



Norwegian University of
Science and Technology



On Usage of EEG Brain Control for Rehabilitation of Stroke Patients

Tom Verplaetse¹, Filippo Sanfilippo², Adrian Rutle³,
Ottar L. Osen⁴, and Robin T. Bye⁴

¹Ghent University, Belgium

²NTNU in Trondheim, Norway

³Bergen University College, Norway

⁴Software and Intelligent Control Engineering (SoftICE) Laboratory,
Faculty of Engineering and Natural Sciences, NTNU in Ålesund, Norway
email: robin.t.bye@ntnu.no | web: blog.hials.no/softice

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Introduction

What is a stroke?



- a blood vessel bursts or is blocked by a clot
 - ⇒ blood supply to brain is interrupted or reduced
- brain cells deprived of oxygen die
 - ⇒ loss (paralysis) or impairment (paresis) of motor control
 - quadriplegia/-paresis (legs and arms)
 - paraplegia/-paresis (legs, lower part of body)
 - monoplegia/-paresis (arms)
 - hemiplegia/-paresis (one-sided paralysis/paresis)
- **partially monoplegic patients** with one paretic hand is common
 - ⇒ potential for **rehabilitation**

Stroke rehabilitation

- 1950s (Twitchell): partial/full recovery is possible with rehabilitation
- 1960s (Brunnstrom): Brunnstrom approach for determining stages of recovery
- 1970s (Fugl-Meyer): Fugl-Meyer assessment (performance-based impairment index)
- brain neuroplasticity enables structural and functional alterations of sensorimotor brain regions
 - ⇒ **adaptive brain reorganisation** and **cortical repair**
- some rehabilitation methods for a paretic arm:
 - exercise training
 - impairment-oriented training
 - functional electric stimulation
 - robotic-assisted rehabilitation
 - bilateral arm training
 - **mirror therapy**
 - **game-stimulated rehabilitation**

Common drawbacks with stroke rehabilitation



- labour intensive
- repetitive and boring exercises
- require personal interaction/instructions from trained personnel
- can last for many weeks/months
- equipment/systems are typically
 - expensive
 - non-portable
 - complex and difficult to operate
 - ⇒ located in hospitals/institutions
 - ⇒ required trained medical staff to operate
 - sessions must be booked, may have waiting time
- usually cannot be done at home at own pace

Mirror therapy



- **simple, inexpensive, patient-directed** rehabilitation method
- shown to improve hand/arm functioning after stroke, especially when used together with other conventional rehabilitation methods
- general paradigm:
 - patients simultaneously perform the same motor task with both paretical and normal hand/arm
 - **paretic hand is hidden** from sight
 - patients **view mirror image of normal hand** instead during task
 - ⇒ brain tricked into believing paretic hand functions well
 - ⇒ improves cortical reorganisation and repair

