

# An EEG-Based Natural BCI for Volitional 2-D Cursor Control

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# Critical challenge for BCI?

• BCI Purpose: direct brain control.

BCI & Volition

- Brain signal:
  - Reliably decode subject's volition: high Signal-to-Noise Ratio (SNR) is required



# **Signal Methods**

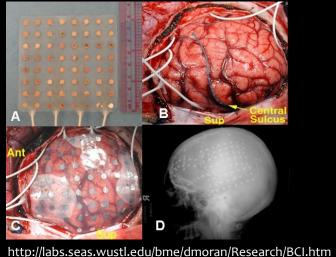
#### Invasive BCI

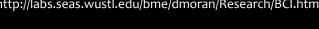
- Pros
  - Better SNR
- Cons
  - Clinical threshold
  - Technical difficulties

#### Non-invasive BCI

- Pros
  - Easy to use
- Cons
  - Low signal-to-noise ratio:

large variance









# **Rhythm Regulation**

To increase SNR (reduce variance): EEG rhythm regulation (Wolpaw and McFarland, 2004)

However, the artificial regulation requires:

- Long-term training
- Much attention & mental effort: fatigue
  - may no longer be able to regulate

#### Paralyzed patients

- may not be able to learn
- easily get fatigued (Birbaumer, 2006)



## **Our solution**

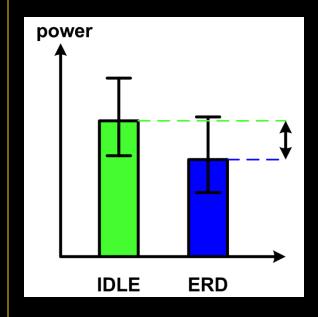
#### Natural BCI associated with movement intention

- No need to learn
- Less mental effort

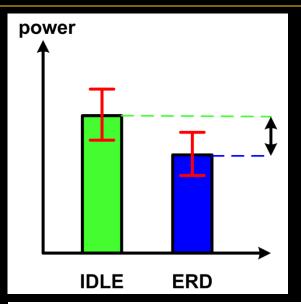
#### Human movement intention with natural behavior

- ERD (Event-Related Desynchronization): power decrease, during movement (widely used in BCI).
- ERS (Event-Related Synchronization): power increase, post-movement (novel augmentative feature).
- ERD/ERS: motor imagery (available).

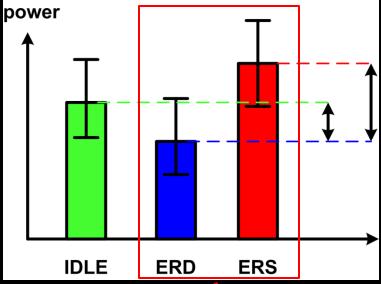




Identify ERD from IDLE Large variance



Dr. Wolpaw's group
Identify ERD from IDLE
Regulate rhythm
Reduce variance



- Increase mean difference
- Natural; no training needed

Our solution, differentiate ERD from ERS



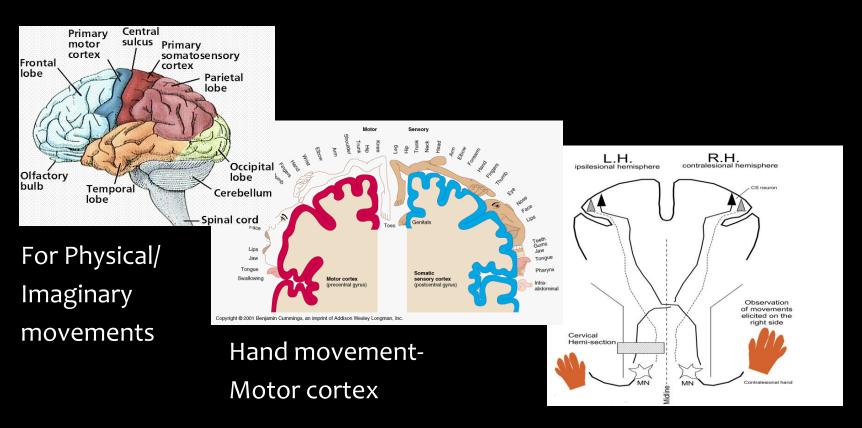
ERD/ERS was tested successful for binary control. (Bai, O., et al., 2008)

New Challenge

Does it support four directional cursor control in 2-D plane?



