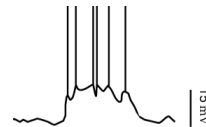
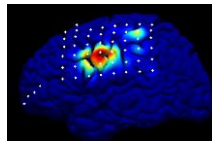
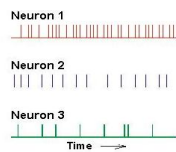


# CSE 599E

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## Lecture 3: Recording/Stimulation Techniques

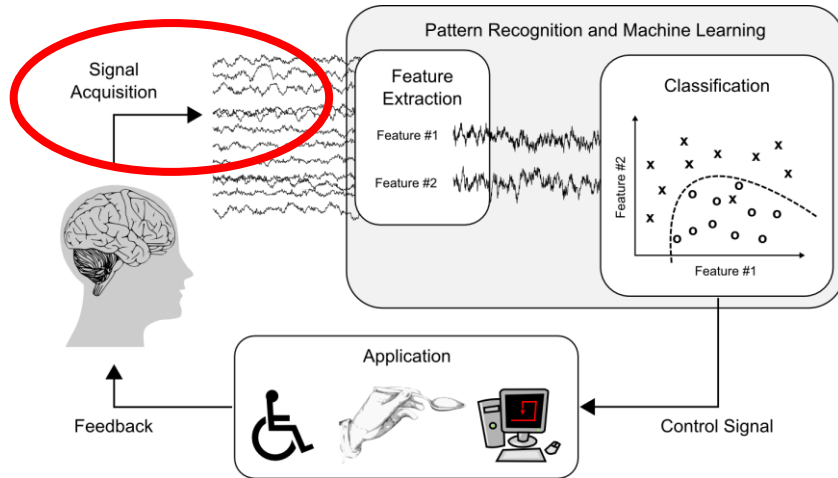


## What's on the menu?

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- ◆ Recording and Stimulation Techniques
  - ⇒ Invasive
  - ⇒ Semi-Invasive
  - ⇒ Non-Invasive

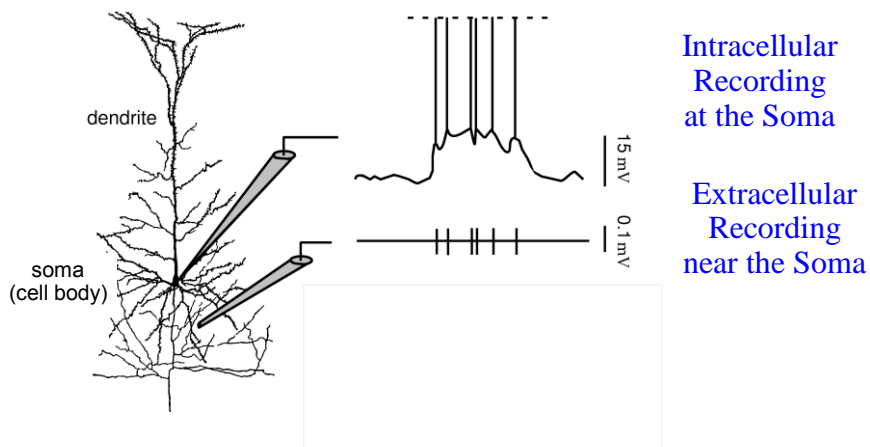
## Components of Brain-Computer Interfacing



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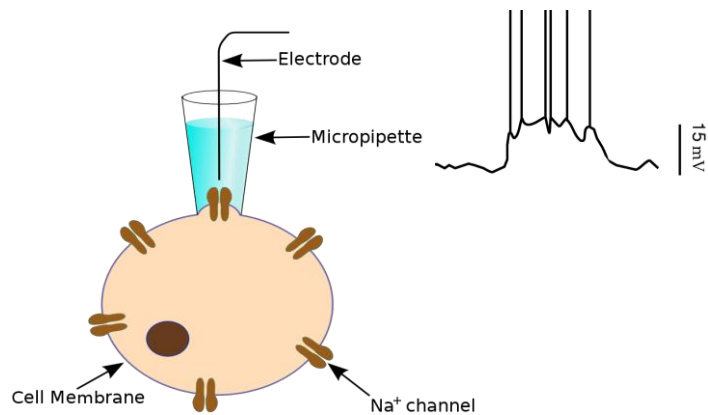
## Invasive Recording