Example of mirror therapy

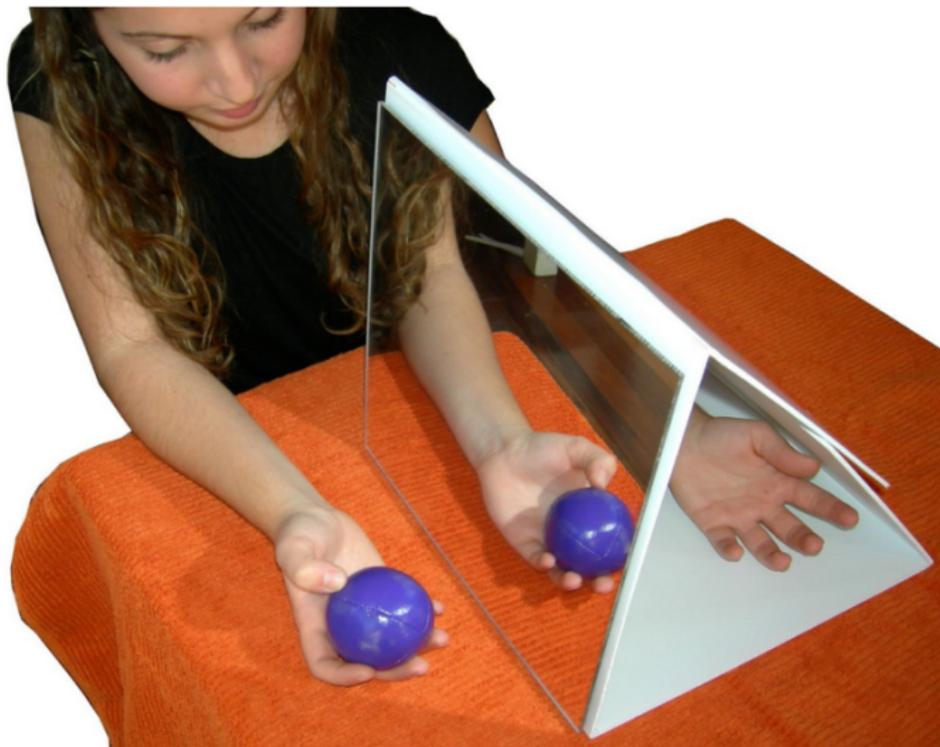


Figure: Commercial product Mirror Box by Neuro Orthopaedic Institute.

Game-stimulated rehabilitation



- 2000s: popularised, many studies
- effective stroke rehabilitation is intensive, repetitive, tiring
⇒ counteract using **game-stimulated rehabilitation**
- improve **motivation, enjoyment, engagement, diversity**
- may enable **rehabilitation at home** and **adaptive training**
- common platforms:
 - Nintendo Wii
 - PlayStation
 - Microsoft Kinect
 - Cyber Glove
 - Leap Motion
 - **Unity 3D game engine**
 - **Emotiv EPOC EEG**

Electroencephalography (EEG)



- measurements of the natural **electric potential** on the scalp
- reflects number of synchronous neural discharges
- EEG frequency bands:
 - delta (< 4 Hz)
 - theta (4–7 Hz)
 - **alpha (8–15 Hz)**: alert and cognitive states
 - **beta (16–31 Hz)**: purposive movements
 - gamma (> 32 Hz)
- ⇒ alpha and beta bands most relevant for stroke rehabilitation
- much good **low-cost commercial-off-the-shelf (COTS) EEG** equipment exists, e.g., **Emotiv EPOC EEG**

Motor-imagery brain-computer interface (MI-BCI)



- EEG-based **MI-BCI** can help paretic or paralysed stroke survivors to interact using brain waves instead of muscles
- reports on EEG-based MI-BCI combined with robotic feedback neurorehabilitation for stroke patients
- event-related desynchronization/synchronization in sensorimotor oscillatory rhythms associated with MI
- use rhythms/**frequencies** as inputs to BCI
- MI can replace actual physical task performance while still induce neural plasticity changes, e.g., **brain wave control** of a **virtual arm** in a computer game instead of one's physical arm

Steady-state visually evoked potential (SSVEP)



- EP: specific patterns in brain activity evoked by inputs to patients
- SSEP: input stimulus with steady frequency causes EEG activity at same frequency
- **SSVEP: EEG frequency** induced and synchronised with **visual input frequency** (e.g., flashing screen)
- can use SSVEP to increase EEG activity in desired frequency bands
- BCI with SSVEP can have **higher information throughput** and require **shorter training**
- may cause epileptic seizures and induce fatigue
- we hypothesise that **adding SSVEP to BCI may improve stroke rehabilitation**

Motivation and aim

- Most stroke rehabilitation require
 - **expensive** and **complex** equipment
 - **trained** medical **staff**
 - patients must **travel** to hospitals/institutions at given times
 - tasks that are **repetitive** and **boring**

⇒ Motivation: costly, time-consuming, stressful, unmotivating, not flexible or adaptable, . . .
- **mirror therapy** and **game-stimulated rehabilitation** counteract drawbacks

