

MSc in Artificial Intelligence and Robotics

MSc in Control Engineering

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Neuroengineering

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4- ELECTRICAL CORRELATES OF THE BRAIN ACTIVITY

Learning objectives of the lesson

1. Describe the different scales at which electrical correlates of the brain activity are produced and can be measured
2. Compare intra- and extra-cellular single neuron recordings
3. Illustrate the origin of the electrical correlates of the collective activity of groups of neurons
4. List the different acquisition methods
5. For each of them, describe their origin, their spatial resolution, and which neuronal groups are involved
6. Explain the generation of the EEG signal at the neuronal and tissutal level
7. List the advantages and the main issues of scalp EEG measures

they are the non invasive technique that we study in this lesson

Brain Electrical Measures

spatial resolution is achieved by means of invasiveness, so we can achieve very high spatial resolution only with more invasive methods, that are those that imply going into the brain tissue. So for the single cell measure we can touch or go into the membrane of single cell is the maximum invasive method

Spatial Resolution

when we move into this list the spatial resolution decreases, so we move from cm to mm

- IP: Intracellular Potentials
- EP: Extracellular Potentials
- LFP: Local field potentials
- S-EEG: Stereo-electroencephalography
- ECoG: Elettrocorticography
- EEG: Electroencephalography

Non-invasiveness

into the cell

out of the head

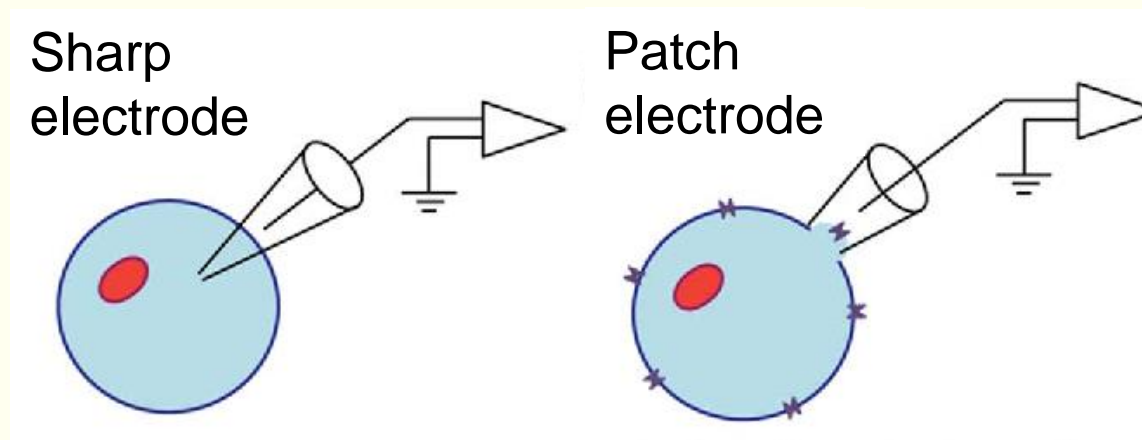
first method

Single-cell Recordings

In both extra and intra cellular we record brain activity but in this case we are actually recording the neural activity. What we have at the end of this procedure is the behaviour of the neurons. In particular what we measure with intracellular recordings is the membrane potential. To make this measure we need to have an electrode inside or at least in electrical contact with intracellular fluid and a reference electrode in the extracellular fluid or just outside the cell

Intracellular recordings

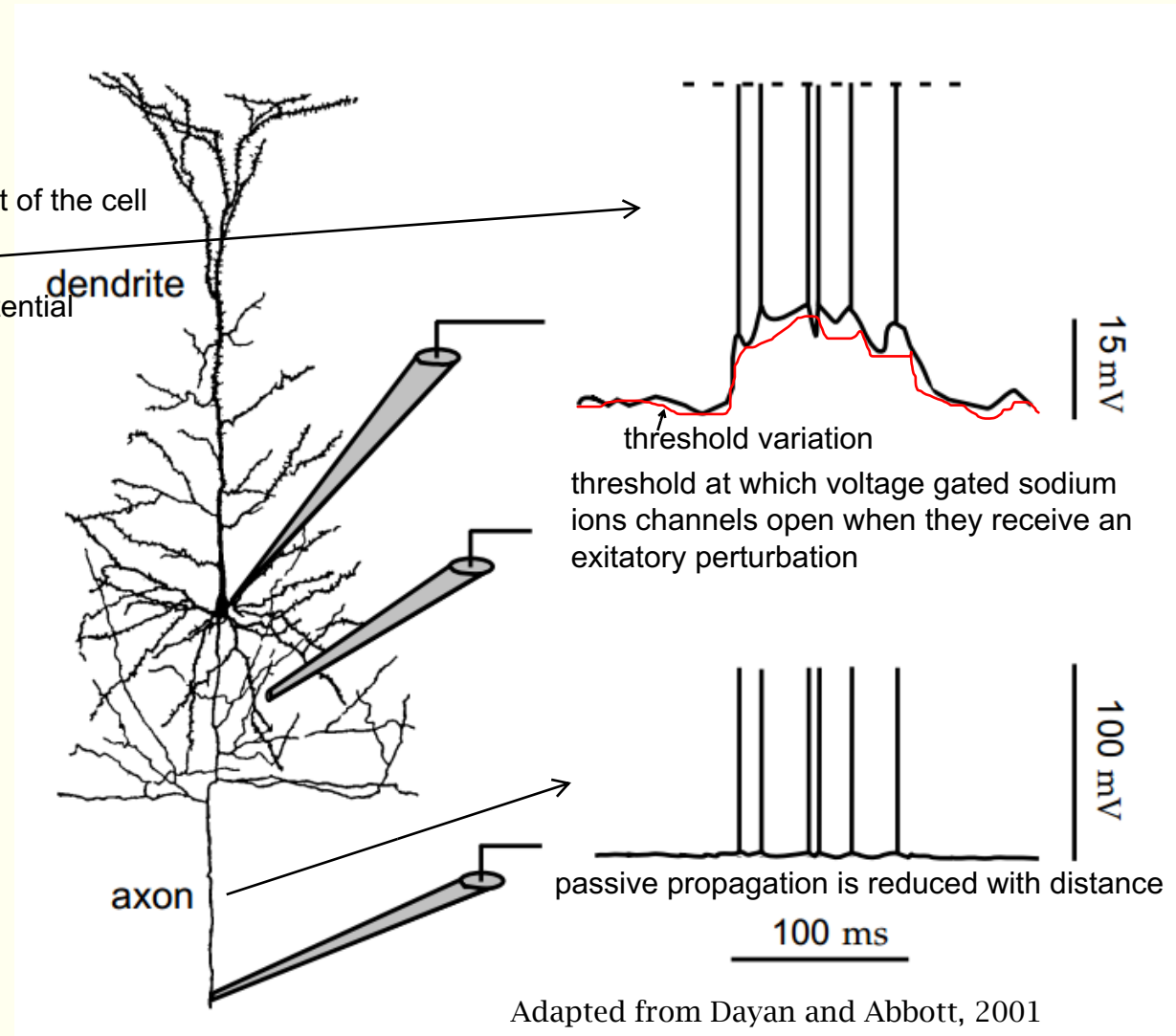
- **Hollow glass electrodes** filled with a conducting electrolyte
- A **reference electrode** placed in the extracellular medium
- Intracellular recordings can be made with:
 - sharp electrodes ^{it reach the intracellular fluid} inserted through the membrane into the cell
 - patch electrodes sealed to the surface of the membrane providing electrical contact with the interior of the cell



Adapted from Unal et al, Nanobiomedicine, 2014

Intracellular recordings - 2

- More complex than the extracellular recordings
- Usually performed in the **soma**,
if we measure the potential in the dendrites we can actually measure the postsynaptic potential
it's more easy because is a bigger part of the cell
sometimes in the **dendrites**,
very seldom along the **axon**
- They record **the actual membrane potential** (graduate and action potentials)
- Usually performed in **in vitro** experiments

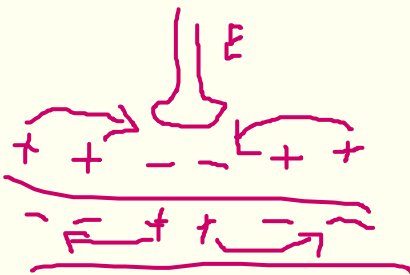


we put the electrode close to the cell membrane but outside of this

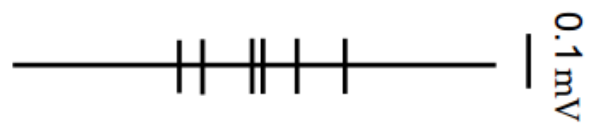
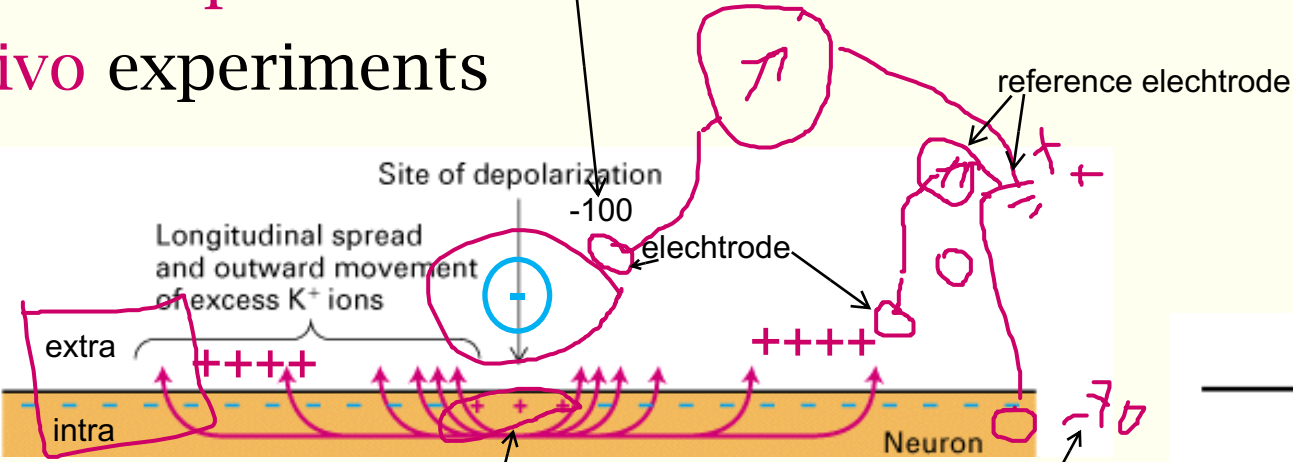
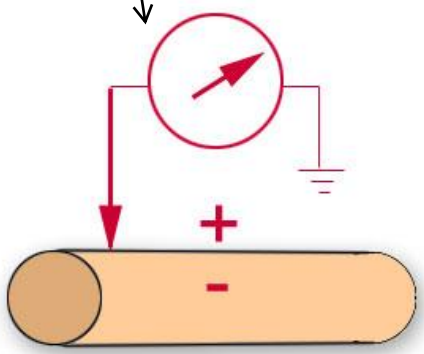
we measure the difference not between the intracellular and the extracellular fluid but between the extracellular fluid close to the membrane and the extracellular fluid far from the membrane