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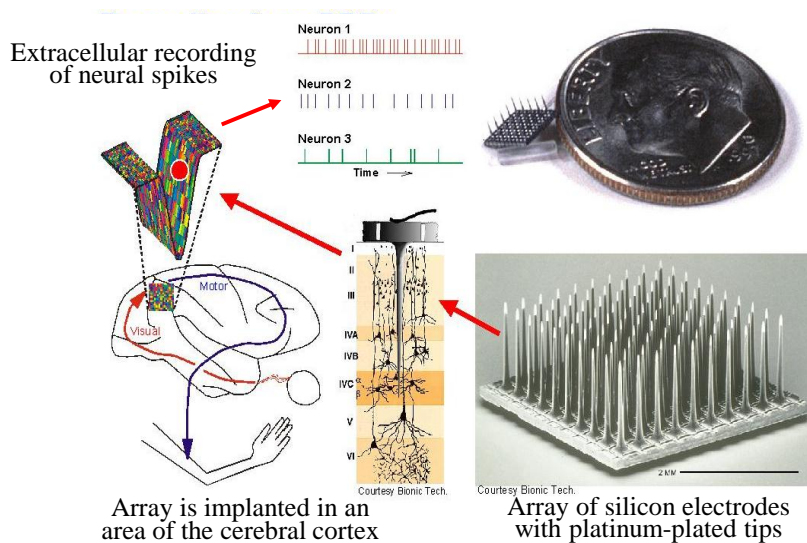
## Intracellular Recording using Patch Clamp



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## Extracellular Recording using Multielectrode Arrays

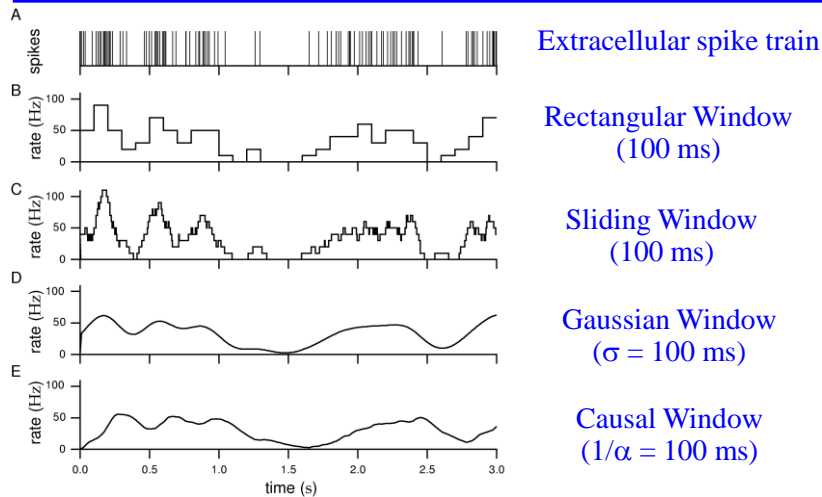


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(Work of Andersen & colleagues, Caltech)

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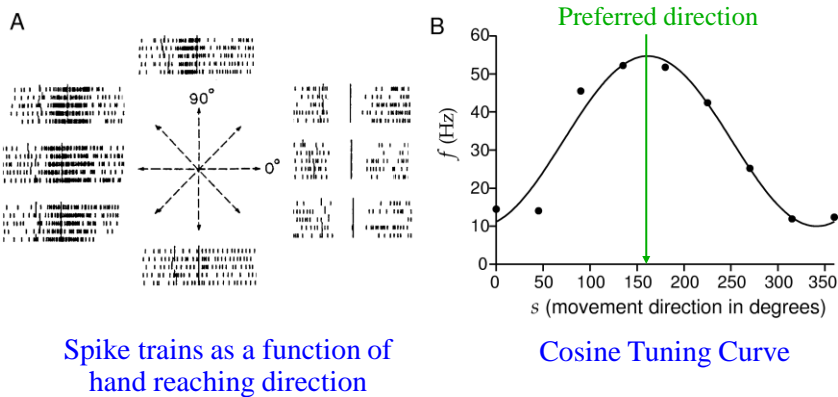
## From Spikes to Firing Rate



