



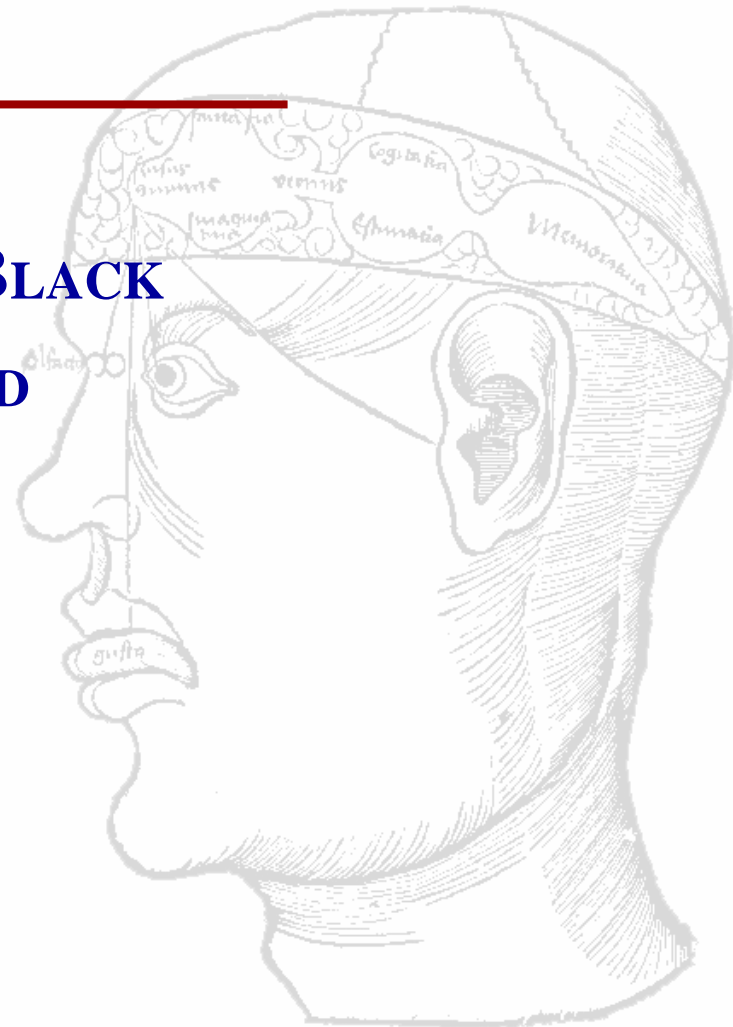
Topics in Brain Computer Interfaces

CS295-7

Professor: **MICHAEL BLACK**

TA: **FRANK WOOD**

Spring 2005





What can we measure from the brain?



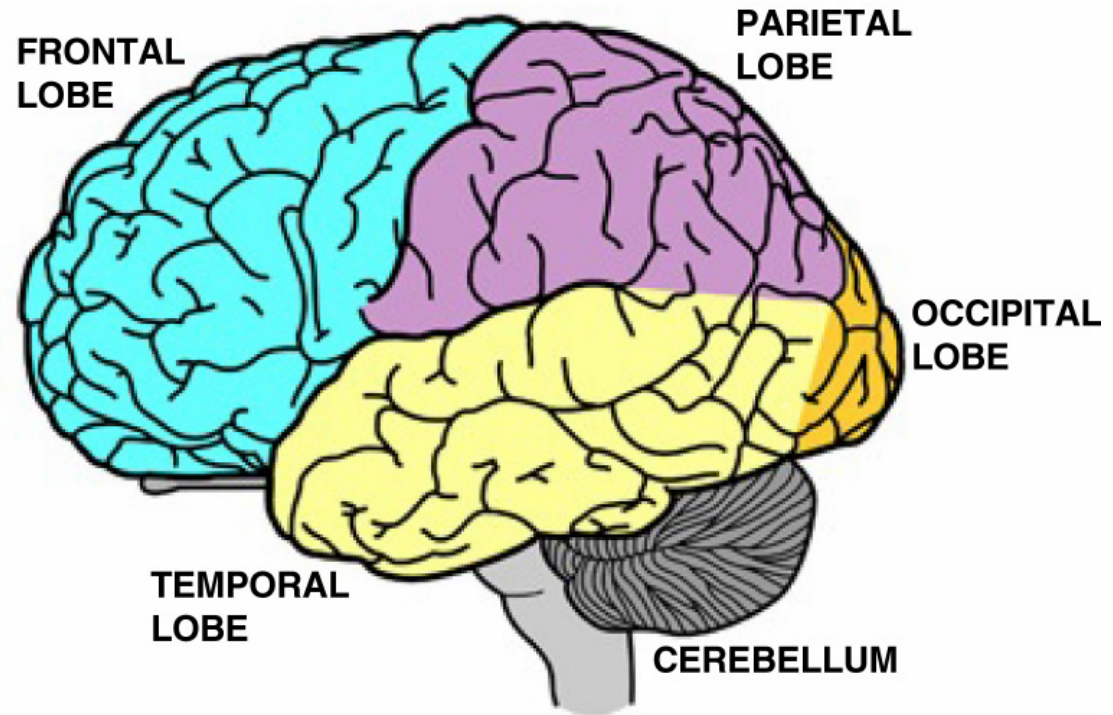
Cerebral Cortex

Frontal lobe. Planning of action and control of movement.

Temporal lobe. Hearing. In its deep structures lies the hippocampus, an important location for memory.