Extracellular recordings

- Electrodes are placed **near** the membrane, but do not penetrate it
- They detect (don't measure!) the **action potentials** fired by a neuron, but not its **subthreshold membrane potentials**
- They measure the exact moment in which an action potential occurs, **not its shape or amplitude**
- Reduced amplitude (0.1 mV instead of 100 mV)
- Take the form of **spike trains**
- Used in **in vivo** experiments



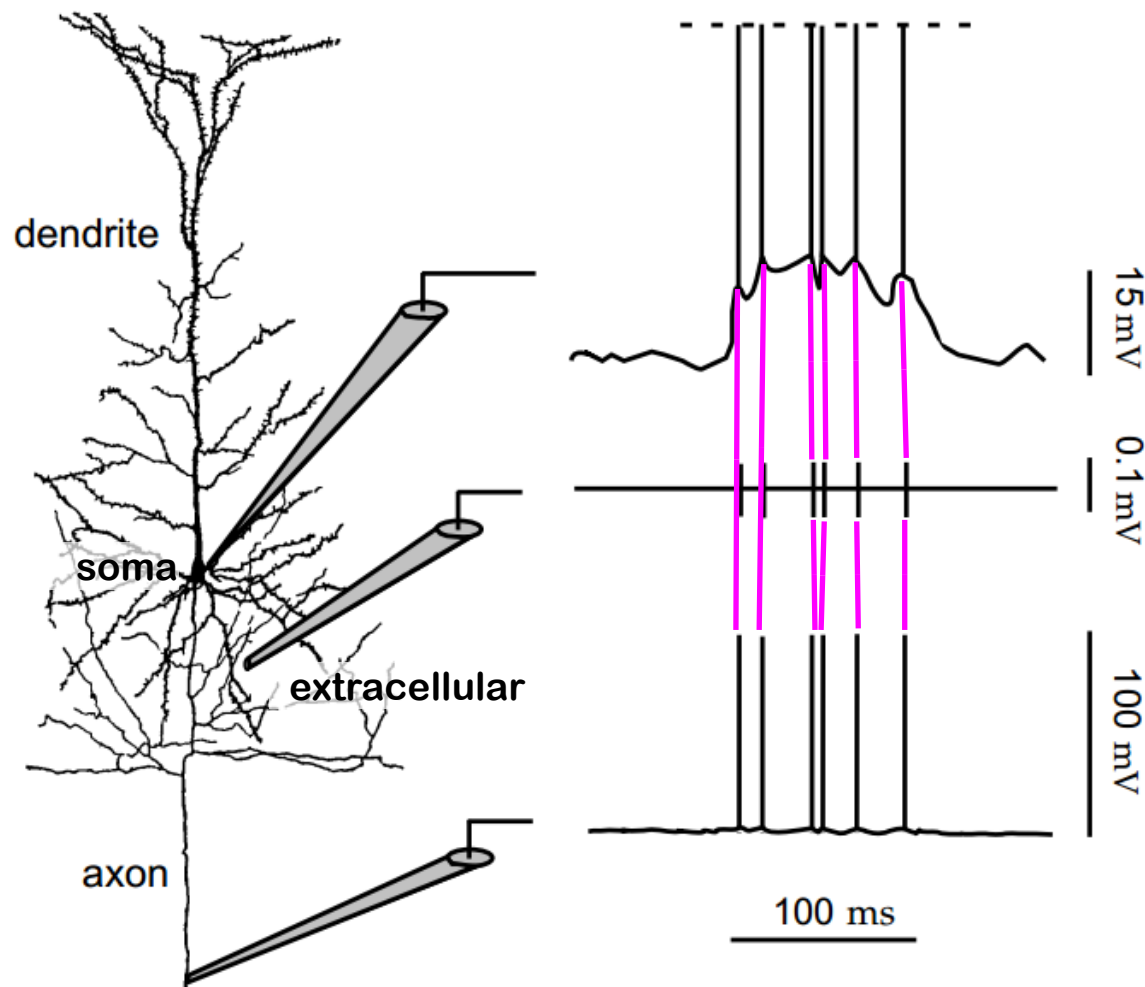
this is not the resting potential but the difference between the peak of the action potential and zero



Adapted from Dayan and Abbott, 2001

Comparison between intracellular and extracellular recordings

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RED:intracellular
BLUE:extracellular

we are interesting on its peaks and in with what frequency it appears

Subthreshold + action potentials

Signal temporally correlated with the action potentials

Action potentials (in the axon)

Adapted from Dayan and Abbott, 2001



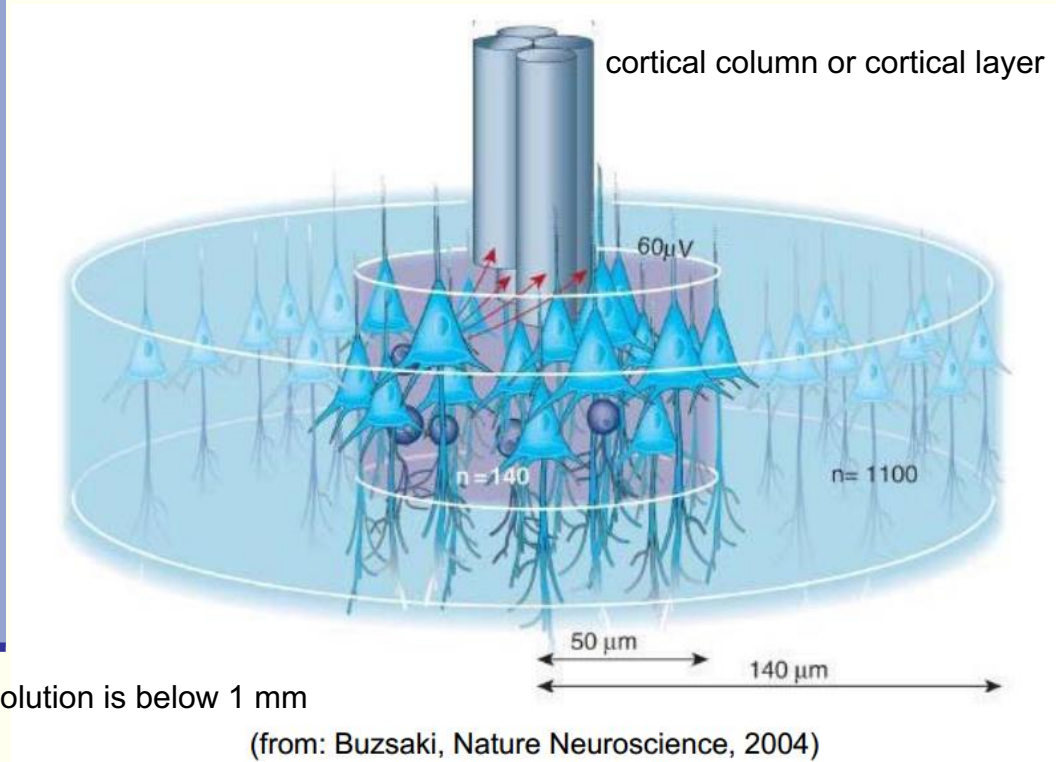
Recordings from Neural Populations

studying the single neuron is not useful for any purpose, we need to study a group of neurons

Local Field Potentials (LFP)

→ they are measures of the electrical activity especially of the cortex because it is more easily accessible

if we put an electrode close to a group of neurons, we are able to measure the sum activity of the correlated signal which is produced by the activity of the single neuron



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spatial resolution is below 1 mm

(from: Buzsaki, Nature Neuroscience, 2004)

- Extracellular current flow resulting from the linear summation of PSP of neuronal groups → post synaptic potential
- Electrodes put inside the cortex
- Frequency range: 0-100 Hz
- Spatial resolution: 10^{-3} to 1 mm³

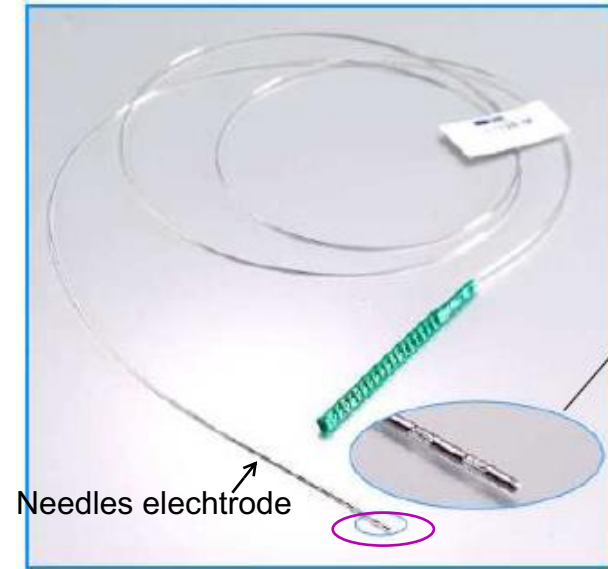
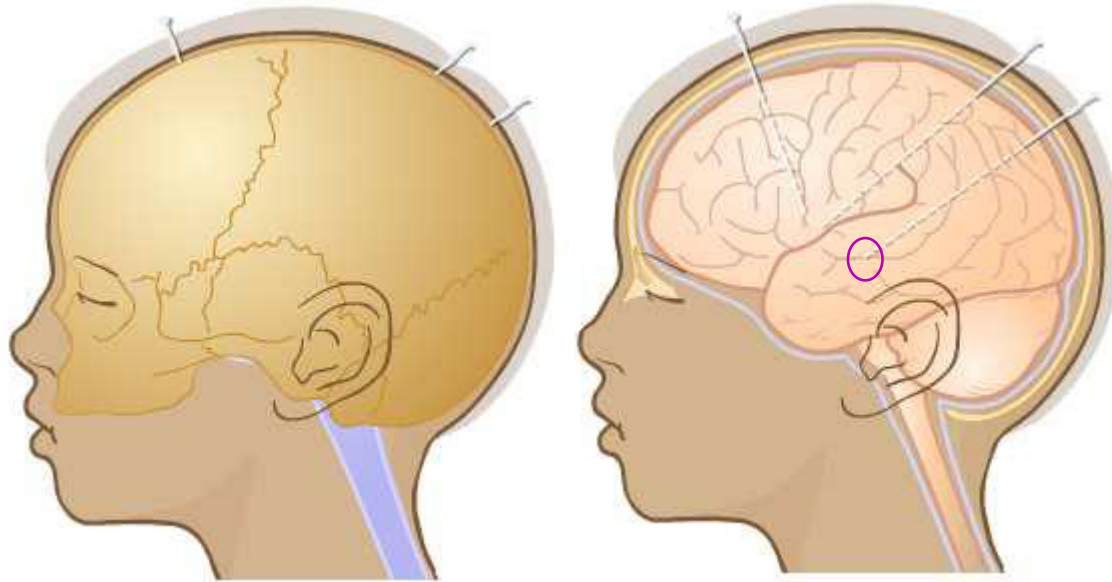
EEG in a nutshell

