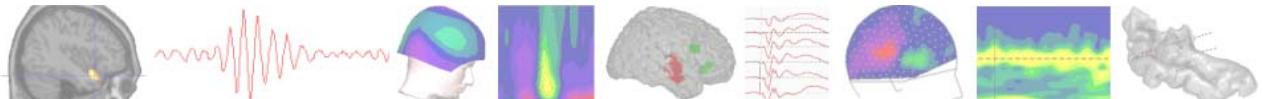


Dynamique Cérébrale et Cognition Inserm U821, Lyon



Interfaces Cerveau-Machine

Olivier Bertrand



Interfaces Cerveau-Machine

Les Interfaces Homme-Machine (IHM) :

Interactions avec la machine via une commande motrice (interrupteur, souris, clavier, capteurs de mouvement, orientation du regard, parole, ...).

Les Interfaces Cerveau-Machine (ICM) :

Interactions avec la machine par la seule mesure de l'activité cérébrale et sans commande motrice.

La mesure la plus utilisée : l'activité électrique cérébrale

→ **électrophysiologie en temps-réel**

Real-time electrophysiology

To measure in real-time electrophysiological components (spike, LFP, EEG, MEG) specific to a particular mental process or state, with multiple (potential) applications :

Brain-Machine Interface (BMI) to control external devices

- to restore communication in patients with strong motor disabilities

NeuroFeedback Training (NFT) and Rehabilitation

- self-regulation of specific brain activities
- domains : attention disorders, motor rehab., depression, epilepsy, pain, ...

Basic Neuroscience

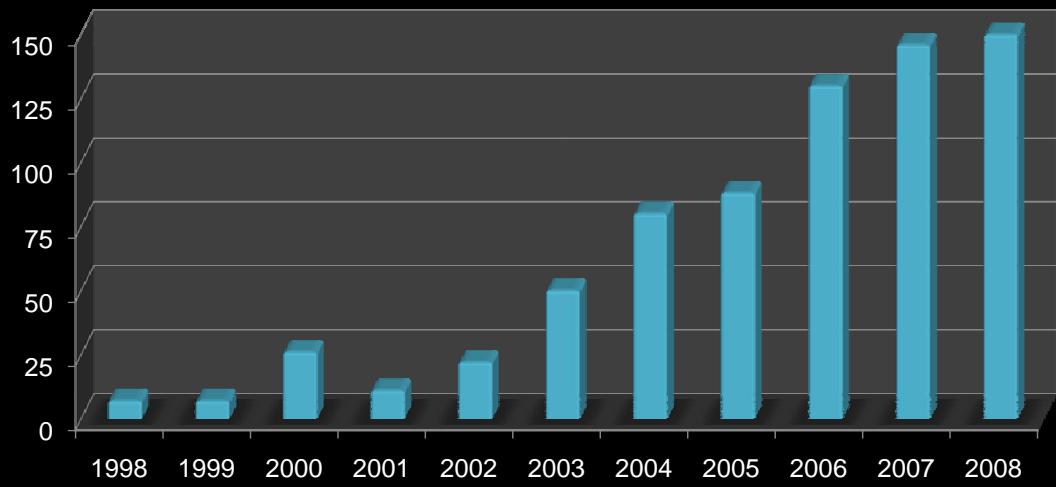
- to better understand the « neural code » and brain plasticity
- dynamic manipulation of an experimental protocole according to brain state

Video-games

- enriched game-play or « serious games »

Paper production

Brain-Computer Interface & Neurofeedback papers

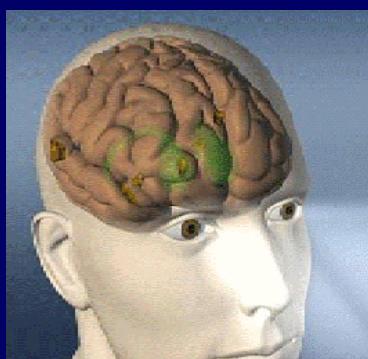


20 years ago : 3-4 groups world-wide

10 years ago : 6-8 groups

2009 : ~ 100 groups

Brain-Machine Interface - BMI (BCI)



feedback



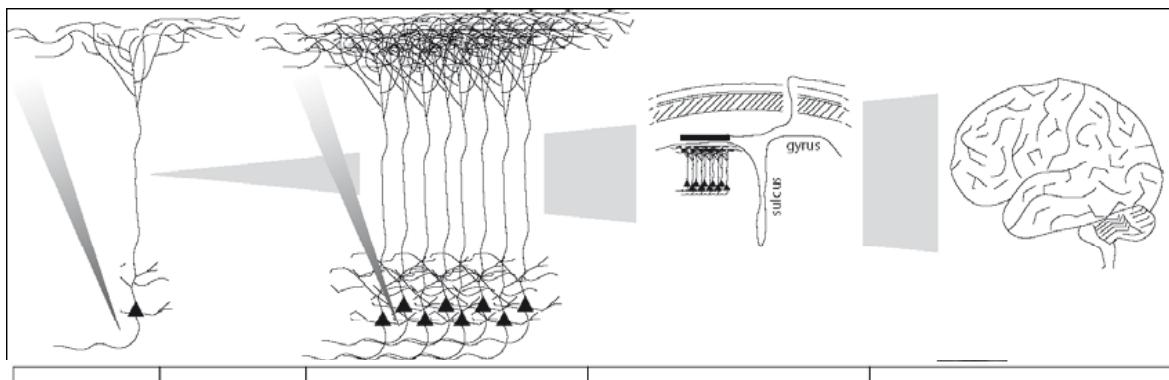
closed-loop BCI

signal acquisition

translation
to commands

real-time
signal
processing
(feature extraction, classification)

Electrophysiological signal recordings



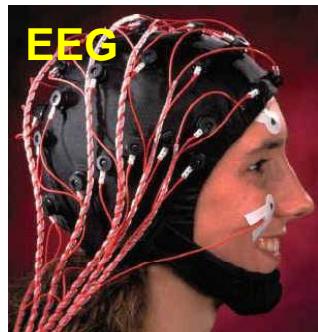
1 ← → >1 ← → size of neuronal cluster ← → >100.000
high ← ← spatial resolution ← → low
invasive ← ← non-invasive → →



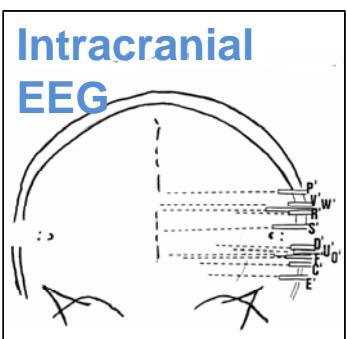
Electrophysiological signal recordings



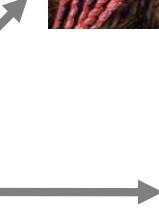
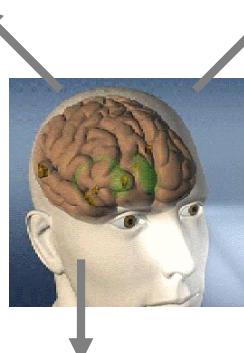
(a) • ElectroCorticoGram