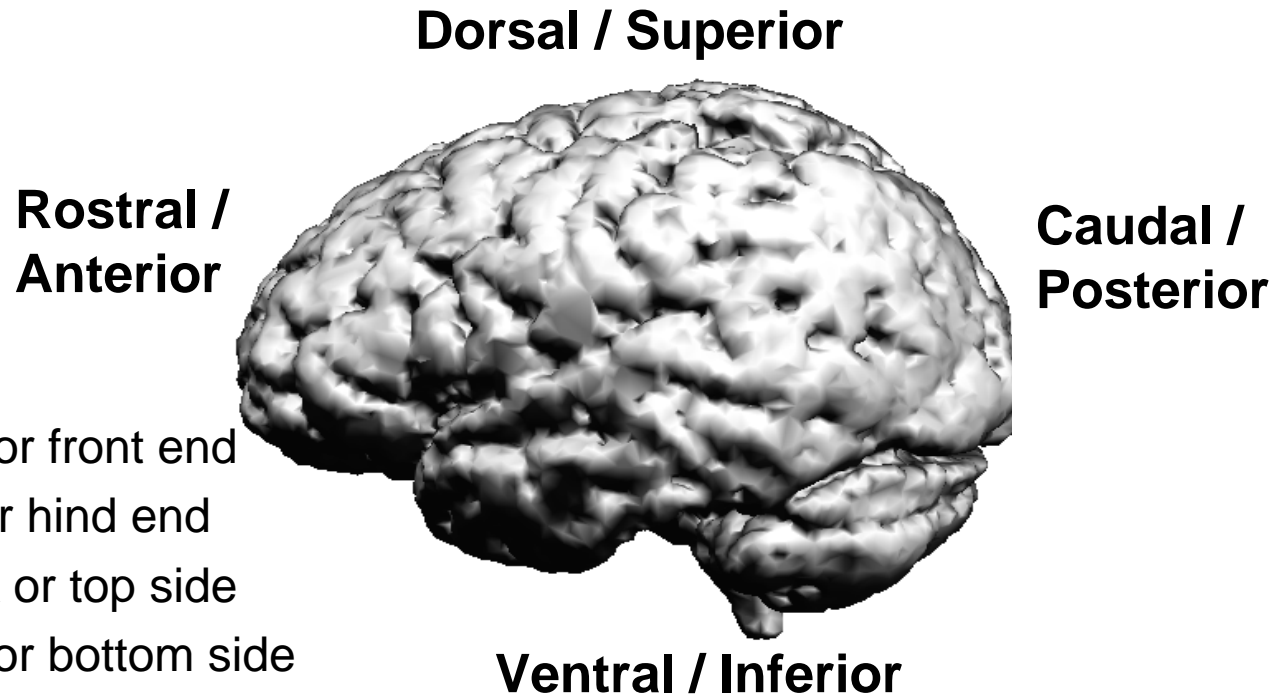
Occipital lobe. Vision.

Parietal lobe. Sense of position.





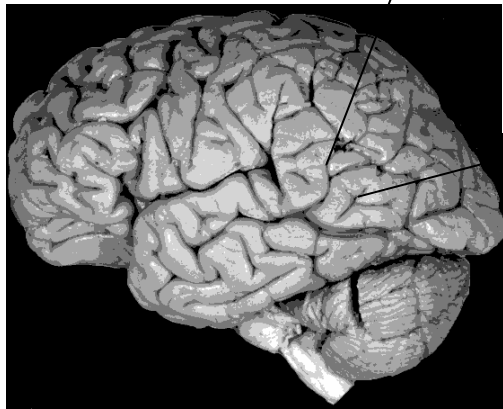
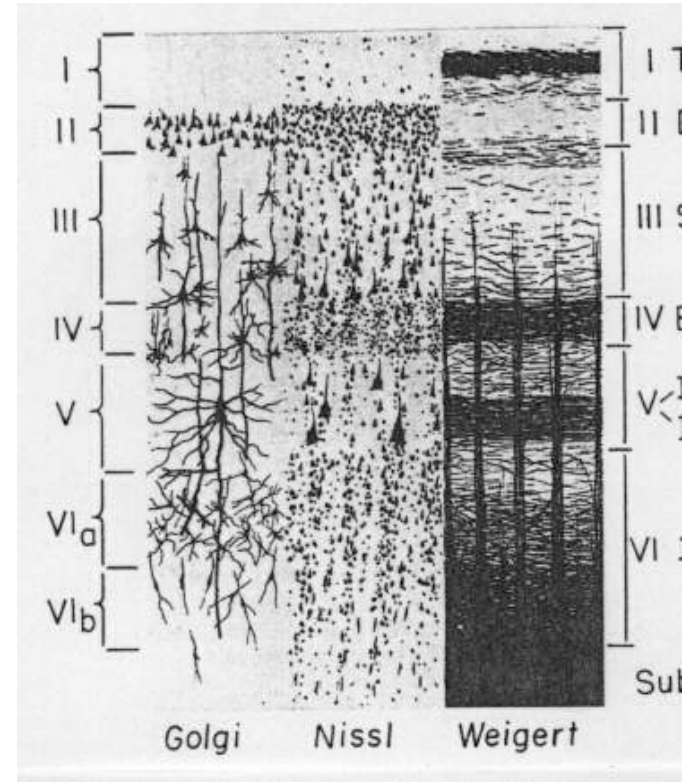
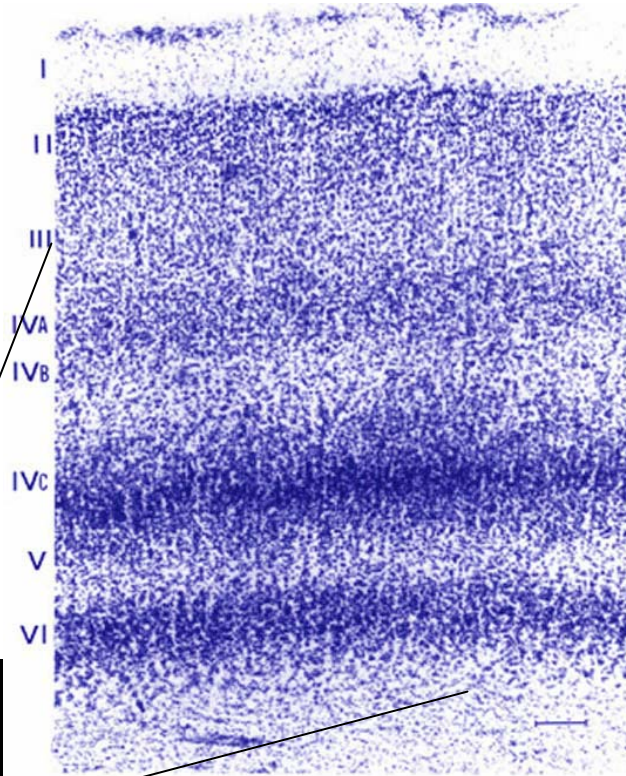
Useful Terms



- Rostral/Anterior=head or front end
- Caudal/Posterior=tail or hind end
- Dorsal /Superior= back or top side
- Ventral/Inferior = belly or bottom side
- Medial=toward the midline of the body
- Lateral=away from the midline
- Proximal = closer
- Distal = farther away