only synchronous activity of large number of neurons produce signal that is strong enough to be detected at distance sources. What we measure is a signal which is produced by the sources and propagated through the tissues of the brain and the head. This propagation is based on ion currents.

- Originates from **synchronous postsynaptic cortical currents** (sources) of millions/ 1 billion neurons
- **Volume conduction**: tissues contain salt water, so **ion currents** can spread → effects of the electrical activity of excitable cells at a large distance (cm)
- Electric fields produced by local currents spread **instantaneously** (at the light speed) and **sum up linearly**
- **Amplitude** on the scalp = μV (very feeble, membrane potentials = mV)
in millions of cells (for μV)
in a single cell (for mV)
- **Temporal resolution** = **milliseconds** (very high)

Stereo-Electroencephalography (S-EEG)

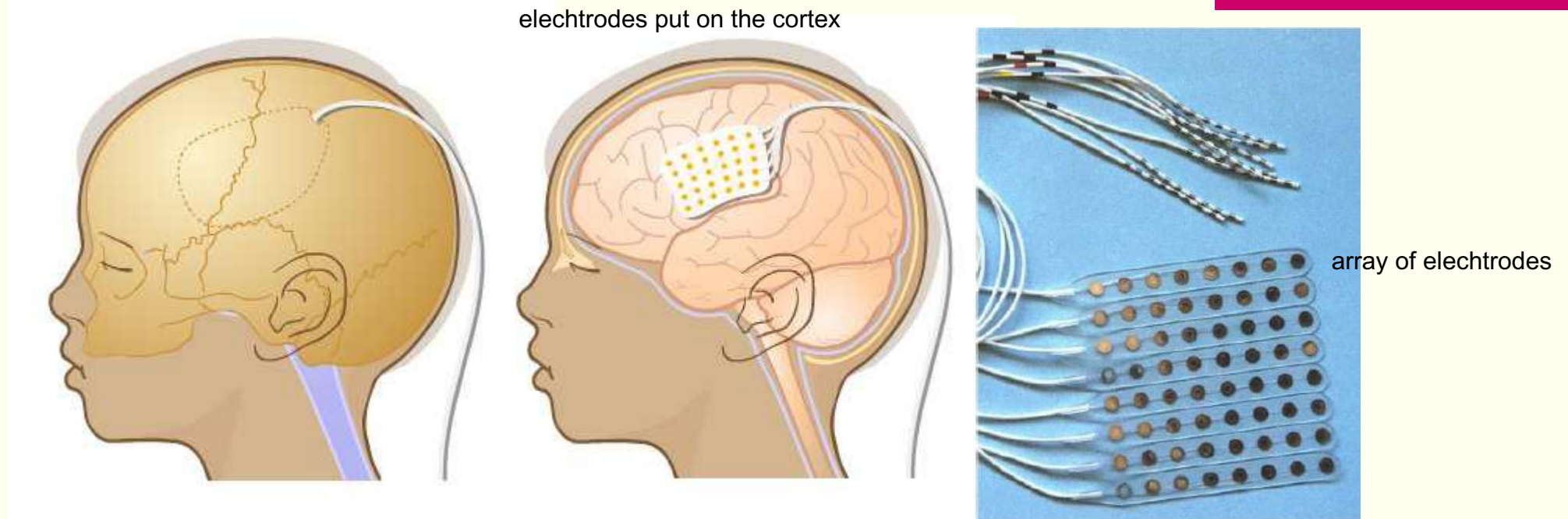
very invasive method.
With this method we
access to the subcortical
region



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- Spatial resolution: 1-4 mm³
- Electrodes deeply implanted in the brain
- Can measure the activity in subcortical regions
- Used in epileptic patients when the epileptogenic zones are located in depth

Electrocorticography (ECoG)



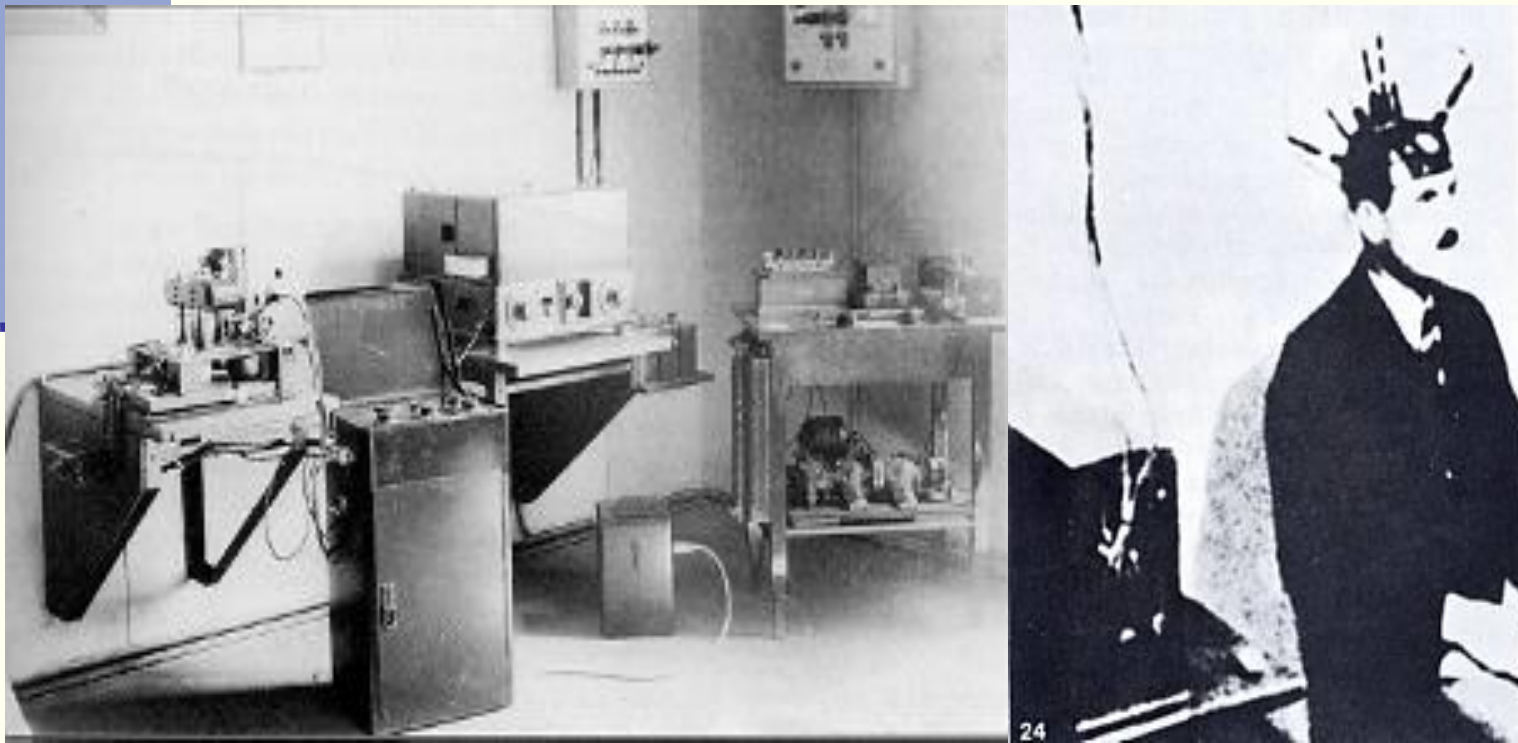
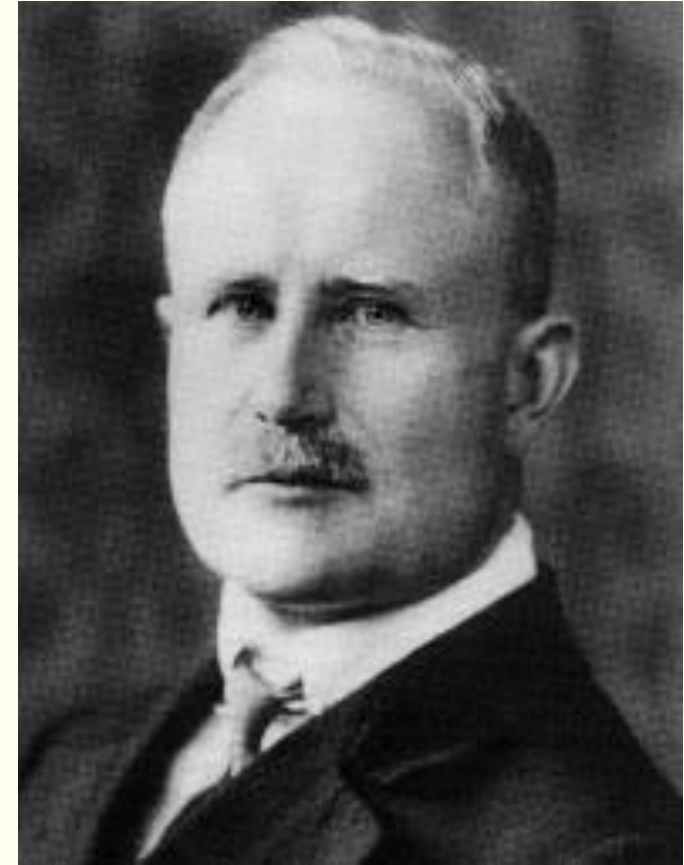
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- Spatial resolution: 1-20 mm³
- Synaptic activity in macrocolumns
- Electrodes arrays put above the pia mater (below the dura, intracranial)
- Mainly produced by cortical neurons
- Volume conduction (distance + shape + conductivity of the tissues)

