## **Human-Computer Interaction Series**

## SpringerBriefs in Human-Computer Interaction

#### **Series editors**

Desney Tan, Redmond, USA Jean Vanderdonckt, Louvain-La-Neuve, Belgium SpringerBriefs in Human-Computer Interaction presents concise research within the fast growing, multidisciplinary field of Human-Computer Interaction (HCI). Designed to complement Springer's prestigious Human-Computer Interaction Series this Briefs series provides researchers with a forum to publish cutting-edge scientific material relating to any emerging HCI research that is not yet mature enough for a volume in the Human-Computer Interaction Series, but which has evolved beyond the level of a journal or workshop paper.

SpringerBriefs in Human-Computer Interaction are shorter works of 50–125 pages in length, allowing researchers to present focused case studies, summaries and introductions to state-of-the-art research. They are subject to the same rigorous reviewing processes applied to the Human-Computer Interaction Series but offer exceptionally fast publication.

Topics covered may include but are not restricted to:

- User Experience and User Interaction Design
- Pervasive and Ubiquitous Computing
- Computer Supported Cooperative Work and Learning (CSCW/CSCL)
- Cultural Computing
- Computational Cognition
- Augmented and Virtual Reality
- End-User Development
- Multimodal Interfaces
- Interactive Surfaces and Devices
- Intelligent Environment Wearable Technology

SpringerBriefs are published as part of Springer's eBook collection, with millions of users worldwide and are available for individual print and electronic purchase. Briefs are characterized by fast, global electronic distribution, standard publishing contracts, easy-to-use manuscript preparation and formatting guidelines and have expedited production schedules to help aid researchers disseminate their research as quickly and efficiently as possible.

More information about this series at http://www.springer.com/series/15580

### Anibal Cotrina

# Toward Brain—Computer Interaction in Paralysis

A New Approach Based on Visual Evoked Potentials and Depth-of-Field



Anibal Cotrina Department of Computer and Electronics Universidade Federal do Espírito Santo Sao Mateus, Espírito Santo Brazil

ISSN 1571-5035 Human–Computer Interaction Series ISBN 978-3-319-52297-5 ISBN 978-3-319-52298-2 (eBook) DOI 10.1007/978-3-319-52298-2

Library of Congress Control Number: 2017932115

#### © The Author(s) 2017

This work is subject to copyright. All rights are reserved by the Publisher, whether the whole or part of the material is concerned, specifically the rights of translation, reprinting, reuse of illustrations, recitation, broadcasting, reproduction on microfilms or in any other physical way, and transmission or information storage and retrieval, electronic adaptation, computer software, or by similar or dissimilar methodology now known or hereafter developed.

The use of general descriptive names, registered names, trademarks, service marks, etc. in this publication does not imply, even in the absence of a specific statement, that such names are exempt from the relevant protective laws and regulations and therefore free for general use.

The publisher, the authors and the editors are safe to assume that the advice and information in this book are believed to be true and accurate at the date of publication. Neither the publisher nor the authors or the editors give a warranty, express or implied, with respect to the material contained herein or for any errors or omissions that may have been made. The publisher remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Printed on acid-free paper

This Springer imprint is published by Springer Nature
The registered company is Springer International Publishing AG
The registered company address is: Gewerbestrasse 11, 6330 Cham, Switzerland



#### **Foreword**

When Dr. Cotrina started his doctoral studies in 2012 under my supervision, I was not able to figure the such amount of publications we would have together.

The partnership with Dr. Cotrina resulted in 26 publications spread in journals, conferences, and chapters of book. The final result of his research was the doctoral thesis entitled "A Brain-computer Interface Based on Steady-state Visual Evoked Potentials and Depth-of-Field". And, as an award for his research, Dr. Cotrina got the first place at the Brazilian BCI Competition 2014.

Thus, this book is a compilation of all experience of Dr. Cotrina in the area of BCI (brain-computer interface), which include deep aspects of SSVEP (Steady-State Visual Evoked Potential), Depth-of-field, and stimulation paradigms.