⇒ Aim: **combine** the best of these methods

 - + use **Unity 3D** virtual reality (VR) environment
 - + interface **Emotiv EPOC EEG** headset for brain wave control
 - = **flexible** and **easy-to-use low COTS** solution
 - can be **used at home** without medical staff
 - **adaptable** to user progression
 - **motivational** game environment
 - **easy to extend** to other interfaces/devices, e.g. robotic exoskeleton for manipulating the paretic hand

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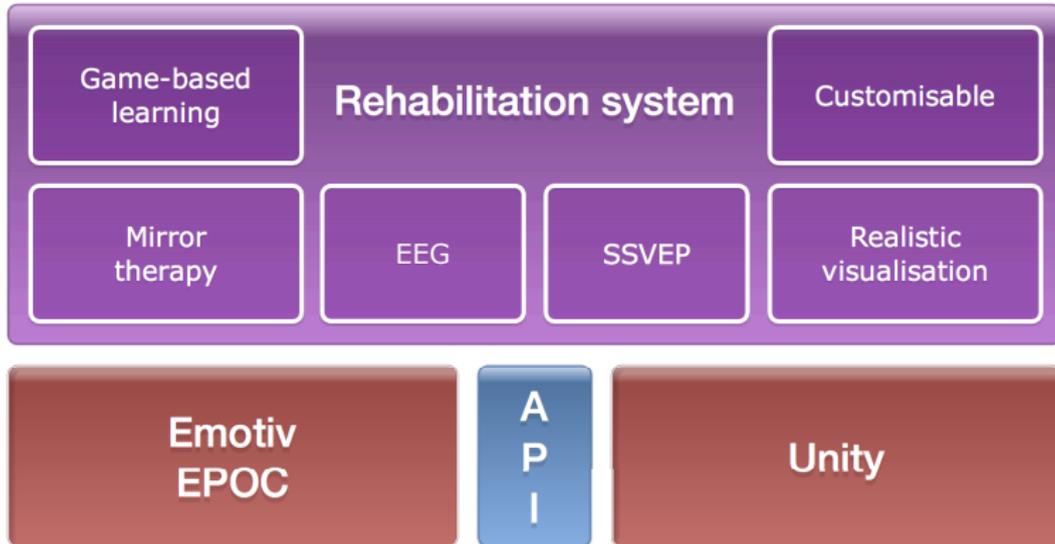
Q & A





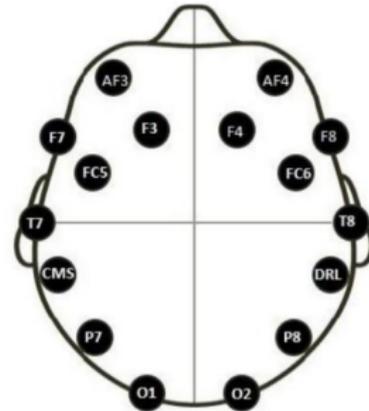
Method

Overview of rehabilitation system



EEG data acquisition

- Use the Emotiv EPOC EEG headset
 - high-resolution, multi-channel, portable system
 - bluetooth wireless transmission to computer
 - **14 EEG channels** placed as in 10-20 system:



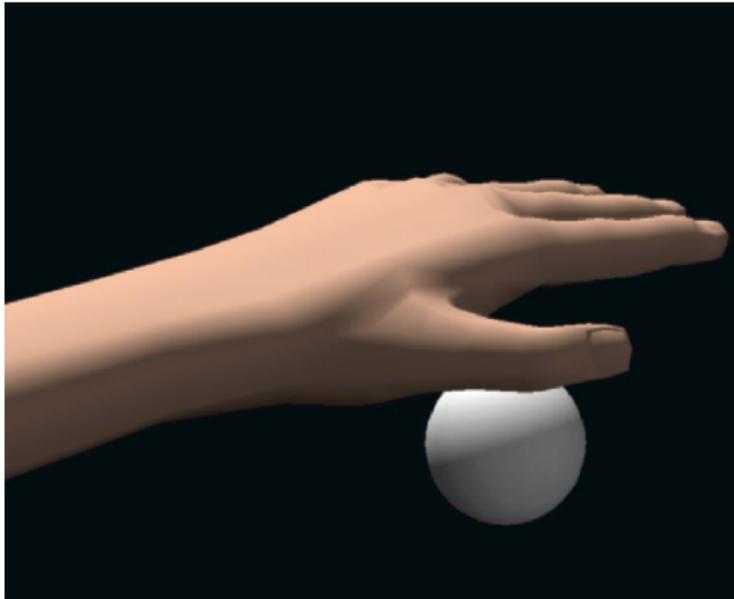
Training of mental commands



- use Emotiv software for EEG pattern recognition
- build up library of trained mental commands
- use Emotiv API to map commands into controls in Unity, e.g. control of virtual paretic hand in 2D horizontal plane (commands 'left', 'right', 'forward', 'back', 'open', 'close')
- we have integrated Emotiv's own training environment into our virtual environment (VE) in Unity
- crucial: patients should try to move the paretic/nonparetic hands while training (like mirror therapy)
⇒ link EEG patterns emerging from physical hand movements to brain control of virtual hand in Unity

3D model of the paretic hand

- **brain must be tricked** into believing paretic hand functions normally \Rightarrow realistic behaviour and looks
- use Blender for 3D model of paretic hand with internal set of finger joints
- program joints to move **realistically** and **coordinated** in **synergy**



Unity 3D application I



Main interactive scenes:

Main Menu: **start scene** and **navigation** to other scenes

- Settings:**
1. **hand movement speed** during reaching for object
 2. **hand close speed** when grasping an object
 3. **target score** for game level completion
 4. **SSVEP frequency**

Training Environment:

- essentially the same as Emotiv's native but **integrated** in app
- **train mental commands** and store in **calibrated profile** for each user

Unity 3D application II

Game Rehabilitation Environment:

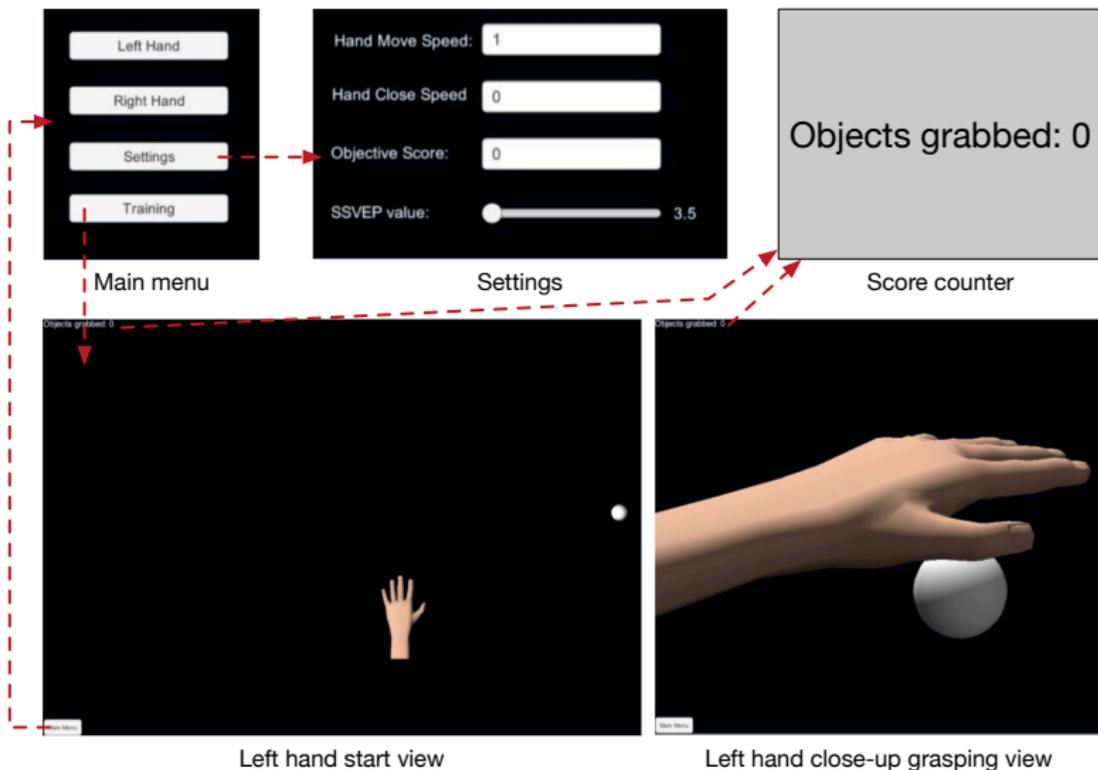
- current work: left paretic hand only, and only a single training exercise
- future versions: easily extend to right hand and more exercises
- **reaching task:**
 - top view of hand in xy-plane
 - EEG brain control using four commands ('left', 'right', 'forward', 'backward')
 - move hand towards target object
- **grasping task:**
 - close-up 3D view of hand and object
 - EEG brain control using two commands ('open', 'close')