Scalp EEG

this is the only non invasive technique that we see today

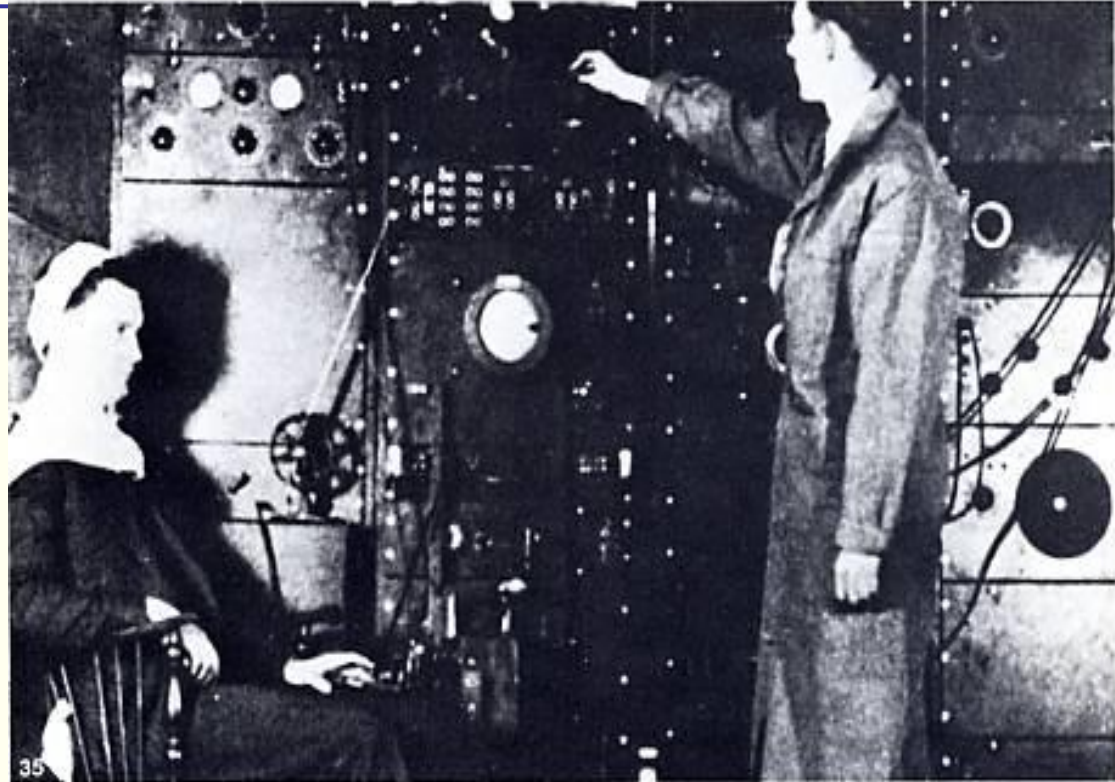
- 1929: Hans Berger, a German psychiatrist, obtained the first measure of the electrical activity on the human scalp
- He detected the alpha rhythm



Harvard Medical School, 1934

amplifier of the single channel EEG system

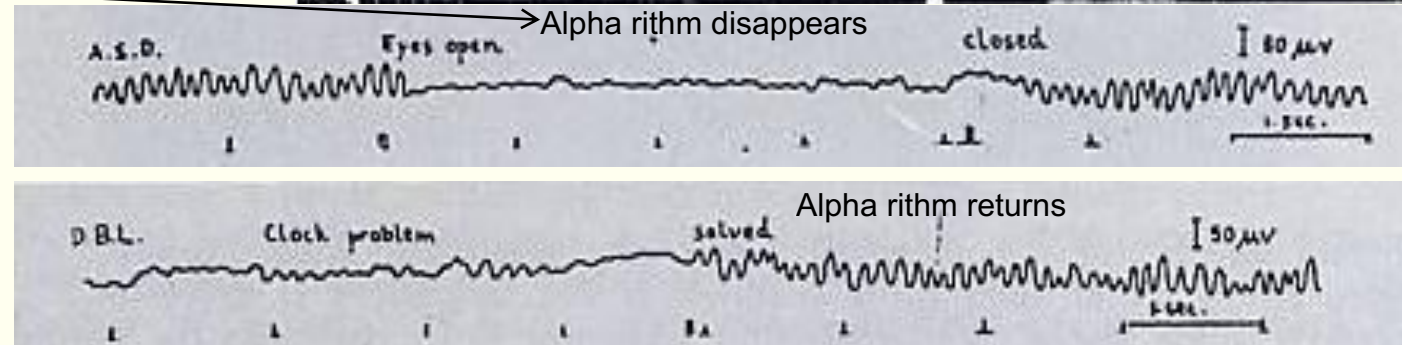
- Single EEG channel
- Davis Lab at Harvard
- Hypodermic needle as electrode, head tissue band soaked with saline solution as electrical reference



neurons which works asynchronously. When visual cortex is engaged, neurons are asynchronous, when it not works they are synchronous. This depends on the thalamus

Open and closed eyes

Mental computation



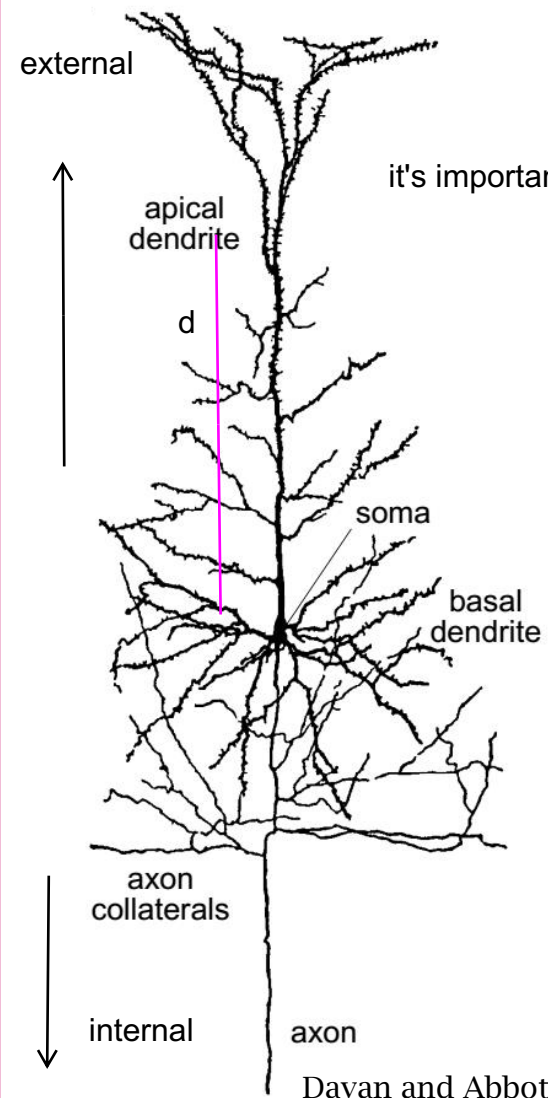
Generation of the EEG signal

we start from the cortex because it has some specific properties that make it the most important source of the electroencephalographical activity
in this way we can collect also signals to long distance from their sources

18 Cortical pyramidal neurons

→ reason why we are able to measure the electroencephalographic signal

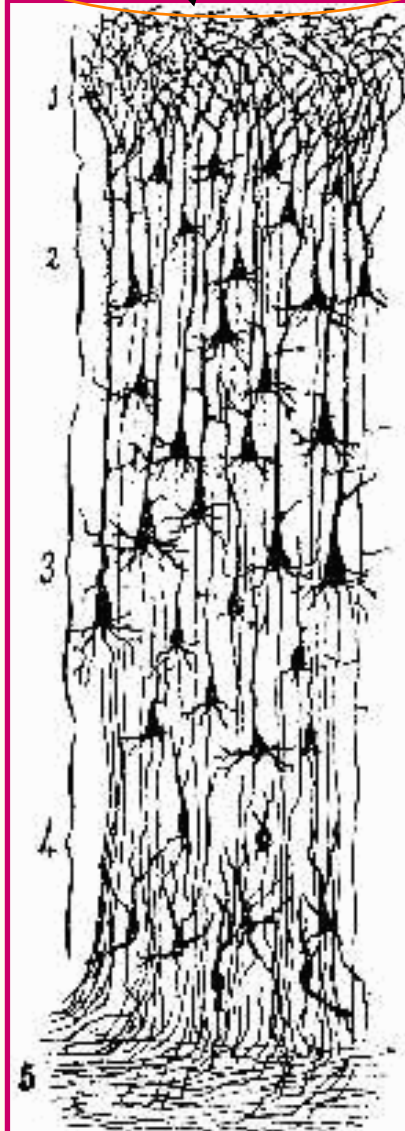
all parallel to the other



it's important the shape of the whole cell that is longitudinal

- Pyramidal soma
- Longitudinal shape
- Have apical and basal dendrites
- The apical dendrites are projected toward the cortical surface