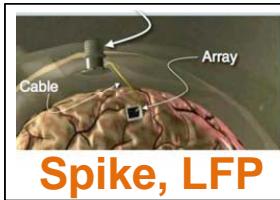
EEG



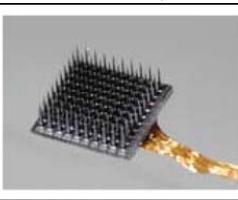
Intracranial
EEG



MEG



Spike, LFP

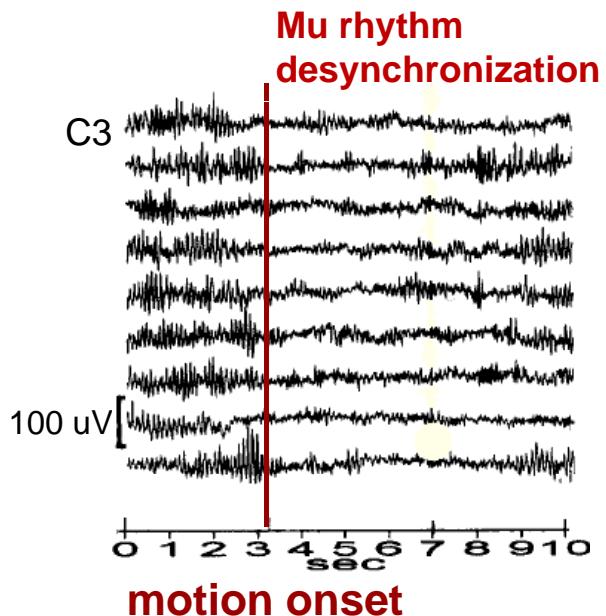
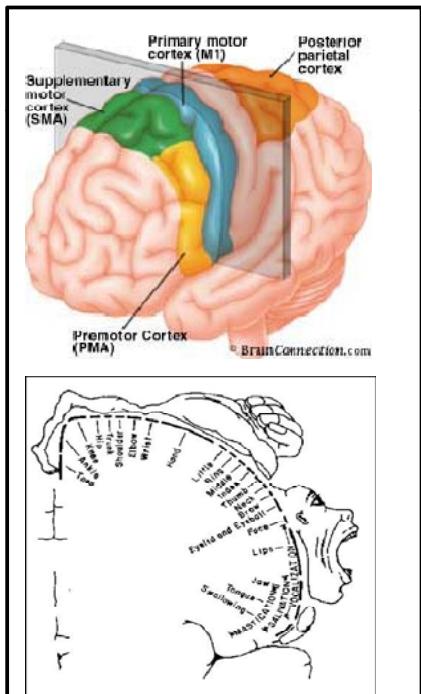


Brain-Machine Interface (BMI)

- **BMI as a communication aid without movement.**
- **Clinical goals** ⇒ to restore communication and control to people with severe motor disorders:
 - amyotrophic lateral sclerosis (ALS)
 - spinal cord injury
 - muscular dystrophies
 - brainstem stroke, locked-in syndrome.
- **Invasive or non-invasive BMIs**
- to learn how to associate a mental state to a desired action (good mental processes and good markers ?)
 - **endogenous processus:** e.g., motor imagery

Non-invasive BMIs (motor imagery)

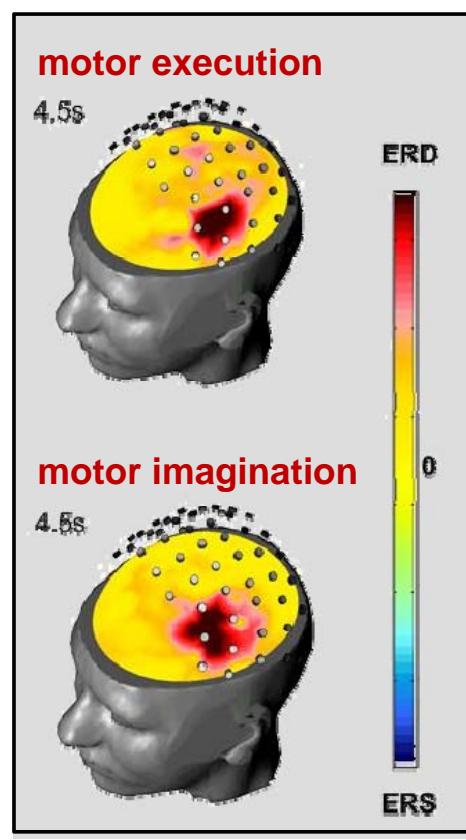
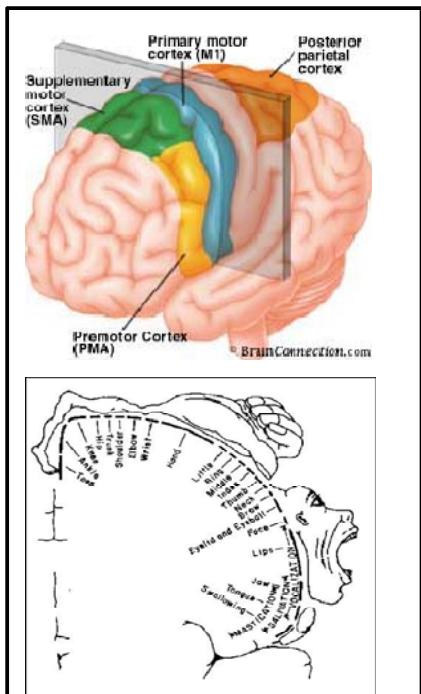
Sensorimotor rhythms:
mu (~10 Hz) and beta (15-25 Hz) ERD



Pfurtscheller

Non-invasive BMIs (motor imagery)

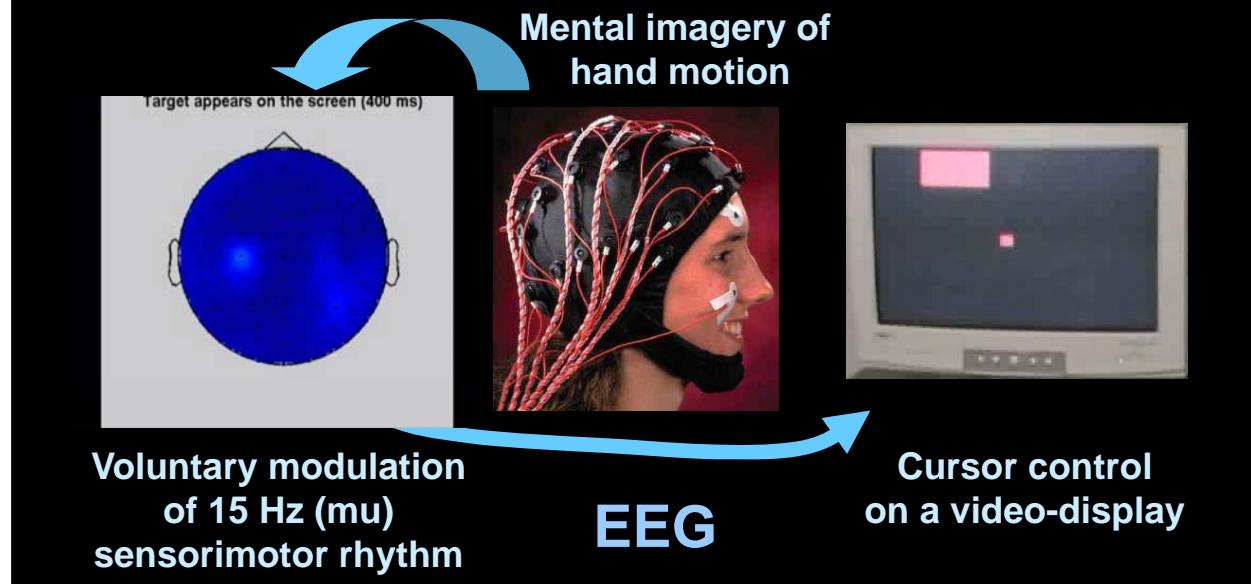
Sensorimotor rhythms:
mu (~10 Hz) and beta (15-25 Hz) ERD