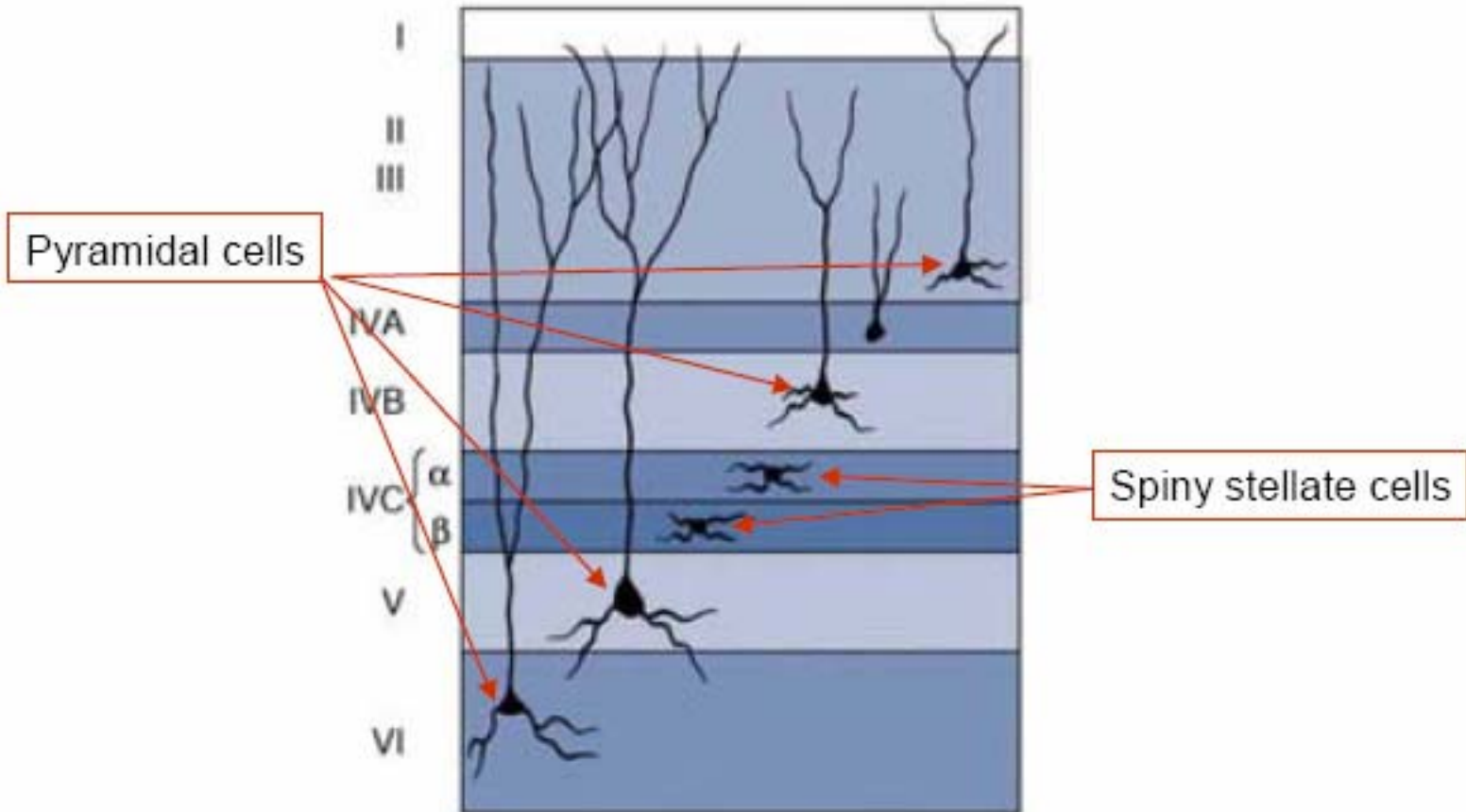
Layered Cortex



Largely "accessible".



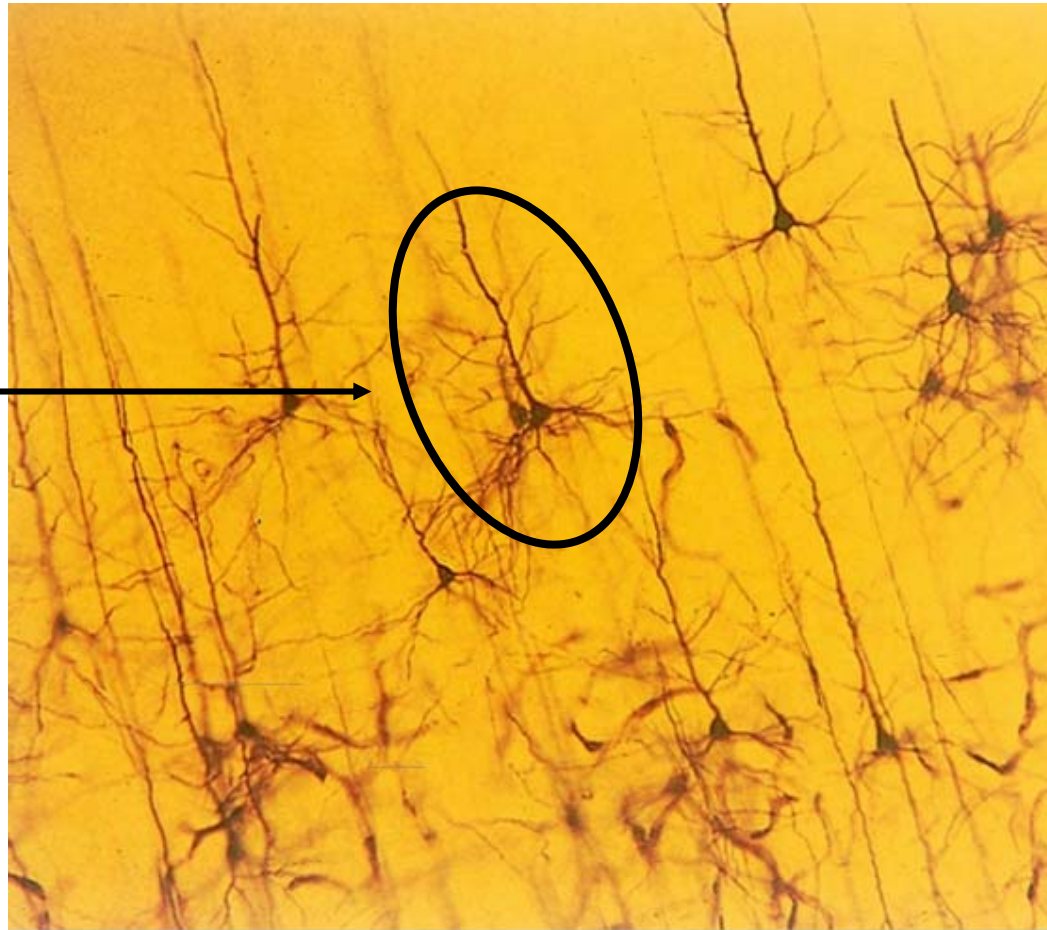
Cortical layers



Only pyramidal neurons send axons outside of the cortex
N.B. The specific illustrations are for primary visual cortex, but the general principles apply throughout the cortex