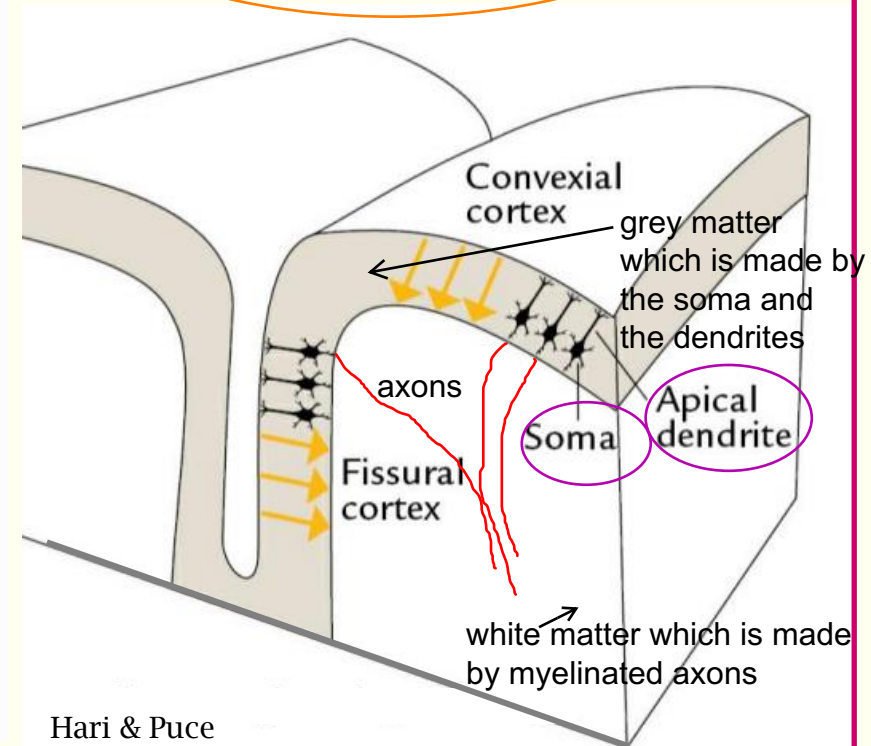
Neuroengineering - Astolfi



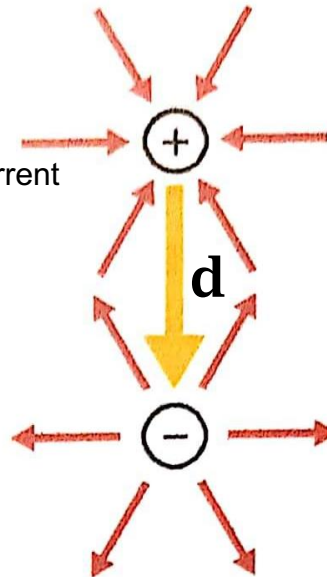
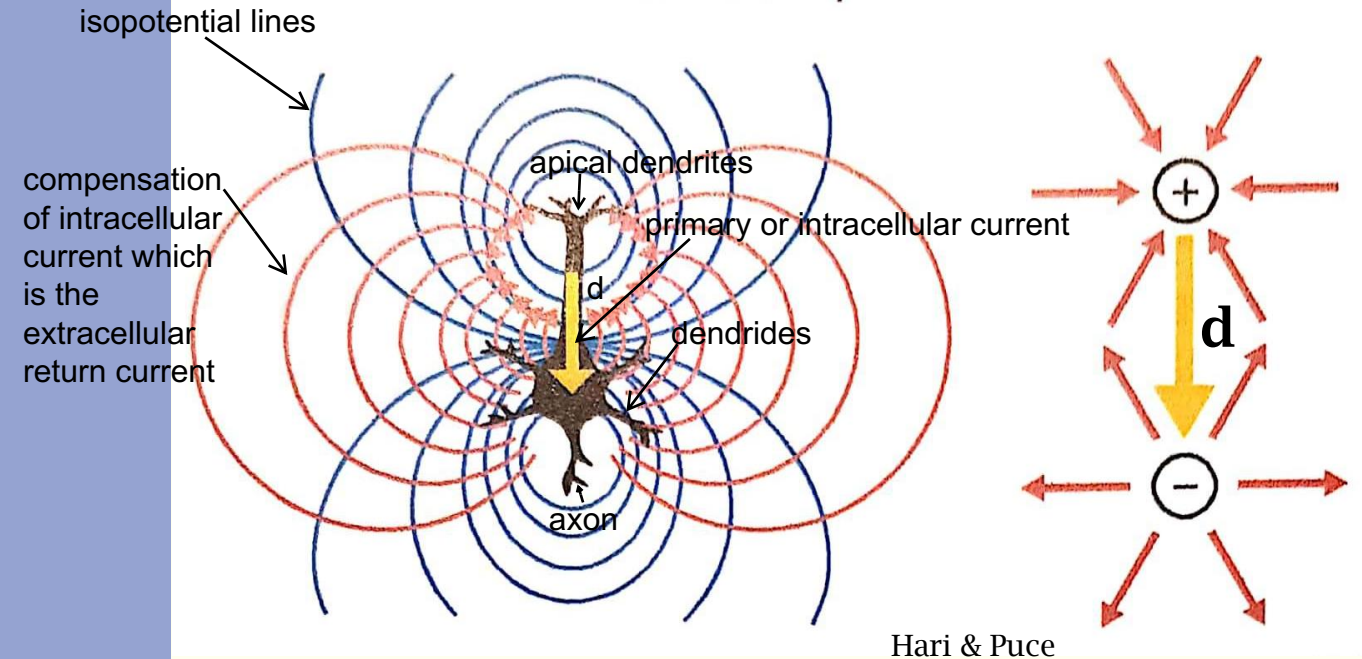
are organized in palisades

- Form palisades
- Oriented normally to the cortical surface

perpendicular



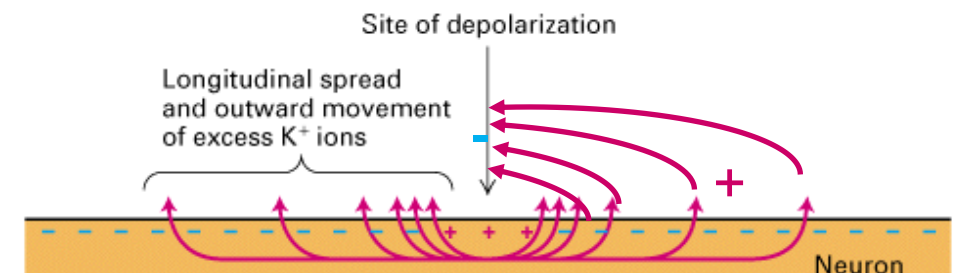
Current dipole



- A point source $+I$ and a point sink $-I$, separated by a distance d
 everytime we go from source to sink
- any source-sink region where the total source and sink currents are equal (local current conservation) will generate a predominantly dipole potential detectable even at a large distance (scalp)

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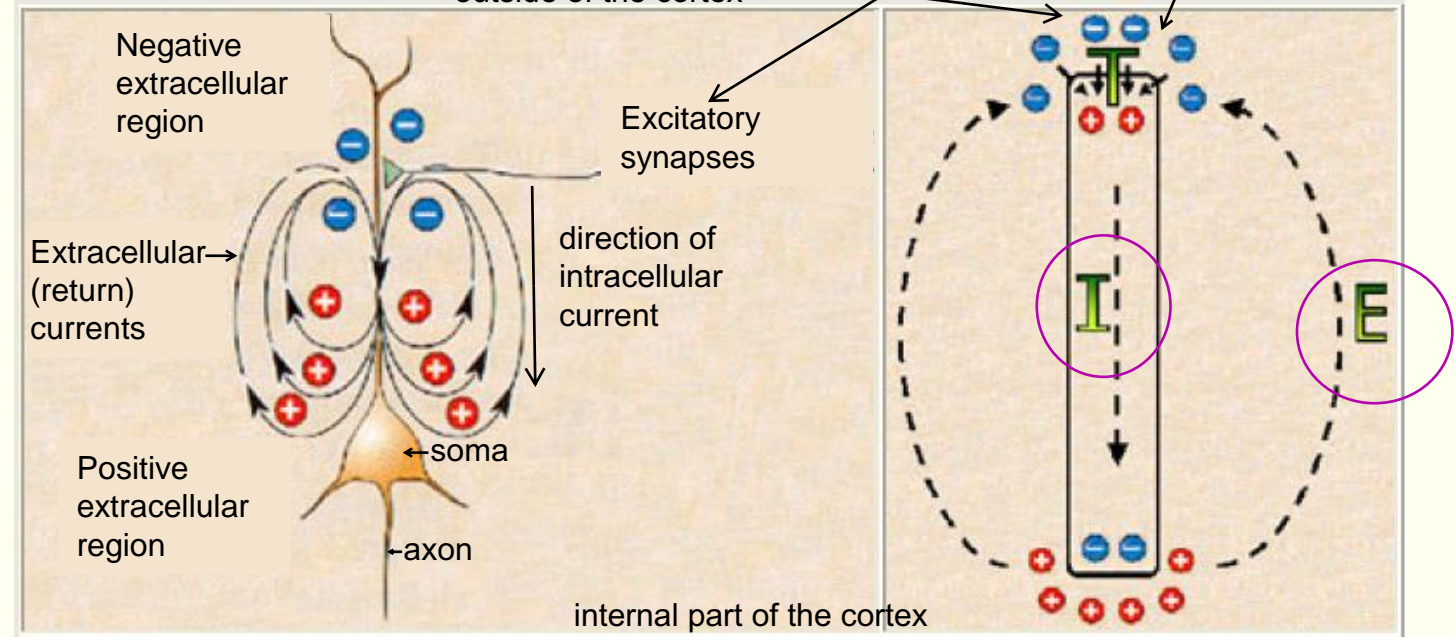
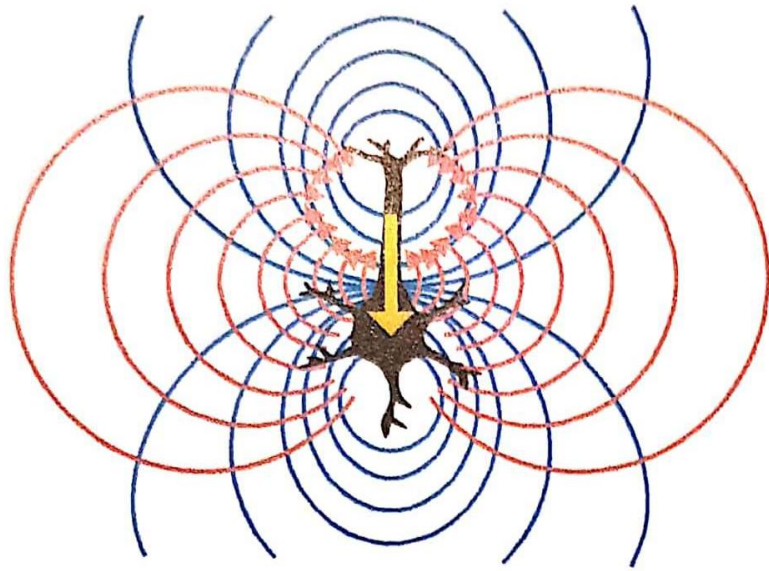
- Yellow: **intracellular current**
- Blue: **isopotential lines**
- Red: **return currents**
- Isopotential and return currents line are perpendicular to each other



imagine we have a synapse between this neuron and another, so this neuron is the postsynaptic neuron. We focus on the dendrite. We imagine that this is an excitatory synapse that produce depolarization