Pfurtscheller

Non-invasive BMIs (motor imagery)

Pfurtscheller et al. (2006) Brain Res.
Wolpaw and McFarland (2004) PNAS



This approach requires extensive training

ICM non-invasive (imagerie motrice)

- Phase de calibration (off-line)
 - Instructions au sujet (imagerie main droite, main gauche)
 - choix de la fréquence et des électrodes du rythme mu
 - calcul du gain, ex : déplacement curseur/puissance du mu
- Phase d'utilisation (on-line)
 - estimation du mu en temps-réel (fenêtre ~ 0.5 à 1 s)
 - transformation en temps-réel : puissance mu → déplacement du curseur
- Problèmes
 - variabilité interindividuelle importante
 - apprentissage difficile, recalibrations régulières

10-15 Hz mu rhythm analysis

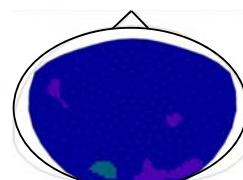
rest



real right hand movement



real left hand movement

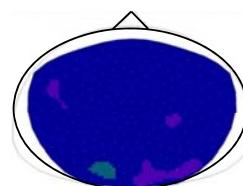


MEG

real movement

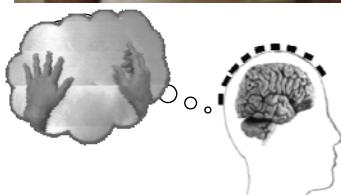
10-15 Hz mu rhythm analysis

rest

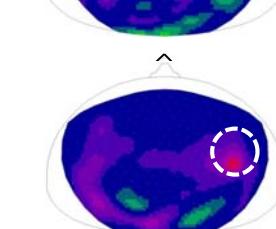
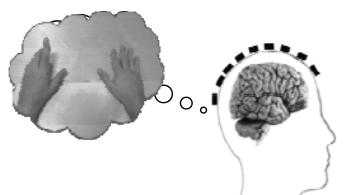


MEG

imagination of
right hand
movement

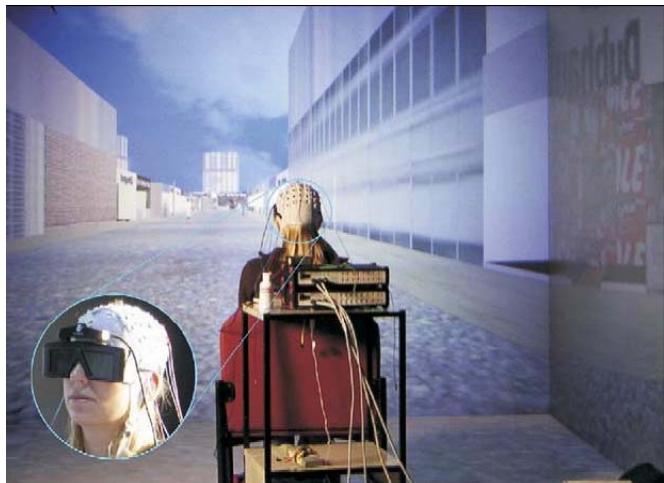


imagination of
left hand
movement



imagination of
movement

Non-invasive BMIs (motor imagery)

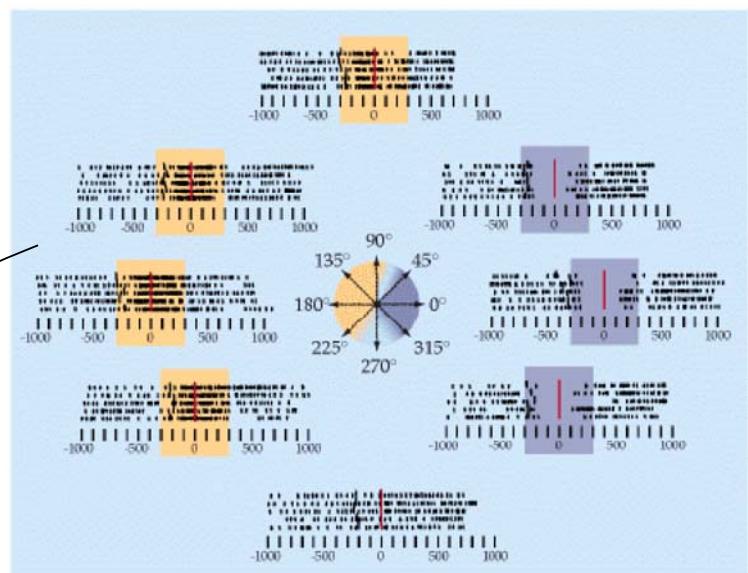
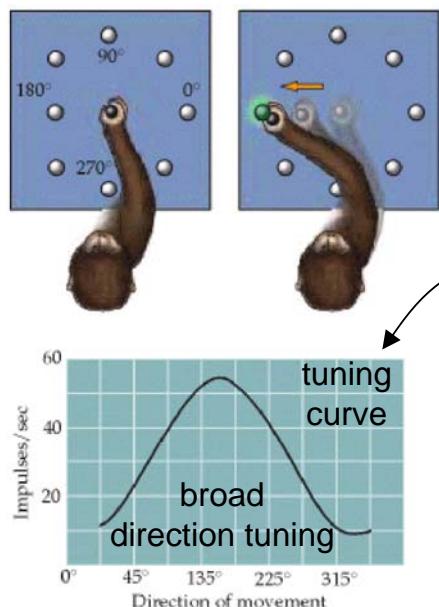


Foot vs hand movement (go/stop)
in virtual reality environment
after extensive BMI training

Pfurtscheller et al 2006

Invasive BMI

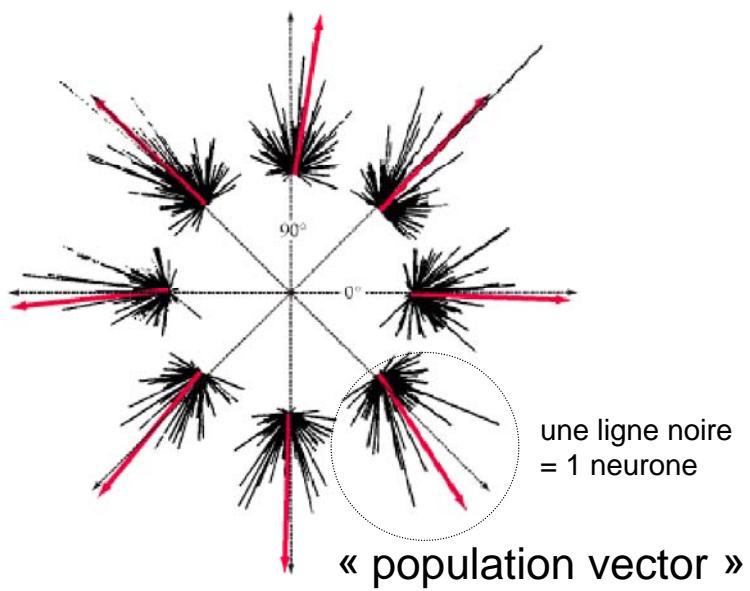
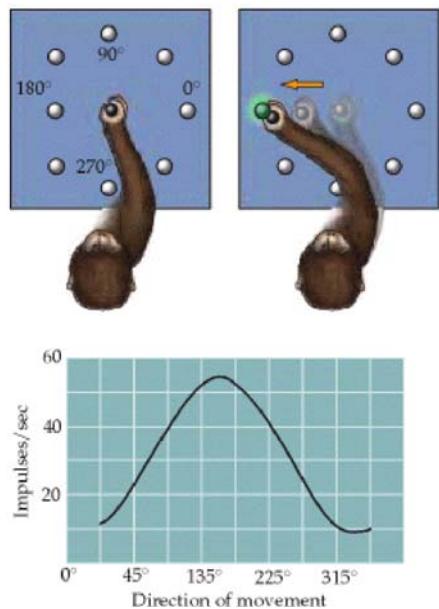
Codage par population de la direction du mouvement



un neurone du cortex moteur primaire
(faible sélectivité à la direction du mouvement)