Neurons



Single cells of
the nervous
system

Pyramidal
cell

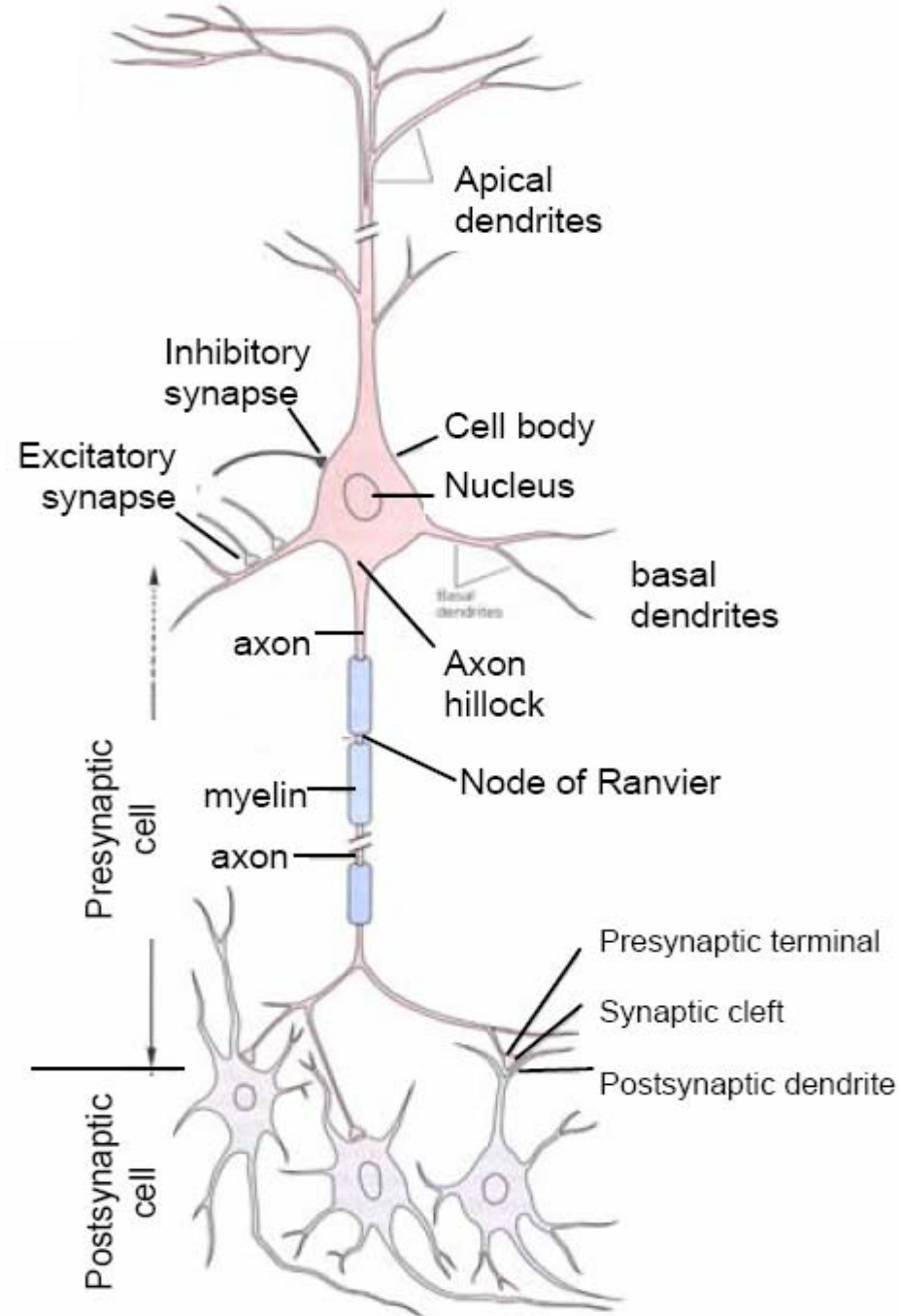
100,000,000,000 in your brain

Source: Hubel

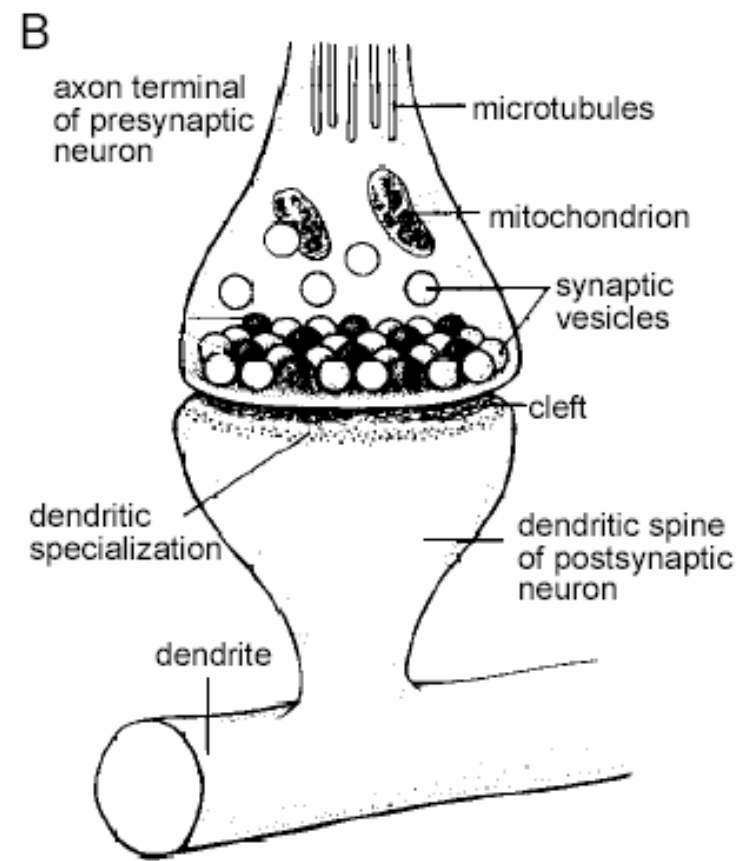
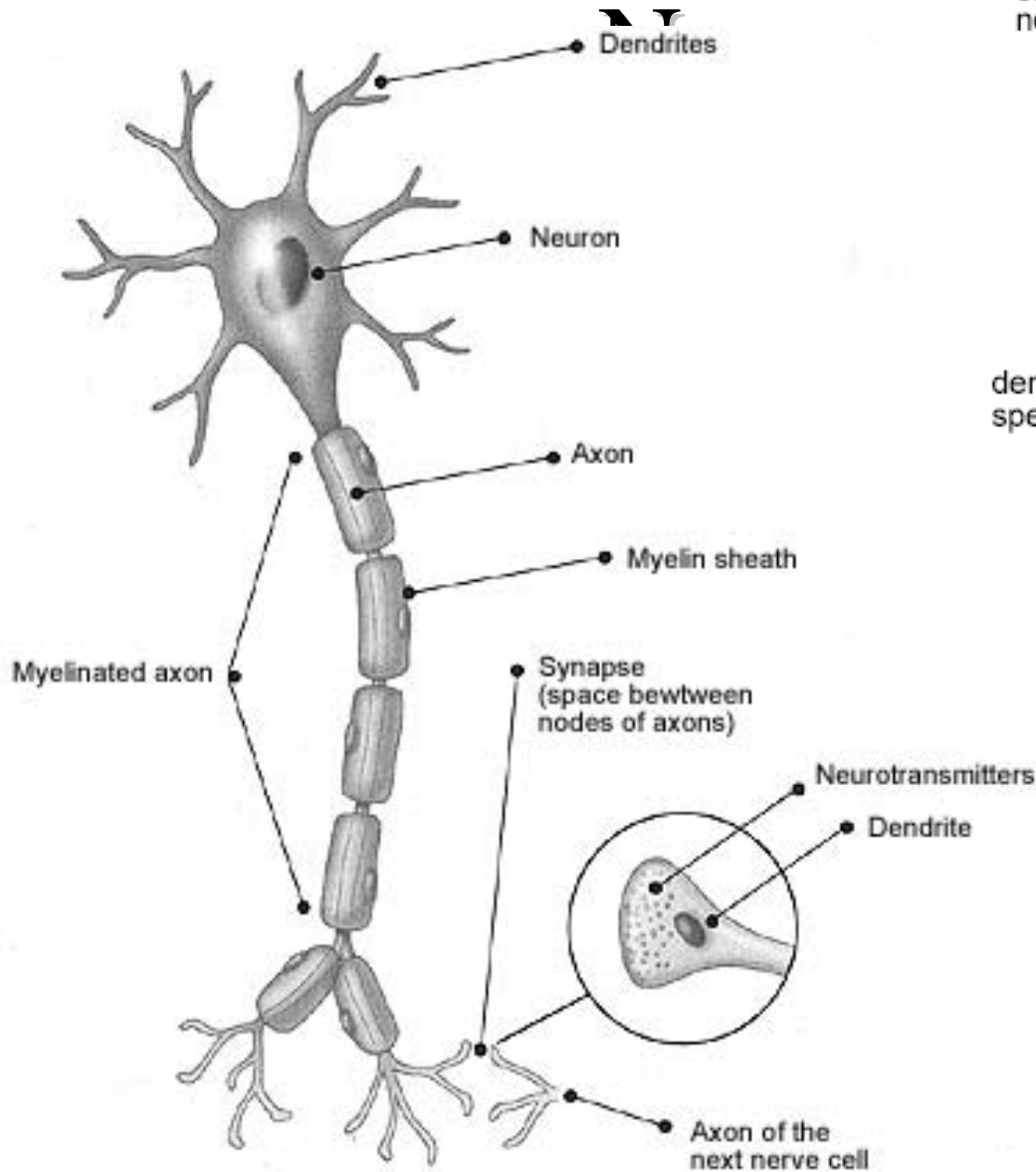