Dipolar nature of pyramidal cells PSPs

first factor



with inhibitory synapses the mechanism is the same but the current has opposite direction so also the charges are opposite

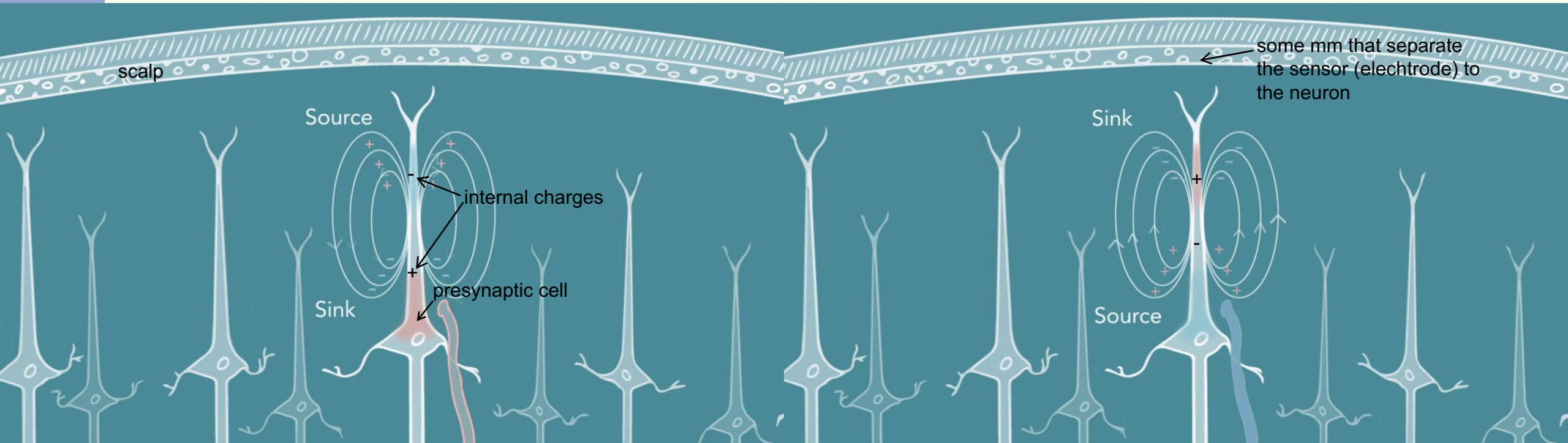
- Apical and basal dendrites act as point **source** and **sink**
- Extracellular charges and currents are reversed with respect to intracellular ones

Dipole direction – EPSPs and IPSPs

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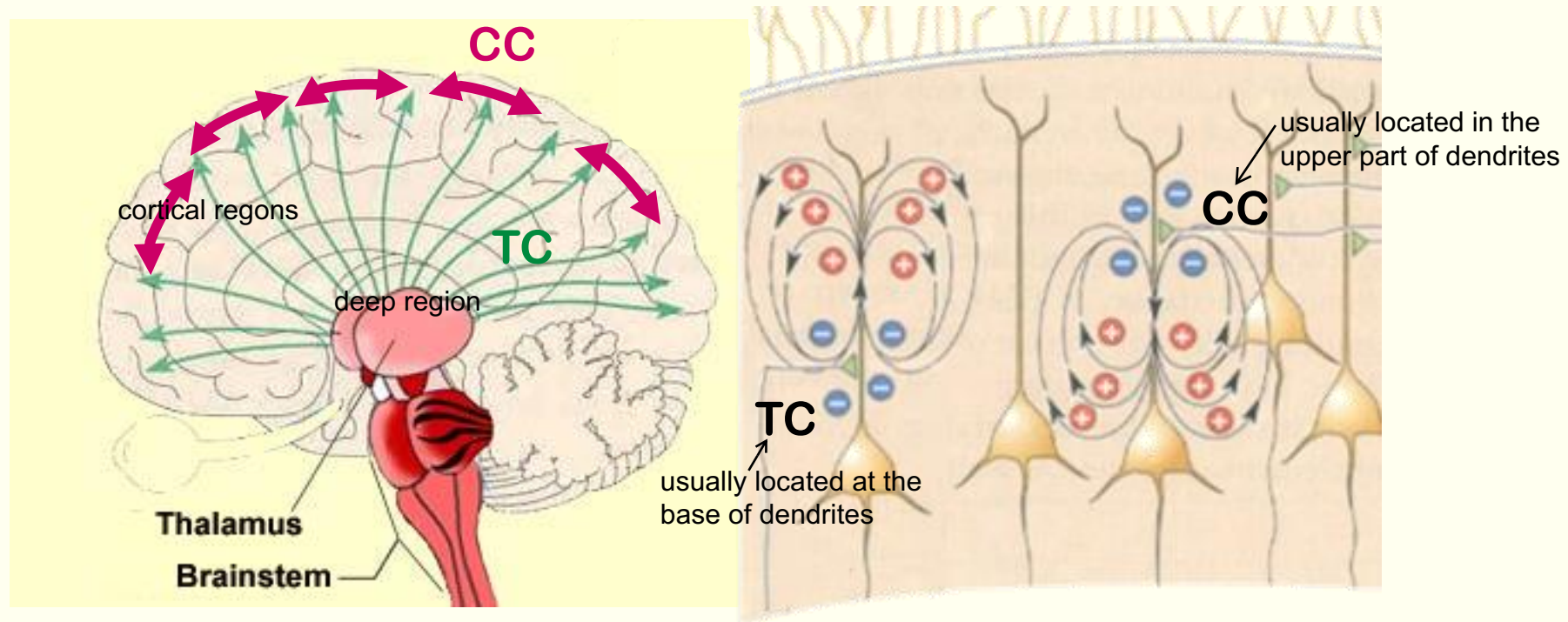
EXCITATORY

INHIBITORY



<https://www.youtube.com/watch?v=rzgDOaGjjOs>

Dipole direction - ^{second factor} Position of the synapse

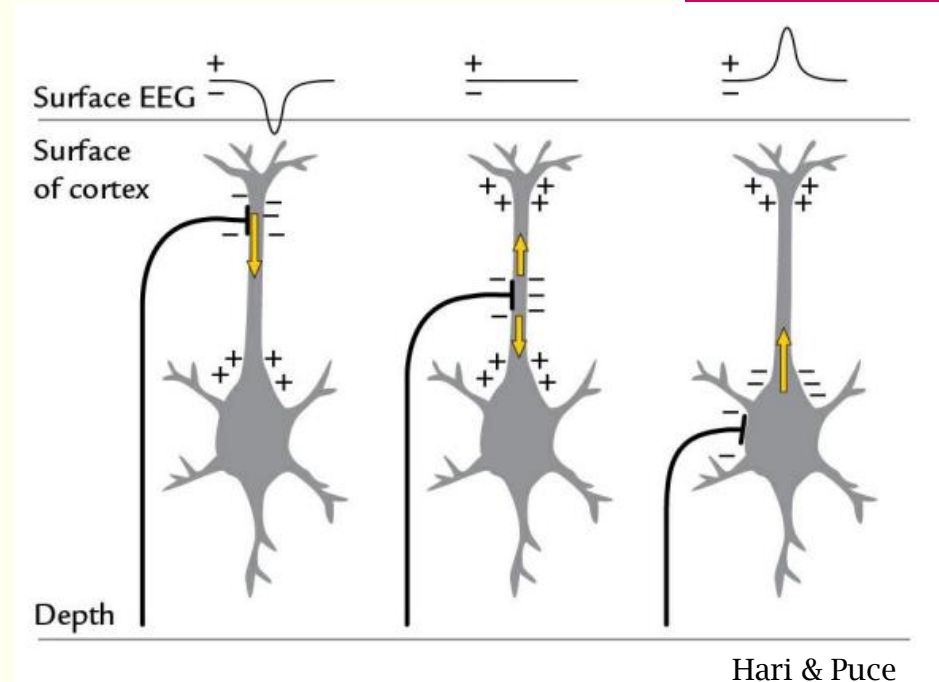


- Cortico-cortical (CC) synapses usually on the apical dendrites
 - Talamo-cortical (TC) synapses usually on the basal dendrites
- 2 different positions

Dipole direction - Summary

equals 2 by 2
↓

	CC	TC
E		
I		



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The dipole direction depends on:

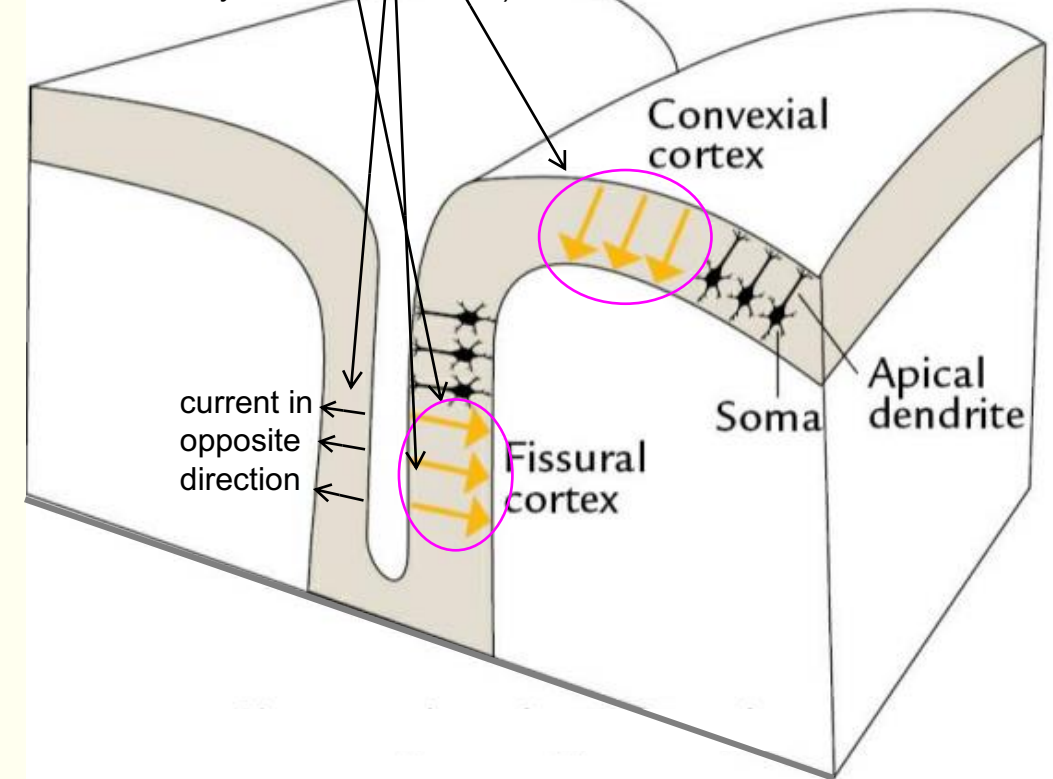
- The synapse nature (EPSP of IPSP)
- The synapse position:
 - apical **cortico-cortical** (CC)
 - basal **thalamo-cortical** (TC) synapses