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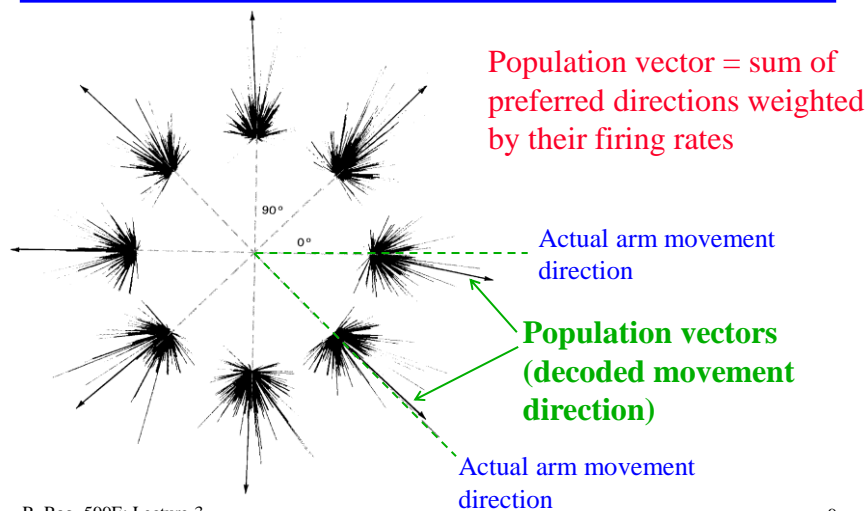
## From Firing Rates to Tuning Curves: Tuning Curve of a Neuron in Primary Motor Cortex (M1)



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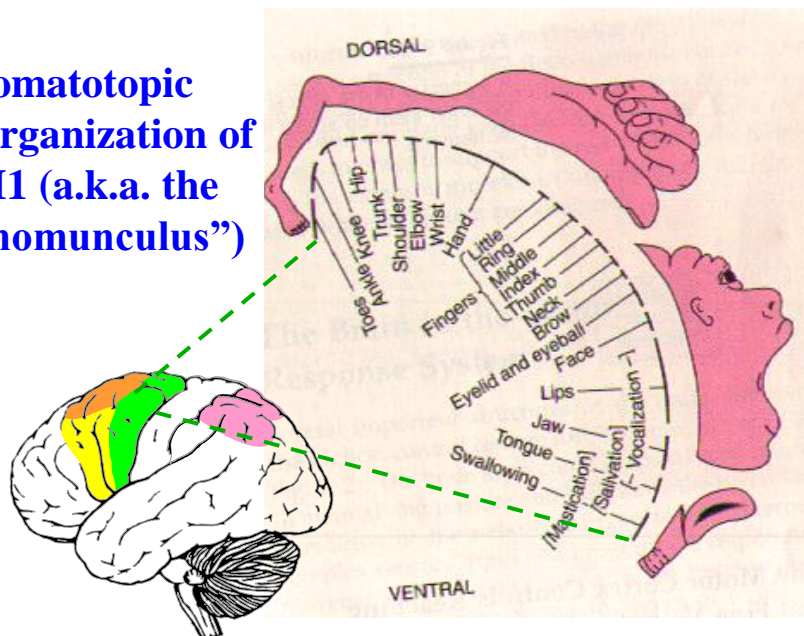
## Movement Direction can be Predicted from a Population of M1 Neurons' Firing Rates



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## Somatotopic Organization of M1 (a.k.a. the "homunculus")



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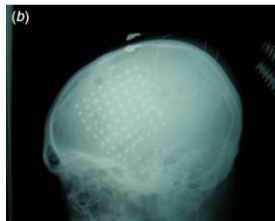
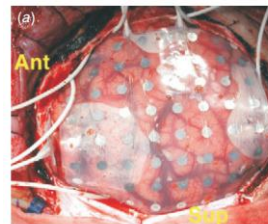
## Semi-Invasive Recording