Then, I invite you to enjoy this book, learn about the representation of the visual system on the retina and the visual cortex, know the typical visual evoked potential waveforms, and the difference between covert and overt attention, in order to design a gaze-independent SSVEP-BCI, whose main application is for paralyzed people.

Vitória, Espírito Santo, Brazil December 2016 Teodiano Freire Bastos Filho

#### **Preface**

A brain–computer interface is a system that provides a direct connection between human brain activity and computer-based devices. It generates an alternative channel of communication between the human and his/her environment bypassing the normal output pathways. The applications of BCIs are constantly increasing. It includes communication systems, prosthetics control, rehabilitation, robotics, and interaction of healthy people with their environment. Nowadays, one of the main challenges of this technology is to provide practical and suitable applications for patients with partial or complete paralysis caused by severe neuromuscular disorders. SSVEP-based BCIs are becoming robust systems and are achieving high performance; however, the traditional assessment is not suitable for employing paralysis situation because it demands neck, head, or/and eye ball movements.

In order to take advantage of the potential of the SSVEP-BCI, this book introduces and describes a novel approach of setting visual stimuli based on the optical phenomenon of Depth-of-field. The intention is to offer to users the possibility of selecting a SSVEP stimulus by shifting focus of the eye, instead of perform neck, and/or eye ball movements. This approach was inspired in the photography when it was noticed that any object of a scene can be highlighted by adjusting the focus control of the camera; and not necessarily moving the camera. Then, if two visual stimuli are present in the subject field of view, he/she can highlight one of them (e consequently attenuate the other one) by adjusting the eye focusing. The advantage of the human eye is that focusing is a reflex mechanism. This book is the result of the studies and experiments conducted during my Doctoral and Postdoctoral research at the Intelligent Automation Lab of the Federal University of Espirito Santo. Its content aims to contribute with the development of technologies of human-computer interaction in paralysis situation. It starts with a brief definition of light and how it can modulate the brain signals, and ends showing practical applications, such as the control of a telepresence robot.

The book is organized as follows; In Chap. 1, the problem is contextualized and the purpose of the book is established. Also, a hypothesis is formulated. Chapter 2 provides a theoretical background; starting with the definition of the light and ending with the presentation of a command of a brain–computer interface

x Preface

originated by a light stimulus. Also, a literature review is dealt including recent relevant works that addressed the application of SSVEP-BCI in patients with paralysis. In Chap. 3, the new approach of setting the SSVEP stimuli based on Depth-of-field phenomenon is presented. Concepts related to the optical phenomenon of Depth-of-field are reviewed, such as defocusing and point spread function. Also, physiological aspects such as the accommodation of the eye mechanism and retinal blur model are addressed. Chapter 4 introduces a demodulation method for extracting frequential features in the context of the SSVEP-BCI based on the Depth-of-field. For this aim, the spatial-temporal spectral response caused by a focused stimulus and a non-focused stimulus was studied. Some experiments are conducted by evaluating and comparing the spectral power of focused and non-focused stimuli to verify if the amplitude of the retinal response is higher for the focused one than for the non-focused one. In Chap. 5, experiments conducted for evaluating the detection of commands associated to focusing mechanism are described. The evaluation is conducted in offline mode to find out the possibilities of employing a SSVEP-BCI based on Depth-of-field in practical situations. Conventional BCI performance metrics were employed. Chapter 6 presents and describes online practical applications of the SSVEP-BCI based on Depth-of-field in communication and control. A speller system and a system for controlling a telepresence robot were implemented. Pilots experiments conducted for evaluating each system are described. Finally, vantages and limitations of the proposal and its future directions in patients with paralysis are presented.