Georgopoulos et al., 1986

Codage par population de la direction du mouvement



prédition possible
de la direction du mouvement

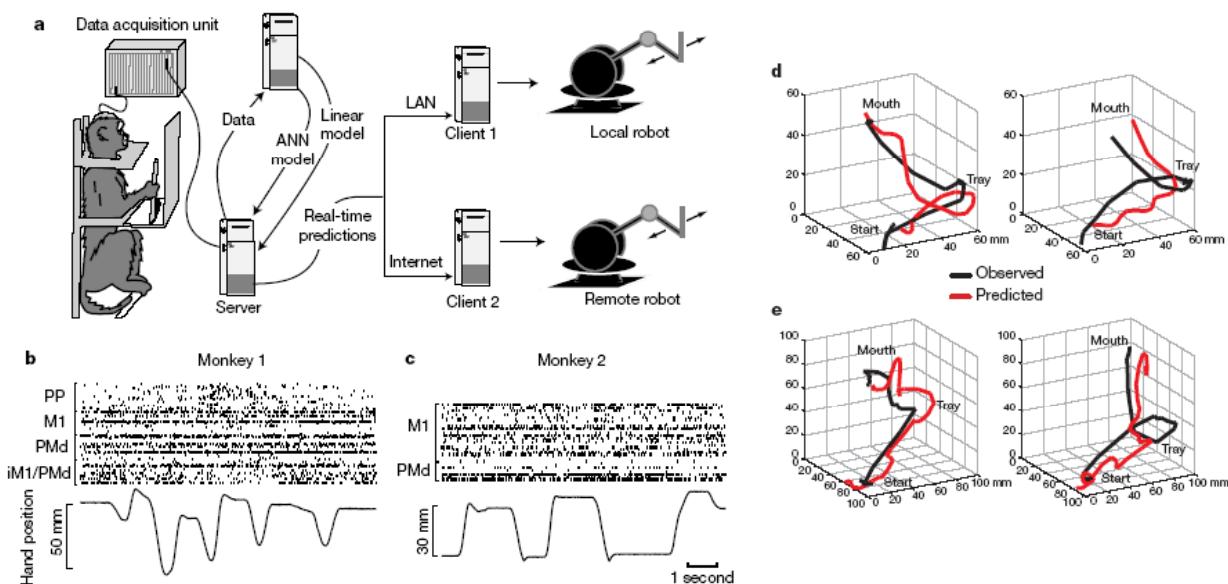
Georgopoulos et al., 1986

Real-time prediction of hand trajectory by ensembles of cortical neurons in primates

movement prediction from electrodes in premotor, primary motor, and posterior parietal cortical areas

Johan Wessberg*, Christopher R. Stambaugh*, Jerald D. Kralik*,
Pamela D. Beck*, Mark Laubach*, John K. Chapin†, Jung Kim‡,
S. James Biggs‡, Mandayam A. Srinivasan‡ & Miguel A. L. Nicolelis*§||

Nature, 2000



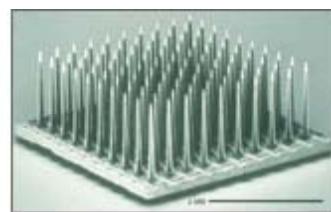
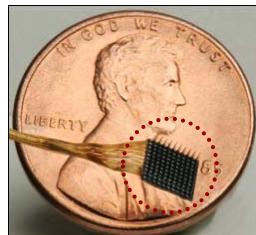
Equipe Nicolelis, USA – Wessberg et al, Nature, 2000

Robotic arm control with micro-electrode array (5 degrees of freedom)



Velliste et al., 2008

Invasive BMIs



Cortical implant in complete tetraplegia



- Motor cortex implant,
- Records spiking activity from 100 neurones,
- **Intention-driven neuronal activity**
- Computes a linear model after training session
- Cursor control
- Short training period

Donoghue's Team— Hochberg et al., Nature, 2006

Non-invasive BMIs

- Other BMIs for restoring communication
 - **stimulus-driven activity:**

Voluntary orientation of attention on certain stimuli

Specific modulation of certain evoked components

- P300,
- steady-state responses

P300 Speller BMIs

Selective attention on the letter to select \Rightarrow P300

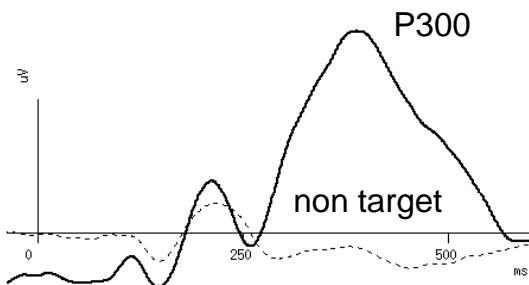
Task : to count the selected letter
when it flashes (10 to 15)

Stimulus : flashing by lines or
columns (ISI ~150 ms)



EEG

A	B	C	D	E	F
G	H	I	J	K	L
M	N	O	P	Q	R
S	T	U	V	W	X
Y	Z	1	2	3	4
5	6	7	8	9	-



P300 Speller BMIs

Selective attention on the letter to select \Rightarrow P300

Trade-off between
robustness and speed

\sim 5 letters /minute

Current improvements :

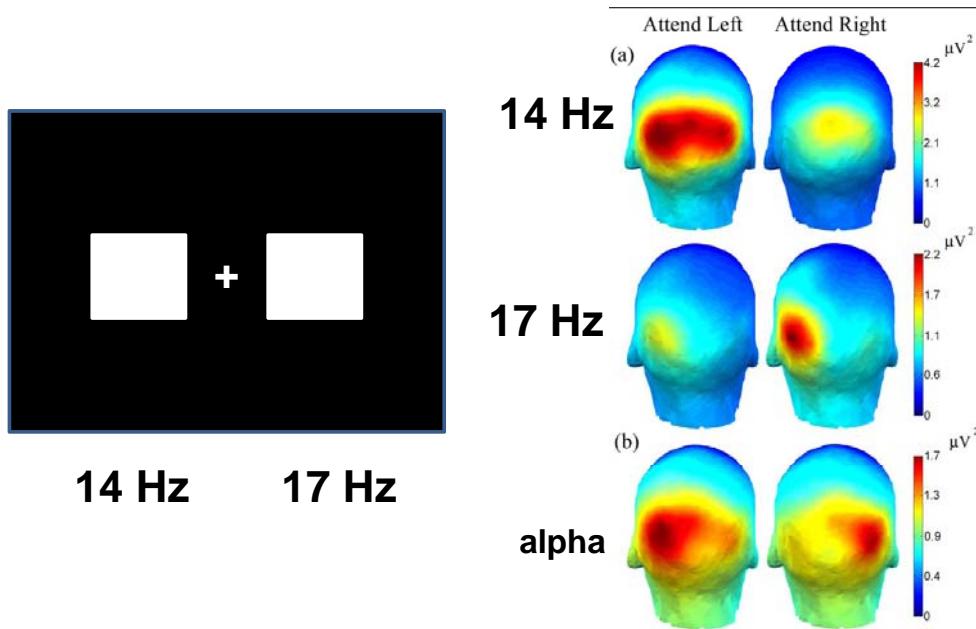
- Adaptive classification to optimize bit-rate
- Word selection instead of spelling letter by letter (word prediction algorithm coming from mobile phone world).