Neurons have four functional regions:

- Input component (dendrite)
- Trigger area (soma)
- Conductive component (axon)
- Output component (synapse)



Source: R. Shadmehr

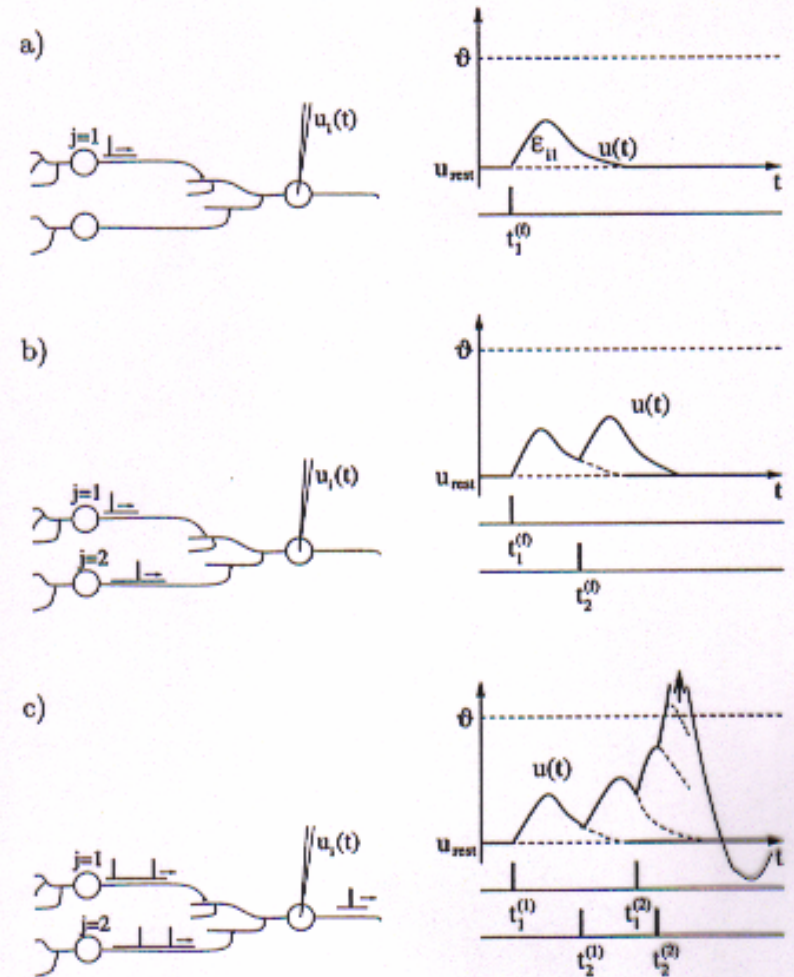


source: Health South Press



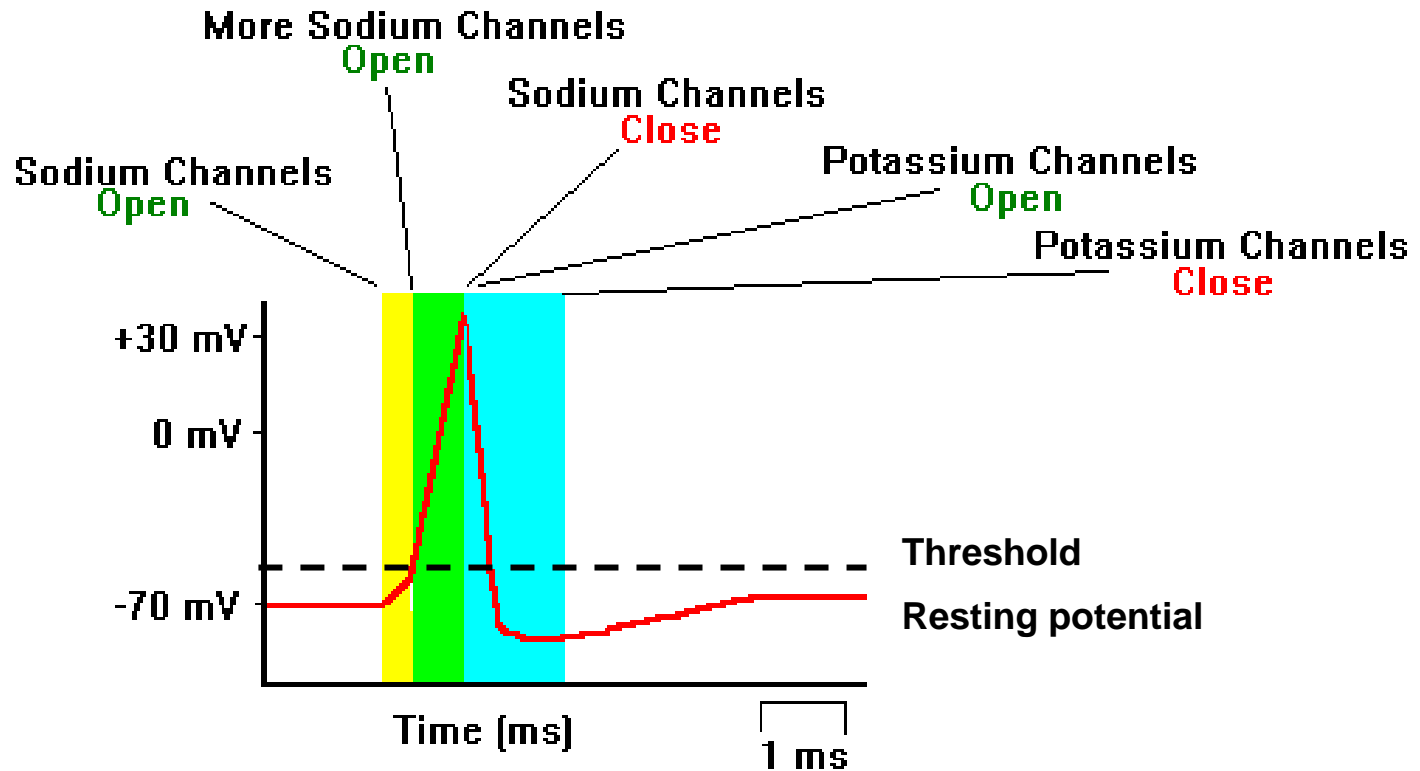
The Action Potential

0. The cell has a negative resting potential of around -65mV .