Orientation of the pyramidal dipoles

first factor

- Pyramidal neurons are perpendicular to the cortical surface
MEG is more able to detect neurons in the fissural cortex but it is much more expensive
- **Gyri** are more efficient generators of EEG than **sulci** (both because of the favorable orientation of the isopotential lines with respect to the scalp and because the dipole layers in opposing sulci cortices tend to cancel each other)
- **Palisade** dipole sources line up in parallel, creating large **dipole layers**

neurons which are in the gyrus produce much more EEG signal with respect to those in the fissural for 2 reasons: because they are oriented normally so they produce changes in the cortical potential and because in the fissural cortex we have 2 layers of dipoles (currents are in opposite directions so they reduce each other)



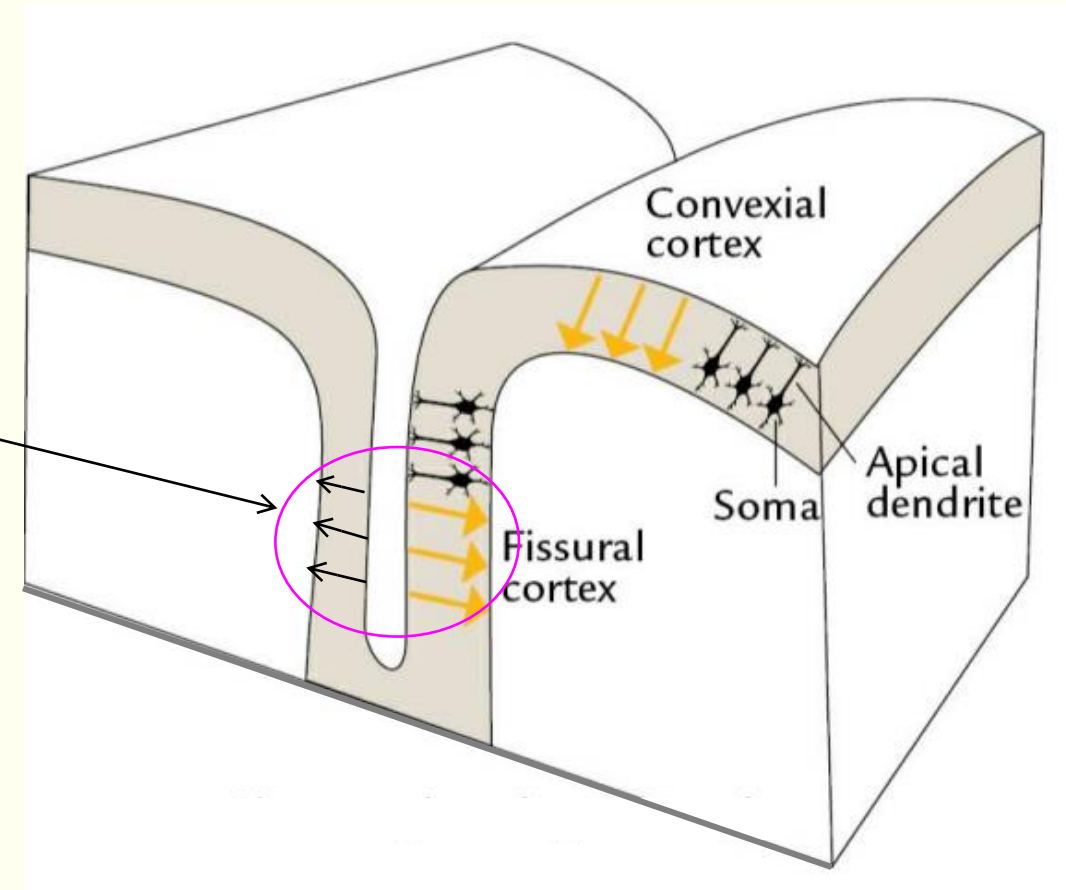
EEG signal generation – ^{second factor} effect of timing

- Electroencephalography measures the ^{the most} synchronous electrical activity of neural populations
- The amplitude of the signal is:
 - linearly proportional to the amount of synchronous neurons
 - proportional to the square root of the amount of asynchronous neurons, because of intracortical cancellation
- e.g.:
 - $N=10^{10}$ asynchronous dipoles → Signal = 10^5
 - $N=10^8$ (1% of the previous) synchronous dipoles → Signal = 10^8

we reduce the amount of neurons of a factor of 1%

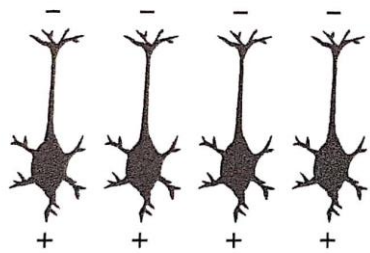
EEG signal generation – effect of orientation

- Sulci and fissures produce little or no EEG signal
 - orientation of the dipole is different
Orientation not favorable to the scalp surface
 - Mutual cancellation of opposite cortices
- **Gyri** produce most of the EEG signal
 - Favorable orientation
 - Summation due to the palisade disposition

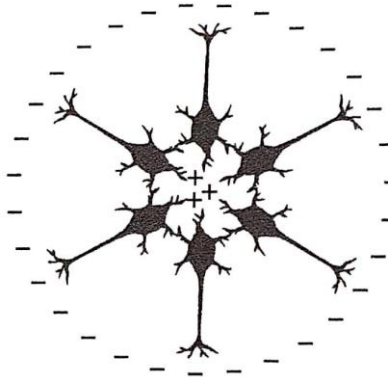


Open and closed field

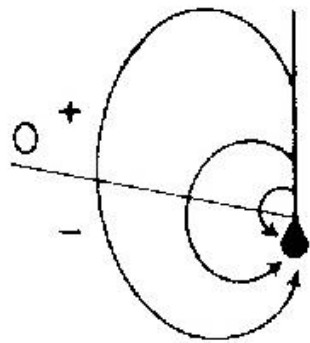
Pyramidal neurons



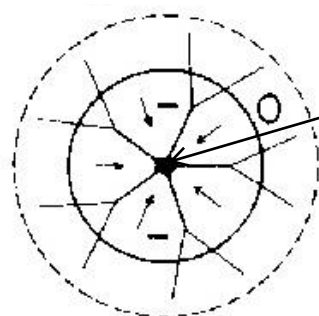
Stellate neurons



if we measure on the surface with an electrode the average is zero because the opposite directions of the current, so we need to put the electrode here



Open field



Closed field

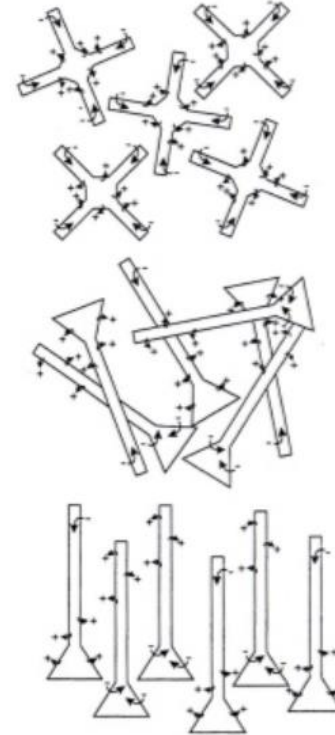
not able to measuring

Closed field (cancellation before it reaches the electrodes):

→ Radially simmetric neurons

Randomly oriented neurons

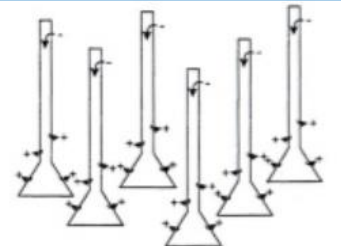
Asynchronously activated neurons



able to measuring

Open field (currents sum and conduct to the electrodes)

Aligned, synchronous neurons



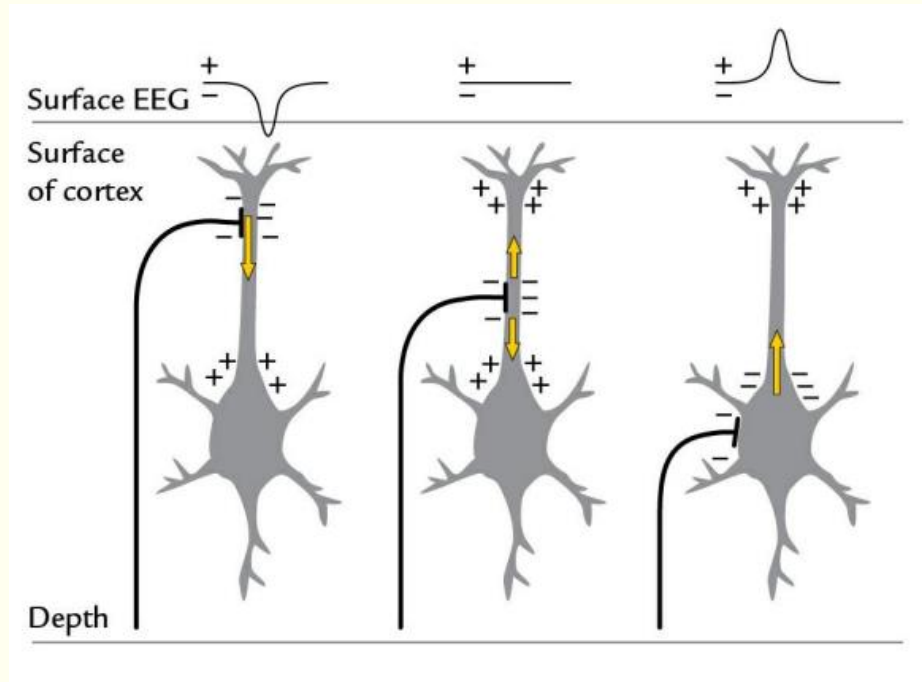
Only neurons that produce an open field contribute to EEG

EEG signal generation – which membrane potentials?