A	B	C	D	E	F
G	H	I	J	K	L
M	N	O	P	Q	R
S	T	U	V	W	X
Y	Z	1	2	3	4
5	6	7	8	9	-

Visual Steady-State response

Frequency tagging of visual stimuli and selective attention

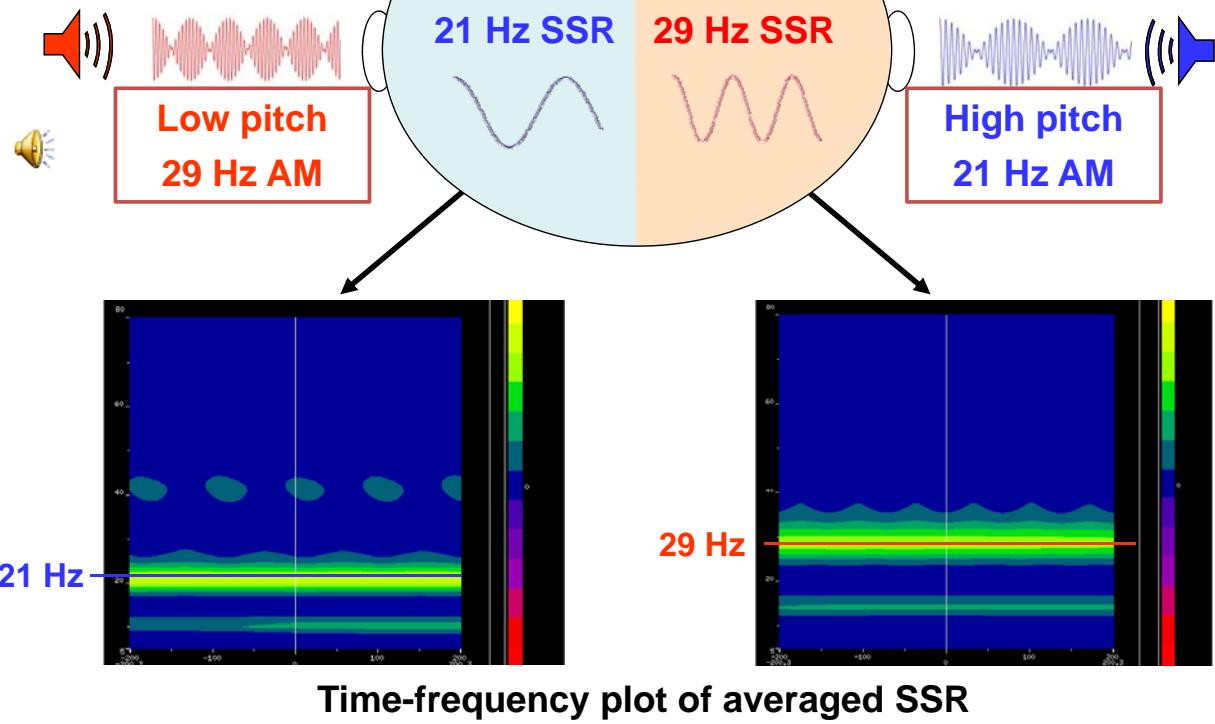
Un stimulus périodique engendre une réponse cortical périodique (même fréquence)