1. Excitatory synapses cause small depolarization of cell.
2. Enough of these add up until the cell's potential depolarizes to cross a voltage **threshold**.





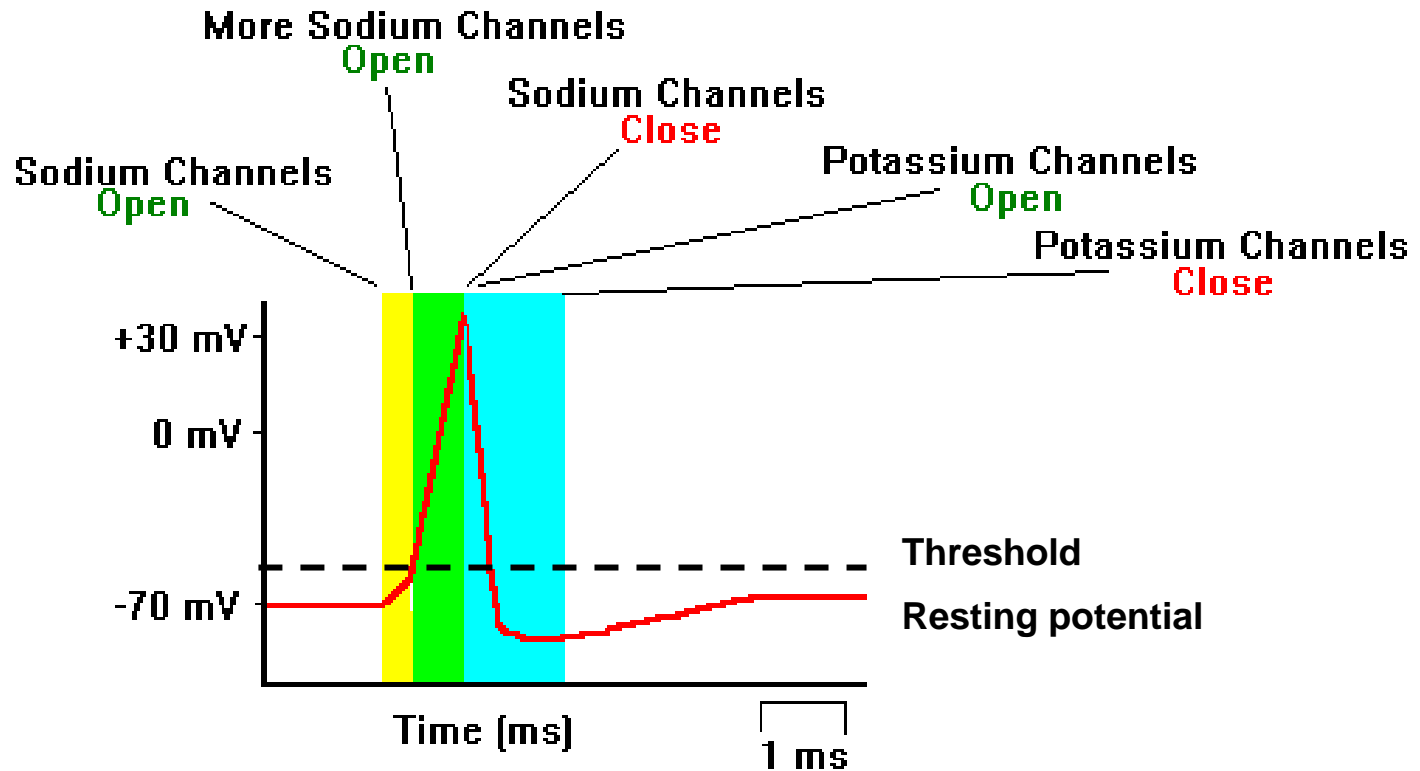
The Action Potential



3. **Rising phase.** Sodium (Na^+) channels open and Na^+ ions rush into cell.