- Mainly constituted by post-synaptic potentials because they are slower and can sum up more easily in large groups of neurons
- Action potentials are fast and more difficult to add up in time

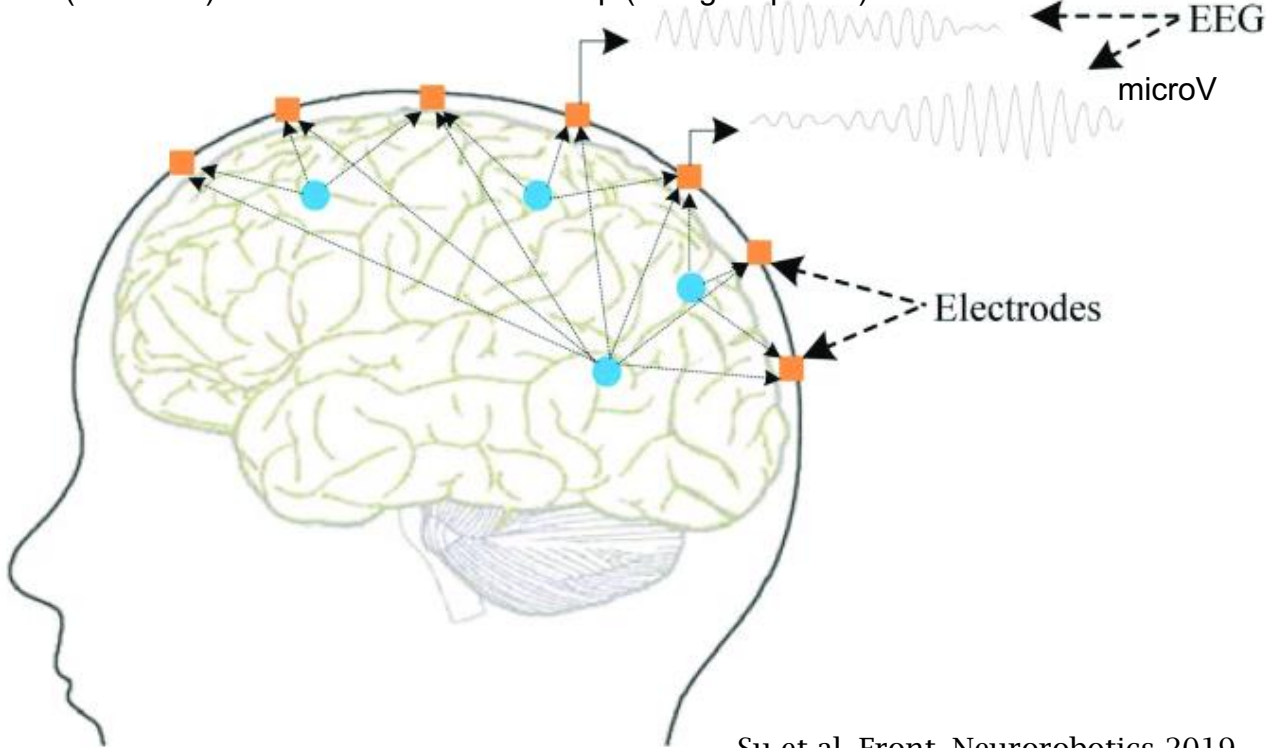
in the case in which we are measuring the single cell, it will be much easier to measure the action potential than the post-synaptic potential, but in the case of many neurons is the opposite

with respect to post-synaptic potential



Limitations of scalp EEG - 1

sources (blue dots) and electrodes on the scalp (orange squares)



Su et al, Front. Neurorobotics 2019

single source affect different electrodes

1. Spatial blur (attenuation and spread of the potential with distance)
depends on the distance

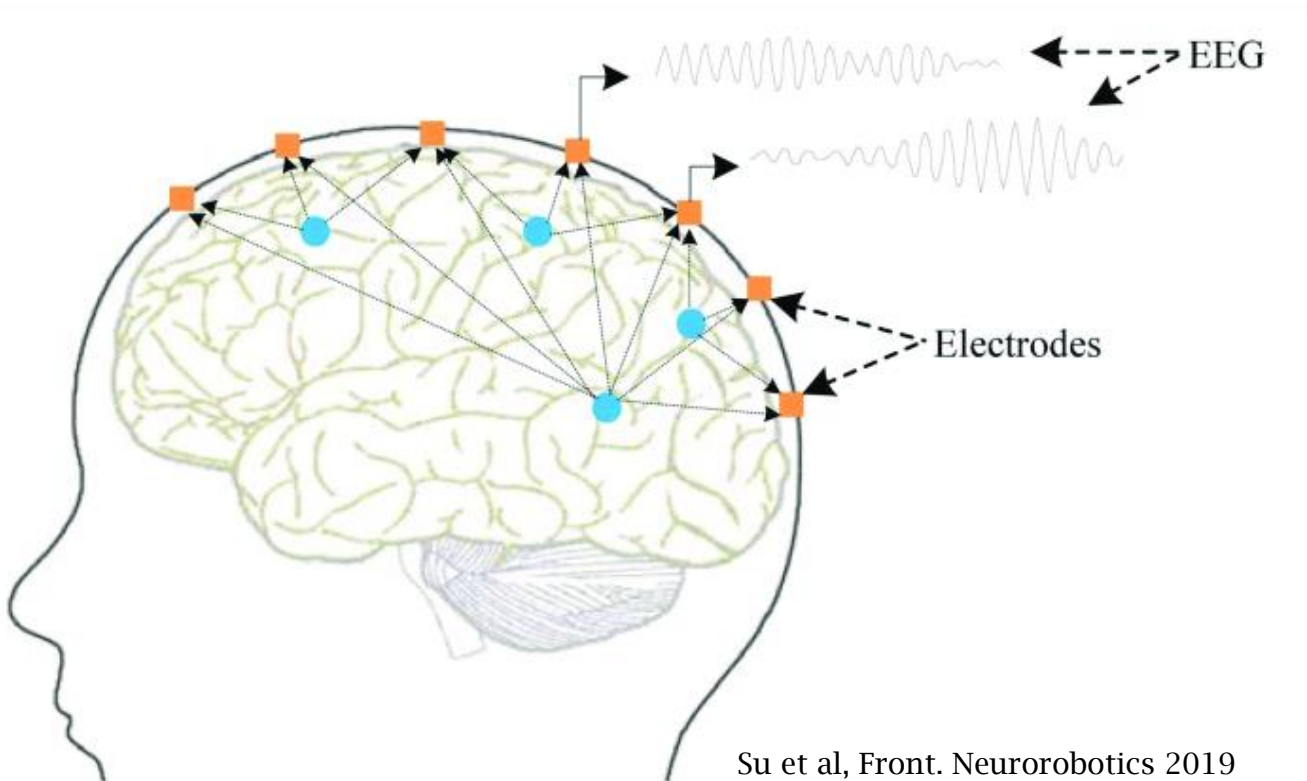
2. Low signal-to-noise ratio
with the propagation of the current across the volume conduction we not only have a spread of potential but also an attenuation

3. Multiple sources
contribute to the single electrode signal

4. Near electrodes record partially overlapped (correlated) signals

5. Reference choice

Limitations of scalp EEG - 2



Cortical sources:

- Open field (pyramidal neurons)
- closest to the scalp → stronger, more focused signals

Deep sources:

- Closed field
- More distance
- Attenuation
- More spatial blur

emotional aspects of the brain function are located here

Advantages of scalp EEG

1. Noninvasive MEG and EEG are the only non invasive measures of the elchtromagnetic correlation of the brain activity
2. Easy to use practical applications and researches
3. Portable wherever you want
4. Inexpensive few thousand of euro
5. Covers the entire cortical surface
6. Excellent temporal resolution because the propagation is instantaneously

References

- Dayan & Abbott:
 - Chapter 1.1 (Recording Neuronal Responses)
- Wolpaw & Wolpaw:
 - Chapter 2 (Spike Recording and Processing)
 - Chapter 3, pagg. 45-57 (Electric and magnetic fields produced in the brain)
- Hari & Puce:
 - Chapter 1, pagg. 7-11
 - Chapter 3, pagg.25-27 (Charges and electric current) and pagg. 31-34 (Source currents)
 - Chapter 4, pagg. 38-40 (Early EEG recordings)

Self-evaluation test

1. Put the following levels of brain electrical correlates in sequence according to their increasing spatial resolution (from the less to the more detailed):
 - A. ECoG: Elettrocorticography
 - B. LFP: Local field potentials
 - C. IP: Intracellular Potentials
 - D. S-EEG: Stereo-electroencephalography
 - E. EEG: Electroencephalography
 - F. EP: Extracellular Potentials
2. To record in vitro measures of the membrane potential over the dendrites of a neural cell, you can use:
 - A. Intracellular measures
 - B. Extracellular measures
3. Describe which part of the pyramidal neuron acts as a current dipole and how

Self-evaluation test

4. For each of the following factors, indicate if they affect or not the amplitude of EEG signals:
 - A. Open/closed field
 - B. Neurons orientation
 - C. Synchronicity of the neural activity
 - D. Distance between the neurons and the electrodes
5. Which electrical variation of the membrane potential mainly contributes to EEG?
 - A. The action potential
 - B. The spike train
 - C. The resting membrane potential
 - D. The post-synaptic potentials
6. Which regions of the brain mainly contributes to scalp EEG? Why?
7. List at least 4 limitations of scalp EEG recordings
8. List at least 5 advantages of scalp EEG recordings