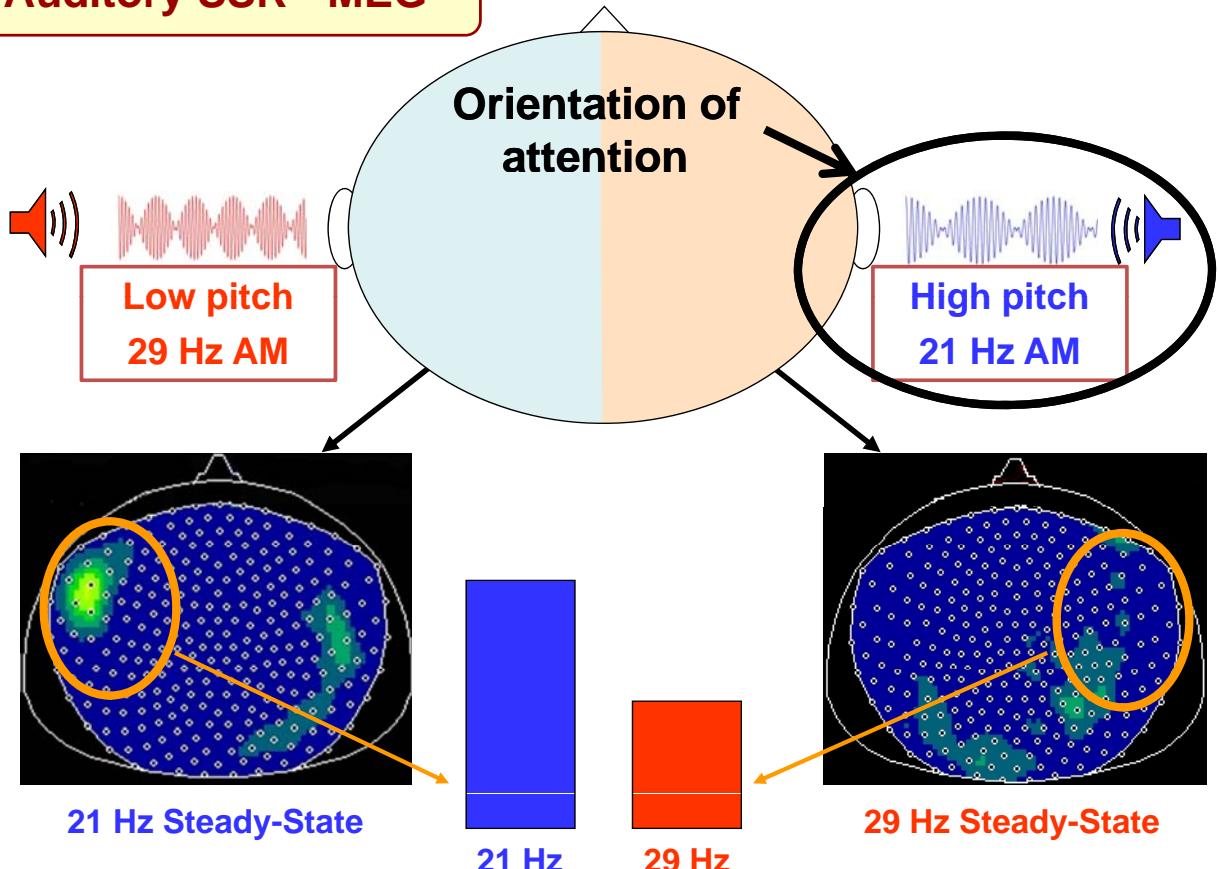
Kelly et al, 2005

Auditory SSR - MEG

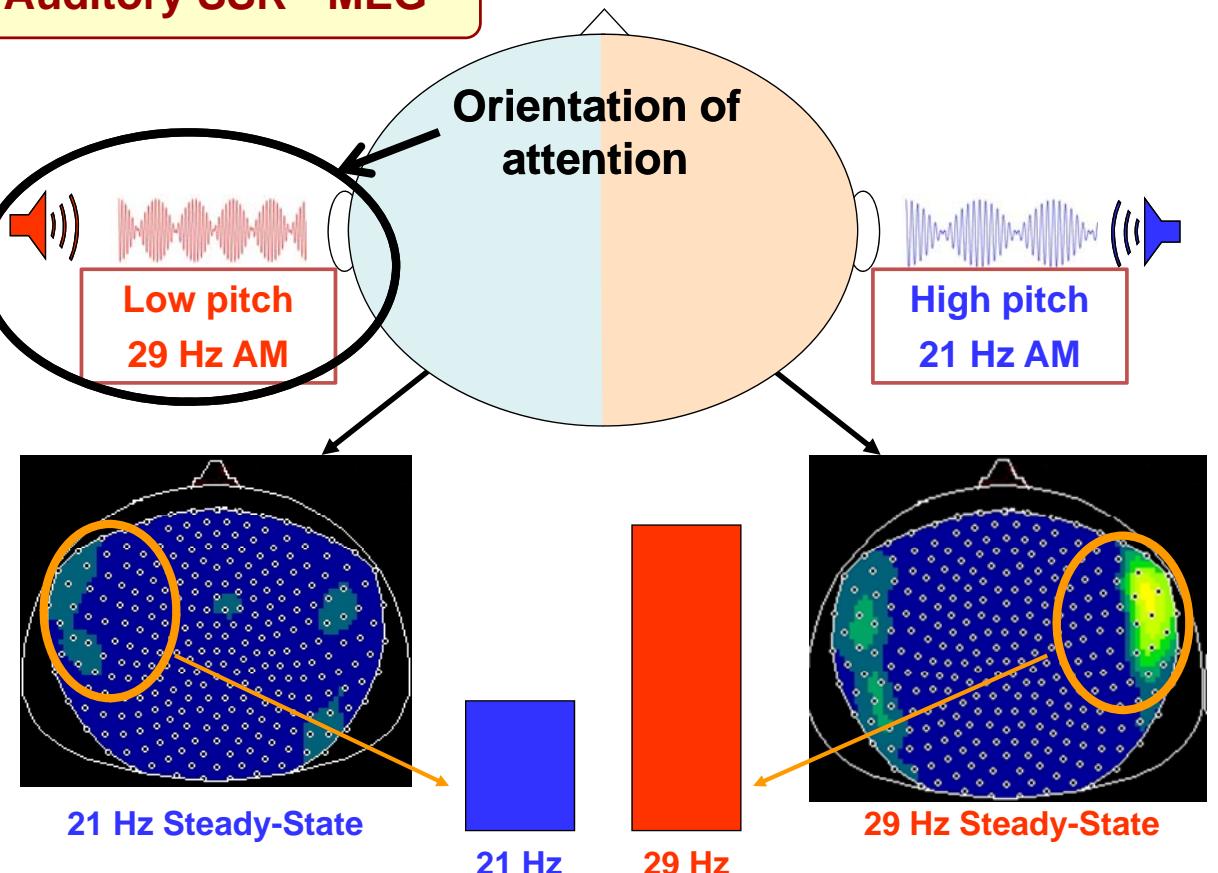
Frequency tagging of auditory streams and selective attention



Auditory SSR - MEG

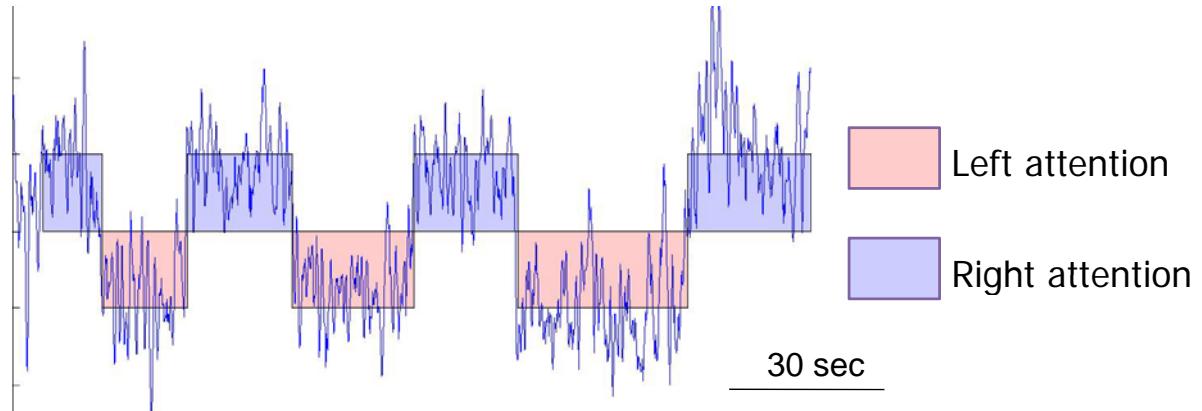


Auditory SSR - MEG



Auditory SSR - MEG

LDA classification on 2-sec moving time-windows
based on spectral power at f and 2f over temporal regions



**Auditory SSR as a possible marker
for real-time attention monitoring/control**

Remarques sur les différents BMI

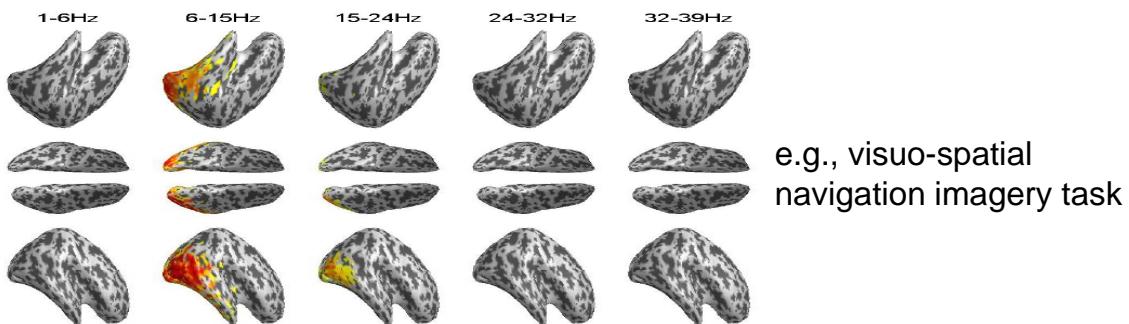


- Imagerie mentale motrice
 - **non-invasif (EEG, MEG) :**
 - difficultés d'apprentissage, concentration nécessaire
 - variabilité inter- et intra-individuelle
 - ~60% des sujets sont capables de faire la tâche
 - **invasif (micro-electrode array) :**
 - apprentissage plus rapide
 - moins sensible aux autres activités mentales
- Attention sélective (visuelle, auditive)
 - **non-invasif (EEG, MEG) :**
 - peu d'apprentissage, plus naturel
 - débit lent, fatigue

- Other BMIs for restoring communication
 - **endogeneous processus:** other types of imagery

To consider various types of mental tasks (verbal, visual, spatial) to benefit from better contrasts due to hemispheric specialization

To include **source reconstruction and coherence/synchrony** measures to improve selection of the most discriminant features.