Unity 3D application III

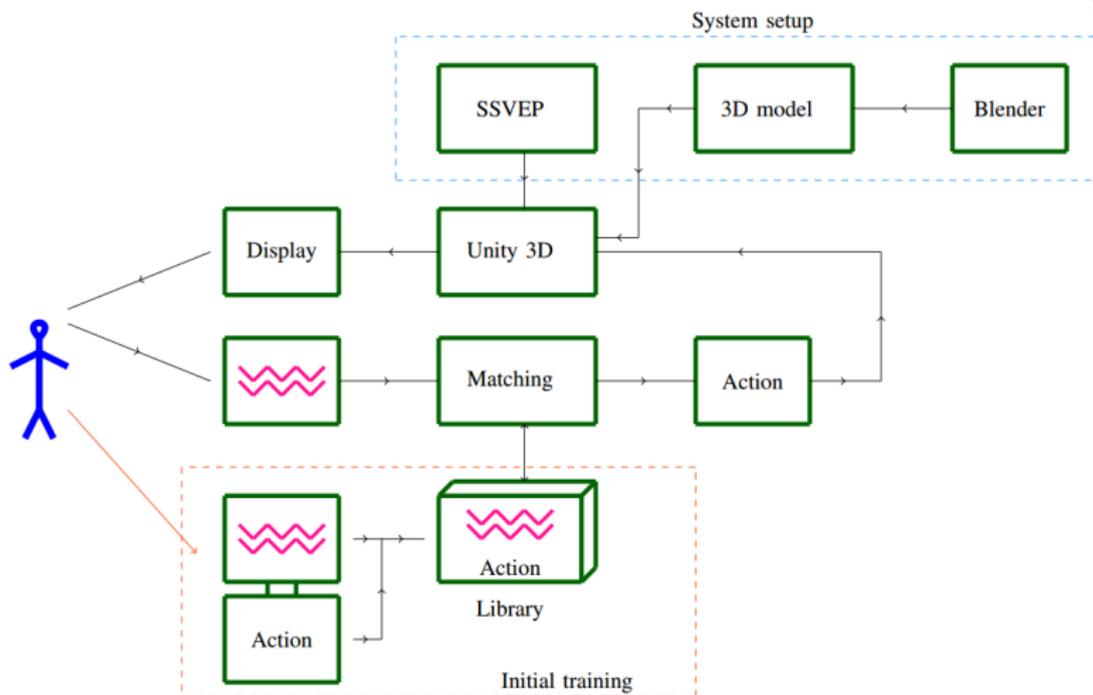


- **close command** must last for a **minimum duration** for success \Rightarrow increase score counter & reset game
- important that patient tries to **move paretic hand simultaneously** while using EEG brain control of virtual hand
- **SSVEP background colour flashes** at set frequency (can be turned on/off)