## Electrocorticography

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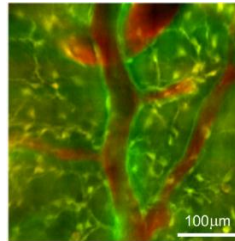
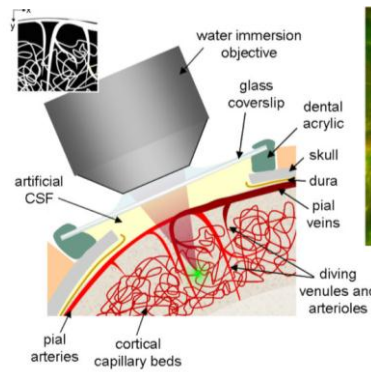


(photo courtesy Seattle Times)

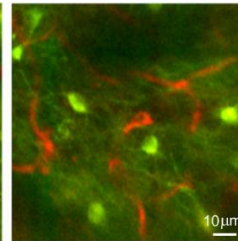


## Optical Imaging

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Oregon Green calcium sensitive dye stained neurons



Transgenic mouse expressing green fluorescent protein (GFP) in a subpopulation of neurons

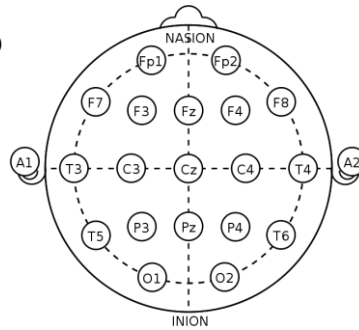
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## Non-Invasive Recording

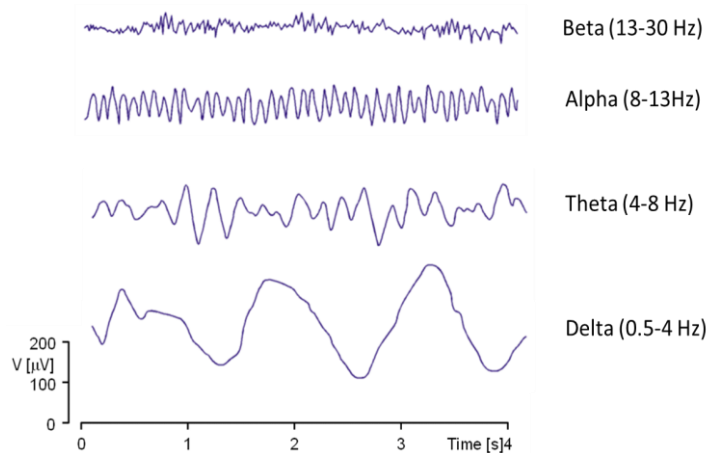
## Electroencephalography (EEG)

Measures electrical fluctuations caused by post-synaptic potentials from thousands of neurons oriented radially to scalp

- Tens of microvolts range
- Poor spatial resolution ( $\text{cm}^2$ )
- Good temporal resolution (ms)



## Example of EEG Oscillatory Potentials

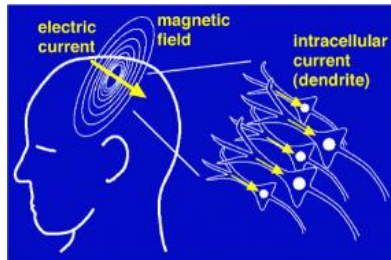




## Magnetoencephalography (MEG)

Measures magnetic fields produced by activity of thousands of cortical neurons oriented perpendicular to the cortical surface

- Magnetic fields not distorted by skull and scalp
- Better spatial resolution than EEG
- Expensive and bulky



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## Functional Magnetic Resonance Imaging (fMRI)

- ◆ Measures changes in blood flow due to increased activation of neurons in an area
- ◆ Relies on paramagnetic properties of oxygenated and deoxygenated hemoglobin in the blood
- ◆ Produces images showing blood-oxygenation-level-dependent signal changes (BOLD)