M. Besserve, PhD 2007

Magnetoencephalography and BMI ?

- MEG is obviously not an appropriate device for an operational BMI dedicated to communication and control in disabled (size, price, complexity, ...)
- MEG could certainly help to identify new markers for BMI, during an exploratory phase, that could then be adapted to EEG recordings.
- MEG could be useful to efficiently train subjects to learn a BMI (good compromise between temporal and spatial resolution, and functional specificity).
- MEG is quick to install, and non-invasive



BMIs for rehabilitation purposes

- Use of the plasticity properties of the brain
- NeuroFeedback training (NFT) based on BMI:
 - Self-regulation of a specific brain activity (oscillatory, transient responses, slow waves)
 - Same technical principles as BMI
 - Training of occipital alpha and frontal theta
 - attention disorders, relaxation
 - epilepsy
 - pain

Very empirical, no strong study on the neurophysiological mechanisms of NFT

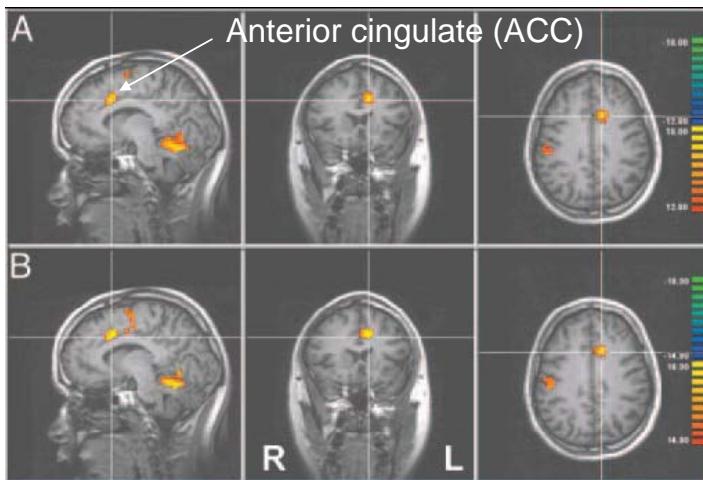
Revival with fMRI and MEG

fMRI Neurofeedback Training

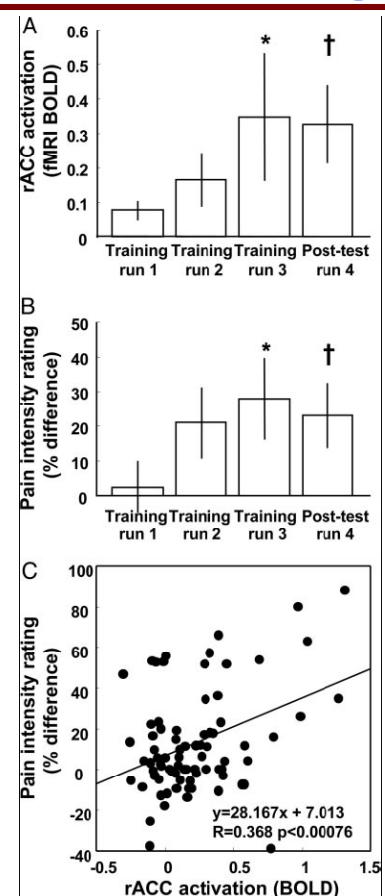
Control over brain activation and pain learned by using real-time functional MRI

deCharms et al. PNAS, 2005

Delay of ~8s for the feedback



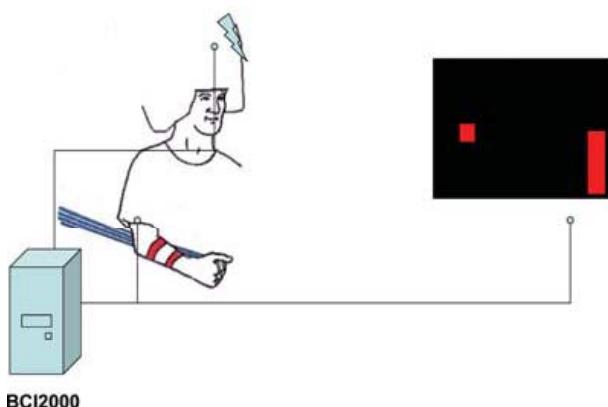
- voluntary control over activation in a specific brain region (ACC),
- leads to control over pain perception,
- Impact on severe, chronic clinical pain.



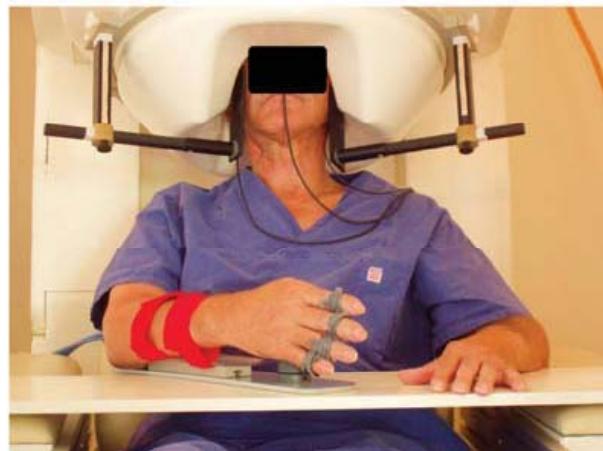
MEG Neurofeedback Training

Motor deficits after stroke

MEG recordings



B



Task : Self-modulation of sensorimotor rhythm (mental imagery)

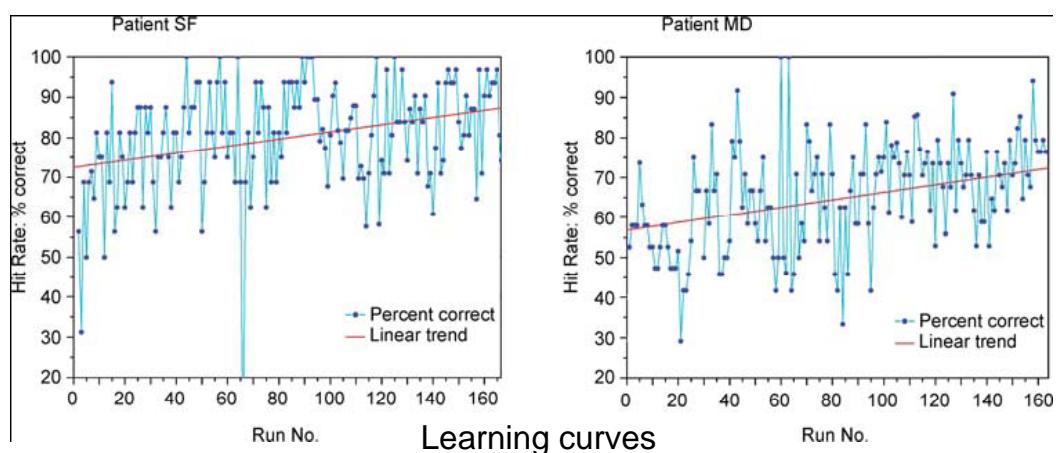
Feedback by up-down motion of the cursor on the screen

- + Feedback by proportional motion of the orthosis on the paralysed hand
- *Sensory input related to motor control*

Birbaumer, 2007

MEG Neurofeedback Training

Motor deficits after stroke



Task : Self-modulation of sensorimotor rhythm (mental imagery)

Feedback by up-down motion of the cursor on the screen

- + Feedback by proportional motion of the orthosis on the paralysed hand
- *Sensory input related to motor control → Speed-up plasticity*

Birbaumer, 2007

Need to target: specific brain activities,
in specific brain regions,
related to specific brain processes.