# Physiological rationale



Contralateral control



#### Right hand:

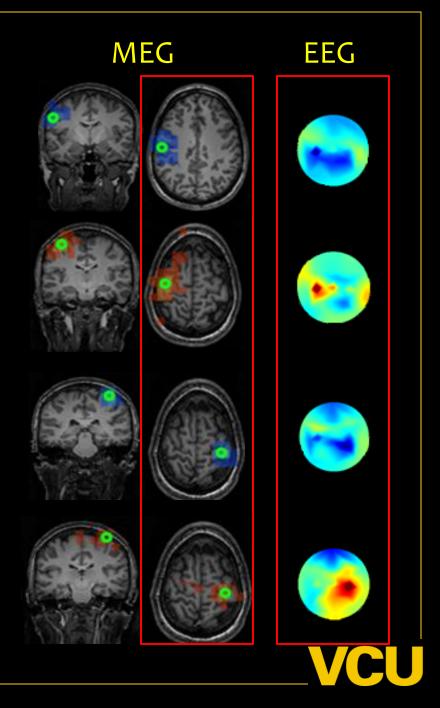
During movement-LERD

• After movement-LERS

#### Left hand:

During movement-RERD

• After movement-RERS



# Rationale for 2D cursor control

Right **ERS** 

LNo
PHY/MI

Base line
RNo
RNo

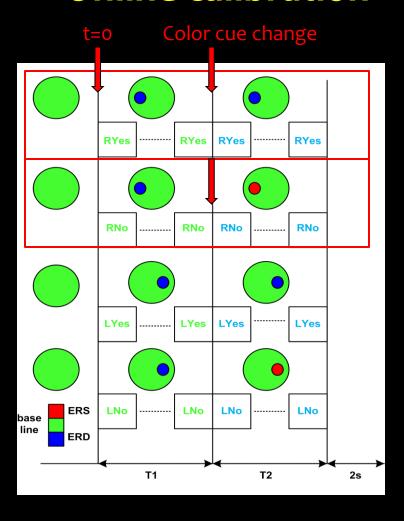
Right **ERD** 

Left **ERD** 

Left **ERS** 

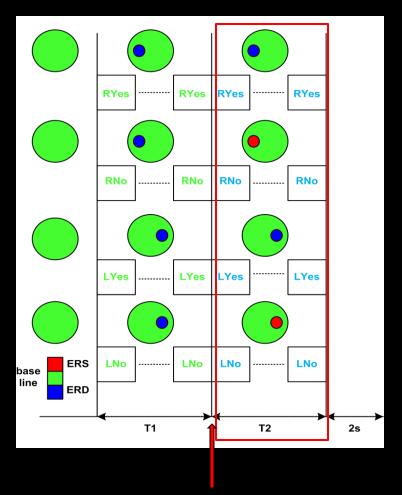


## **Online calibration**





#### **Online calibration**

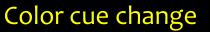


Left **ERD** 

Left ERS

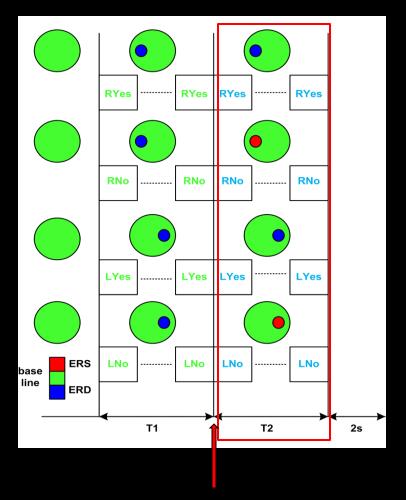
Right **ERD** 

Right **ERS** 





## **Online calibration**



Left **ERD** 



Left ERS



Right **ERD** 



Right ERS



Color cue change



## **Computational Methods for Online Control**

#### Spatial filtering

Surface Laplacian Derivation (SLD)

#### Temporal filtering

Power Spectral Density (PSD) estimation

#### Feature extraction

- Empirical selection: Channel & frequency band restriction
- Bhattacharyya distance

#### Classification

Decision Tree Classifier (DTC)



## **Online 2-D Cursor Control Game**



#### Performance of Natural BCI for 2-D Control

- Physical movement, average performances for S1, S2, S3, S5: 92%, 85%, 81%, 84% (overall: 85.5%±4.65%)
- motor imagery, 73%±5.97% for S1, 59.2%±3.63% for S2

(offline results: 10 fold cross-validation)



### **Summary**

- Users can achieve robust BCI control without long-term training by using natural behavior
- Higher dimensional BCI control is possible to be realized with appropriate signal processing methods
- BCI will provide great opportunities for various patients with neurological disease to improve their quality of life



Thank You!