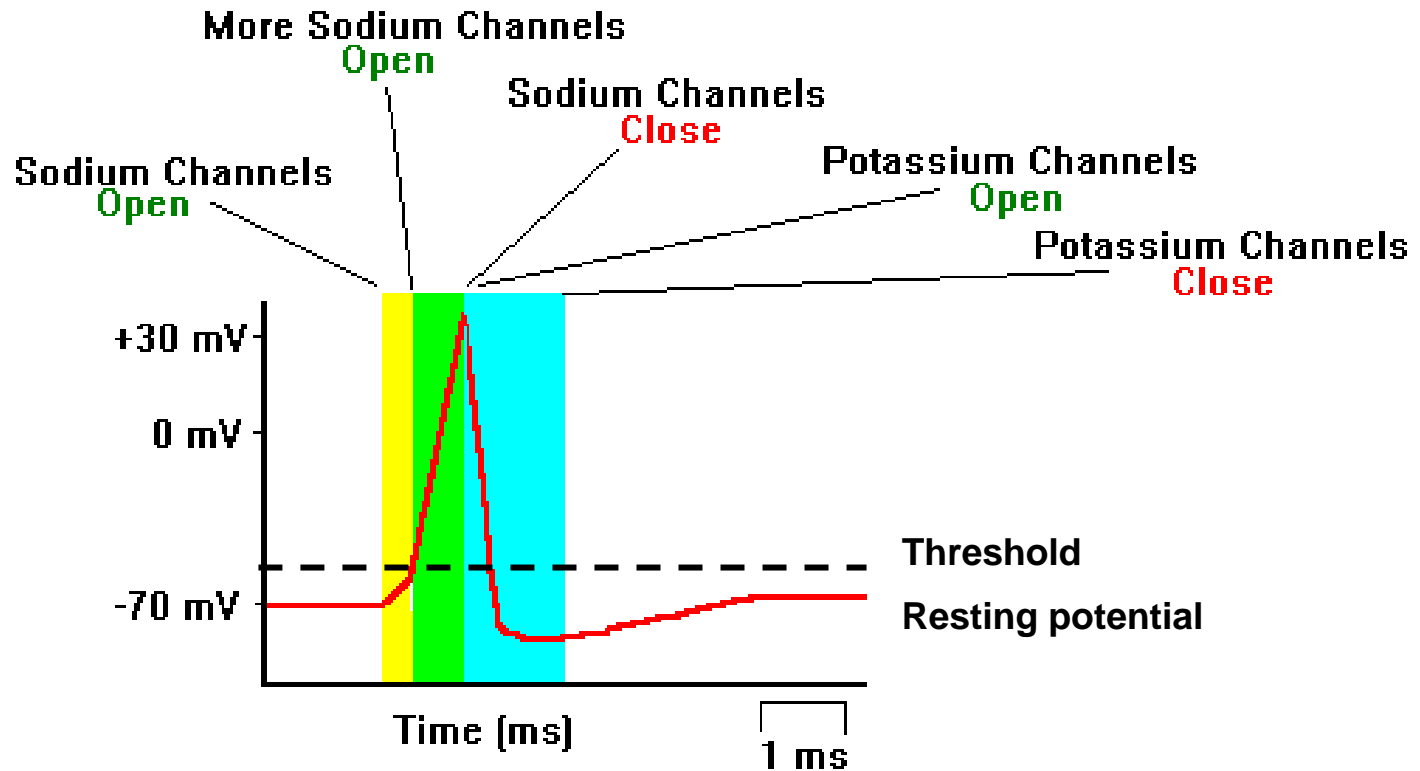
The Action Potential



4. **Falling phase.** Sodium channels close and potassium (K^+) channels open. K^+ ions flow out.



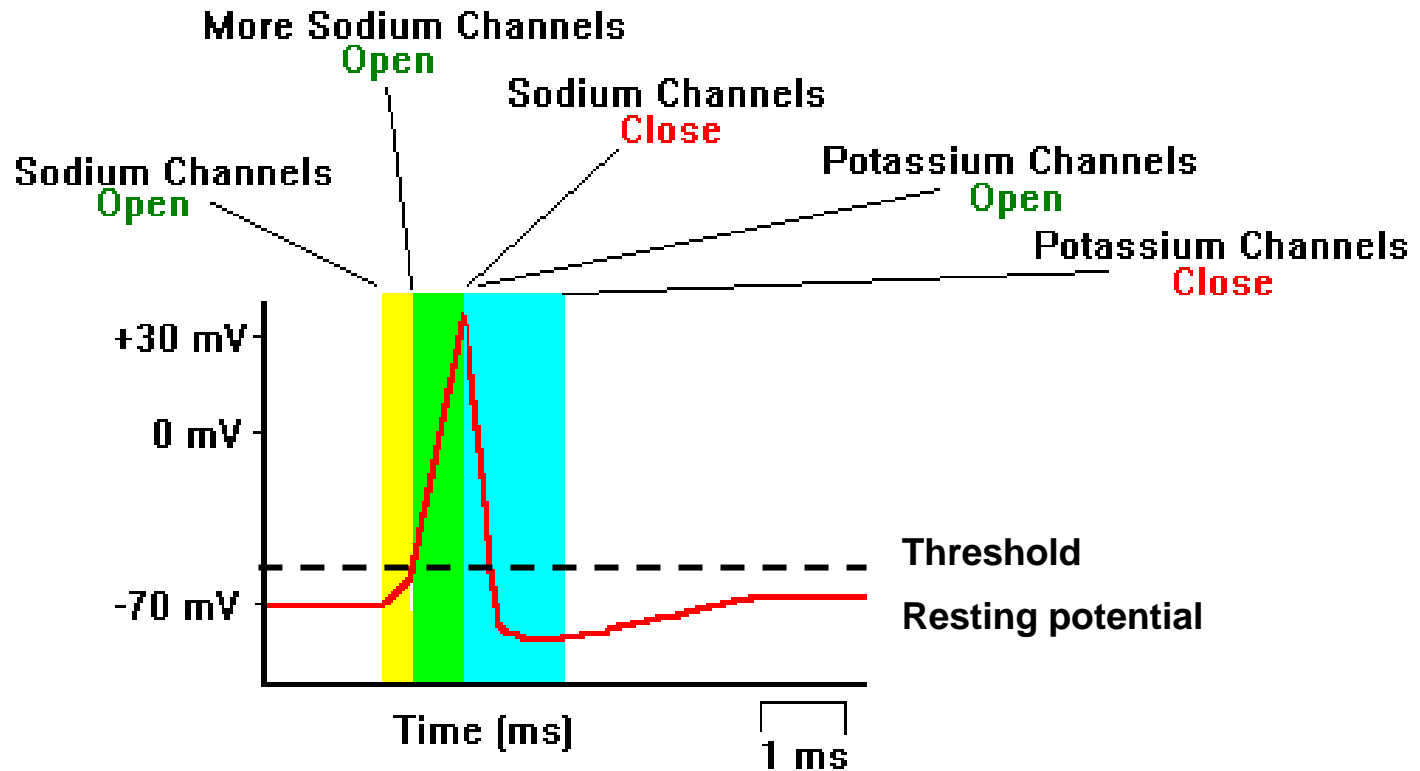
The Action Potential



- Absolute refractory period.** Sodium channels deactivate when cell is strongly depolarized. Can't be activated again (ie no new action potential) until potential is sufficiently negative.