Sao Mateus, Brazil November 2016 Anibal Cotrina

## Acknowledgements

I am grateful to all the people who supported, collaborated with, and contributed directly and indirectly to the present work, especially to my doctoral supervisor Prof. Dr. Teodiano Freire Bastos-Filho for his support and encouragement. Special thanks to Dr. Alessandro Benevides and Dr. Javier Castillo who contributed with their great understanding and insightful opinions to the main idea behind this work. Many thanks to Berthil Borges and Alan Floriano who shared with me many long days in the LAI lab and contributed directly with this work. Thanks to Prof Dr. Andre Ferreira and Prof. Dr. Carlos Eduardo Pereira who together with my supervisor accepted to work with me in the doctoral and postdoctoral research. Also, I want to acknowledge the CAPES/Brazil agency which provided the the scholarship and funds for this work and the CNPQ Brazilian Council, FINEP Funding Brazilian Agency, and FAPES Brazilian Foundation for additional financial support. This acknowledgment extends to the International Centre of Theoretical Physics—South American Institute for Fundamental Research; the Abdus Salam—International Centre of Theoretical Physics, the International Centre for Genetic Engineering and Biotechnology, and the BCI Society for the grants to attend international scientific events. My heartfelt thanks go to my parents Priscila and Saul; to my brothers Saul, David, and Roy; and to my love, the sweet Jane.

Sao Mateus, Brazil November 2016 Anibal Cotrina

## **Contents**

1		oduction	1 4
2	Fun 2.1 2.2 2.3 2.4 2.5 2.6 2.7	damentals: From Light to Command  Light, Eye and Vision  Image Formation  Field of Vision and Topographic Map  Visual Pathway  Brain Signals and Evoked Potentials  Influence of Refractive Error in VEP  Steady-State VEP	7 8 10 13 13 16 19 20
	2.8 2.9	BCI Based on SSVEP	22 25 30
3	3.1 3.2 3.3 3.4 3.5	Novel Stimulation Setup  SSVEP-BCI Stimulation Setup  Non-focused Objects and Depth-of-Field  Optical Point Spread Function (PSF)  Retinal Blurry Model  Accommodation of the Eye  grences	33 36 38 40 43 44
4		puency Demodulation for a SSVEP-BCI Based Depth-of-Field Traditional Demodulation. Proposed Demodulation Spatio-Temporal Retinal Response for a Flickering Stimulus. Power Spectrum of the Retinal Response	47 48 49 52 55

xiv Contents

	4.5	Experimental Evaluation	60	
	4.6	Discussion	64	
	Refe	erences	65	
5	Offli	ne Evaluation of Command Detection	67	
	5.1	SSVEP Detection Methods	67	
	5.2	Experimental Procedure	70	
	5.3	Results	71	
	5.4	EOG Measurements	76	
	5.5	Discussion	77	
	Refe	erences	78	
6	Online Applications in Communication and Control		79	
	6.1	Binary Selection	79	
	6.2	BCI for Communication—A Spelling System	80	
	6.3	BCI for Control—Control of a Telepresence Robot	84	
	Refe	erences	89	
7	Futi	re Directions in Patients with Paralysis	91	
		erences	92	
In	Index			

## Acronyms

AAN American academy of neurology ALS Amyotrophic lateral sclerosis BCI Brain-computer interface

BPF Band-pass filter

CAR Common average reference
CCA Canonical correlation analysis
CNS Central nervous system

CRT Cathode ray tube

DFT Discrete Fourier transform
DMD Duchenne muscular dystrophy

ECoG Electrocorticographic
EEG Electroencephalographic
EMG Electromyography signals
EOG Electrooculography signals

ERD Events related to desynchronization

ERP Event-related potentials

ERS Events related to synchronization

FFT Fast Fourier transform FIR Finite impulse response

fRMI Functional magnetic resonance imaging

GBS Guillain-Barre syndrome
HMI Human-machine interaction

HPF High-pass filter

ITR Information transfer rate

LASSO Least absolute shrinkage and selection operator

LCD Liquid crystal display LED Light-emitting diode LGN Lateral geniculate nucleus

LIS Locked-in state LPF Low-pass filter

xvi Acronyms

MEG Magnetoencephalographic NPSF Neural point spread function PSDA Power spectral density analysis]

PSD Power spectral density
PSF Point spread function
SCP Slow cortical potentials
SMR Sensorimotor rhythms
SNR Signal-noise rate

SSVEP-BCI BCI based on Steady-state visual evoked potentials

SSVEP Steady-state visual evoked potentials

TW Time window

VEP Visual evoked potentials VE Virtual environment