Screenshot of rehabilitation app



Rehabilitation system diagram



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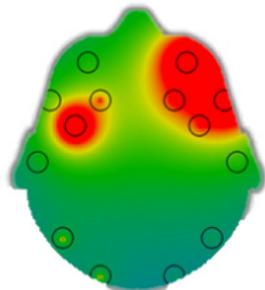
Proof-of-concept rehabilitation system



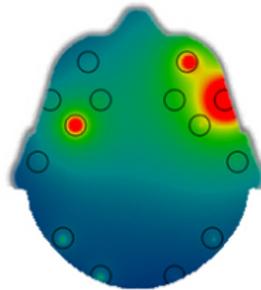
- **complete but minimal** system constructed (left hand + 1 exercise only)
- system can easily be extended to right hand and a library of exercises
- **no patients** have yet tried the system
- **healthy participants** successfully able to **complete exercise**
- tested several settings (reach and grasp speeds, SSVEP frequency), in particular the **effect of SSVEP**

Effect of SSVEP on EEG activation

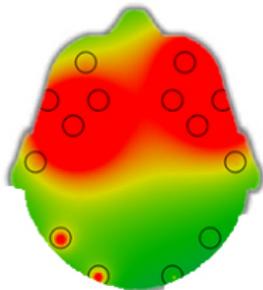
Much higher EEG activation with SSVEP in both alpha and beta bands:



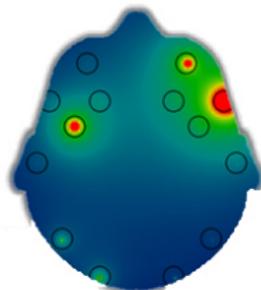
Alpha waves with SSVEP



Alpha waves without SSVEP



Beta waves with SSVEP



Beta waves without SSVEP

Effect of SSVEP on game completion time

- game complete after four successful reach-and-grasps
- one exercise \approx 30 sec \Rightarrow game \approx 2 mins
- participant completed game five times with/without SSVEP
- using SSVEP **reduced completion time**:
average reduction in completion time 15 seconds (12%)
- results motivates a future thorough study with patients and healthy participants

Trial	Without SSVEP (mm:ss)	With SSVEP (mm:ss)
1	02:04	01:43
2	01:58	01:46
3	02:34	02:06
4	02:16	01:55
5	01:52	01:59
Average	02:09	01:54
St. dev.	00:16	00:09

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Summary and conclusions

- demonstrated **fast prototyping** of **low-cost COTS stroke rehabilitation system**
- combines **interactive 3D VR game environment** (Unity) with **EEG brain control** (Emotiv EPOC EEG)
- **proof-of-concept system** is **complete** but **minimal**
- system inspired by **mirror therapy** and **game-stimulated rehabilitation**
- programmable exercises enables vast possibilities for motivational game-like rehabilitation
- potential advantages:
 - **game-based** and **immersive** training exercises
 - very **customisable** and **extendable**
 - **adaptable** and **stand-alone at-home system** without the need of personal instructor
 - **low cost** and **flexible**

Future work



- system must be **refined**, **adjusted**, and **extended** in close **cooperation** with **medical experts** and **testing on real patients** before **clinical trial**
- may be **used alone** or as **supplement** to conventional therapy
- may consider **interfacing** to **external physical devices**
 - ⇒ use Unity for **virtual prototyping** in early stages
 - hand exoskeleton or haptic glove with kinaesthetic feedback
 - ⇒ guide patient with appropriate force feedback
 - use EEG brain waves to control prosthetic hand for fully paraplegic hand/arm patients

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SOFTICE LAB

Software and Intelligent Control Engineering @ NTNU in Ålesund

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Thank you for listening!

Questions?