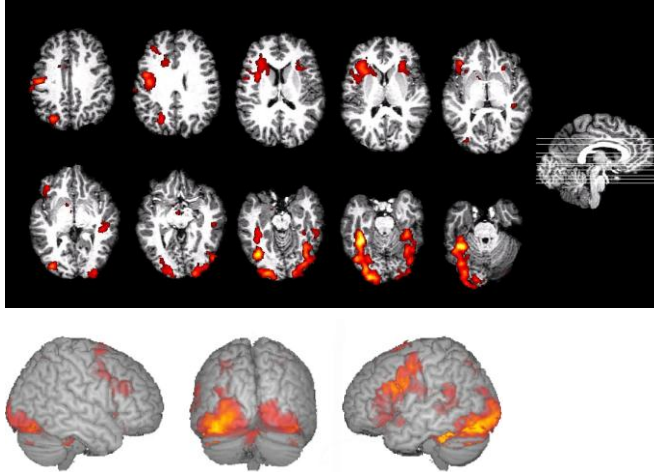


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## Example fMRI Images (word reading task)

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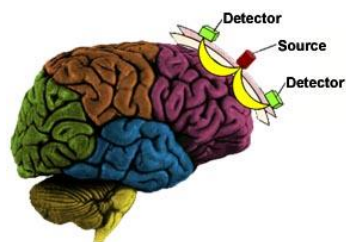
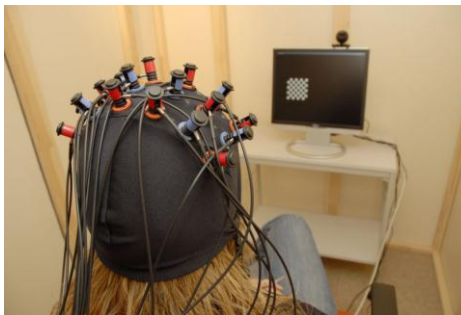
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<http://www.med.nyu.edu/thesenlab/group/fmri.html>

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## Functional Near-Infrared Spectroscopy (fNIR)

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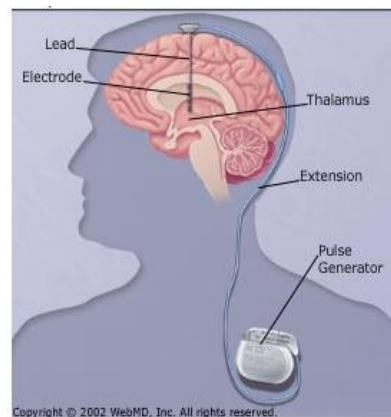
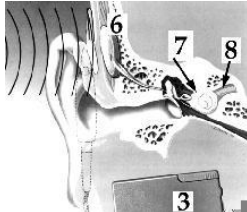
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## Stimulation

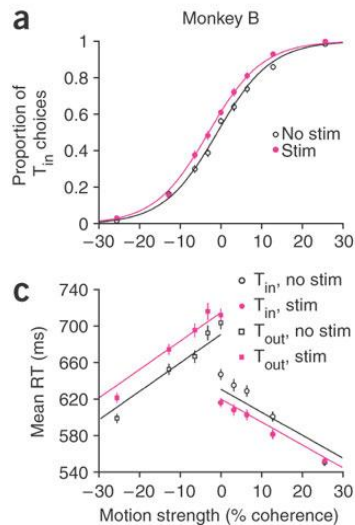
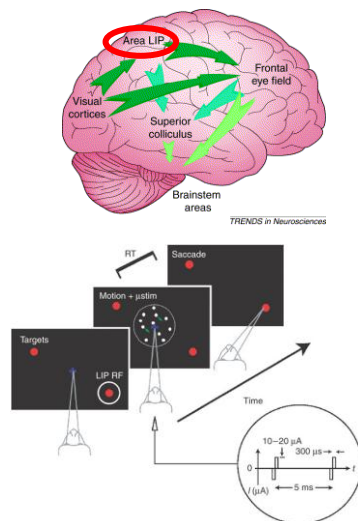
## Extracellular Microelectrodes

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- ◆ Examples: Cochlear implant, DBS



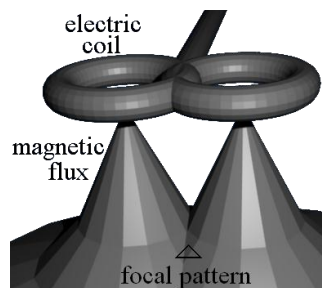
## Microstimulation can alter decision making



(Hanks et al., 2006)

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## Transcranial Magnetic Stimulation (TMS)



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Next Class:  
Signal Processing and  
Machine Learning for BCI