination of the relationship for pair programming appears similar with the cases made with the examination of ERD. Actually, the small dataset isn't unquestionable, so far watching a second investigation drove with a substitute procedure insinuating a comparative example as the main which gives some observational assertion of the clarification that the navigator in pair programming has more focus.

## 7 Problems

The experiment was quite new, so finding suitable articles and references was not easy because of which defining the experimental protocol was difficult. Our EEG device being old, got a lot of muscle activity causing the participants to stay still and blink as less as possible [23] which decreased the number of participants. We were unable to experiment on the participants with thick hair because the EEG device was unable to reach the scalp of such participants. This decreased the range of our participants. Because of the environmental noise, more filtering was necessary for the data [26]. Also it is very difficult to find participants (dataset) as the experimental process is time consuming and effort intensive. Initiating the experiment and analyzing the experiment also takes a lot of time. This also depends on the experience of the researcher.

## 8 Conclusion

We carried out this research with limited number of participants. We identified and compared the concentration level during pair-programming using the analysis process of ERD and correlation with EEG device. We found out that the ERD of navigator mode in pair programming is higher and some qualities being same for the other mode of pair-programming. When compared with correlation, the results were quite similar supporting the exactness of the experiment. Although there were some problems encountered, we can say that the research and the experiment under a small data set gave us good results.

## 9 Future research

We will carry out the research with a large dataset and extend the experiment to industry with professional software developers and the research will not be limited to EEG but also we will use other available devices. This will let our research to be more vivid and exact. These other devices can have less confinements and issues making the experiment less dreary and less exertion concentrated with progressively strong results [9], [21].

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