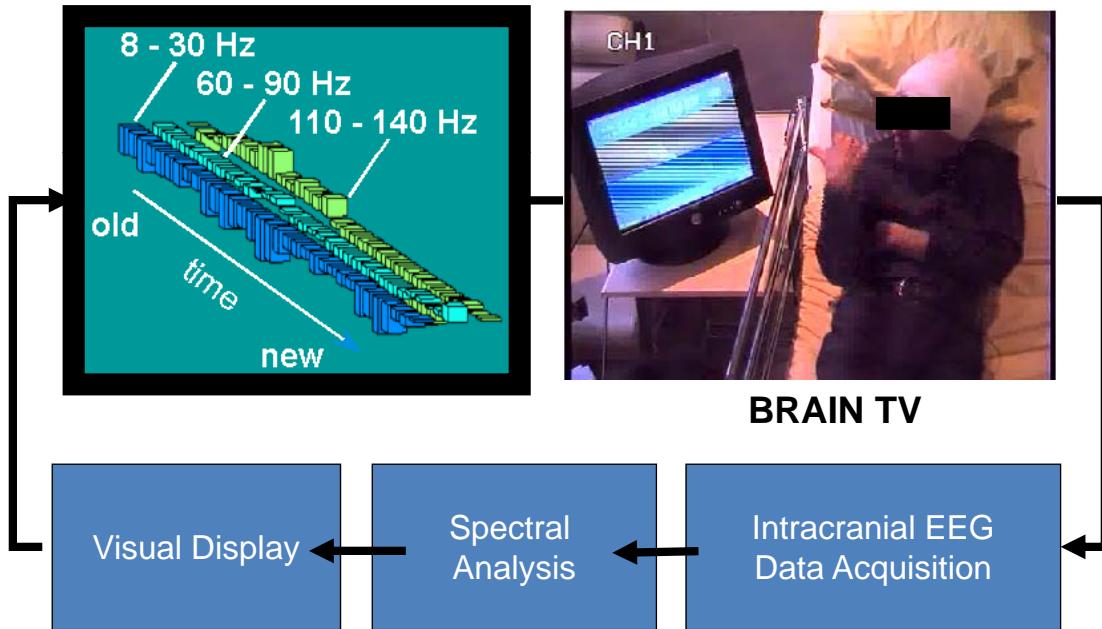
Requires to better understand the mechanisms of certain pathologies in terms of dysfunctioning regions, networks and interactions.

Requires to understand the potential mechanisms of neural plasticity and cortical reorganization related to certain pathologies.

**Other applications
of real-time electrophysiology**

Real-Time Oscillatory Brain Mapping (Epilepsy)

Real-time quantification of alpha,beta and gamma activity



Lachaux et al. PLoS One, 2007

Collaboration Ph. Kahane, CHU Grenoble

Real-Time Oscillatory Brain Mapping

BRAIN TV

« Each time you play music, gamma goes up ! »



« If I sing, almost nothing »



No gamma when we speak



Little gamma for loud noises

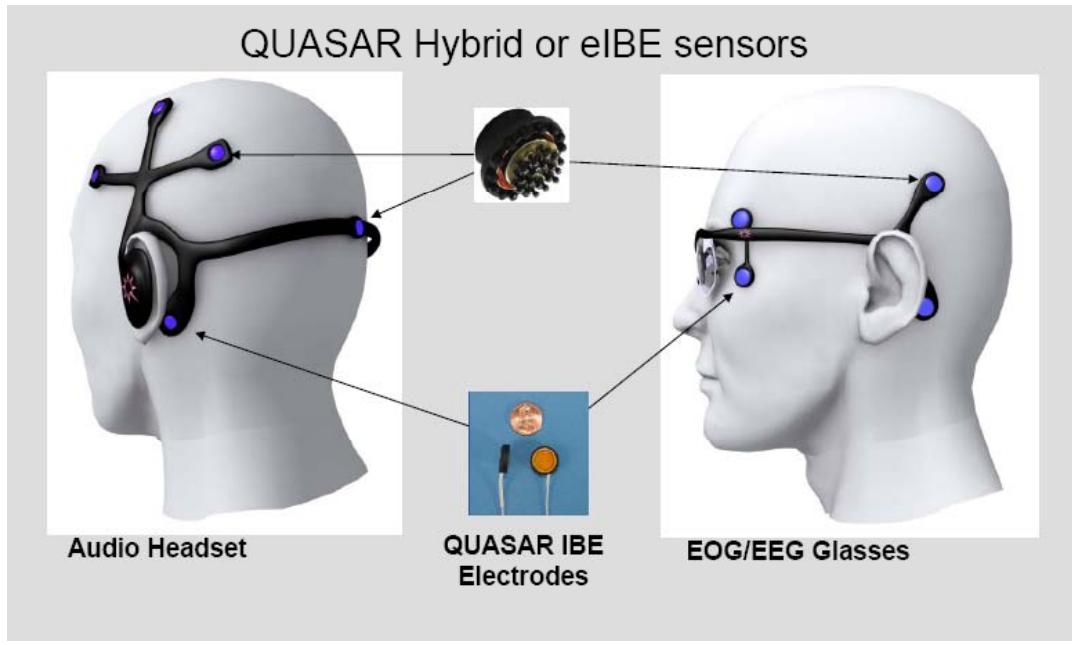


Lachaux et al.
PLoS One,
2007

A growing field : real-time EEG for video-games

(Nintendo, Sony,, + several small companies)

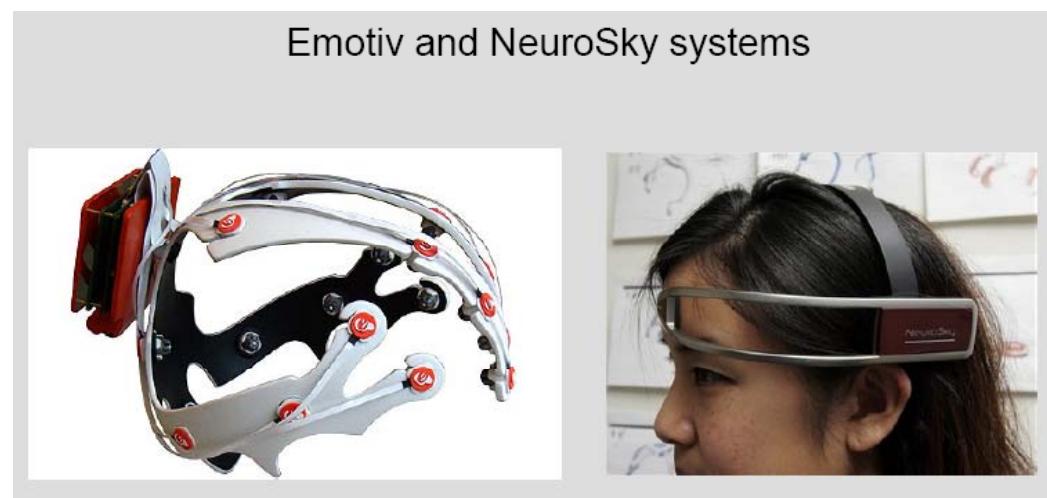
An opportunity for the development of new technologies.



A growing field : real-time EEG for video-games

(Nintendo, Sony,, + several small companies)

An opportunity for the development of new technologies.



Multidisciplinary challenges