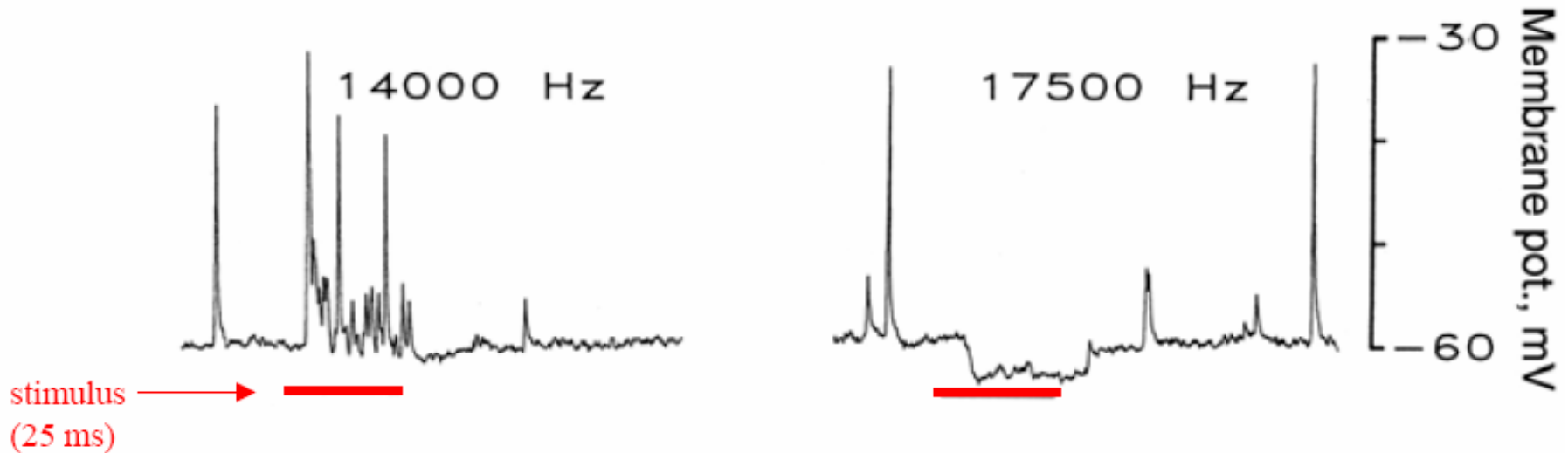
The Action Potential



6. **Relative refractory period.** Potential stays hyperpolarized until K^+ channels close – more current required to bring cell to threshold.



Excitation and Inhibition



Excitation:

Depolarization

Excitatory post-synaptic potentials.

Increased spike rate

Inhibition:

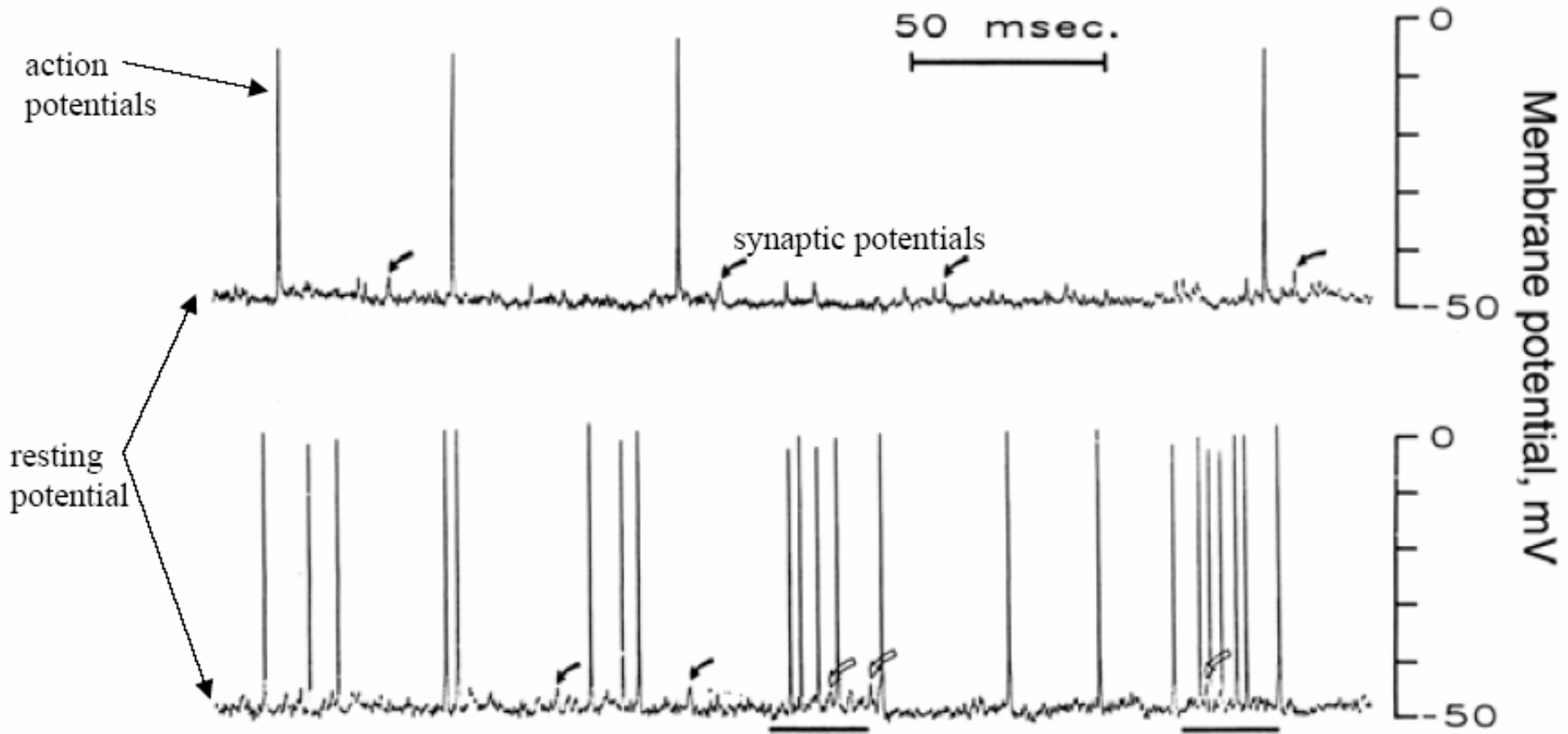
Hyperpolarization

Inhibitory post-synaptic potentials.

Decreased spike rate



Intra-cellular recording



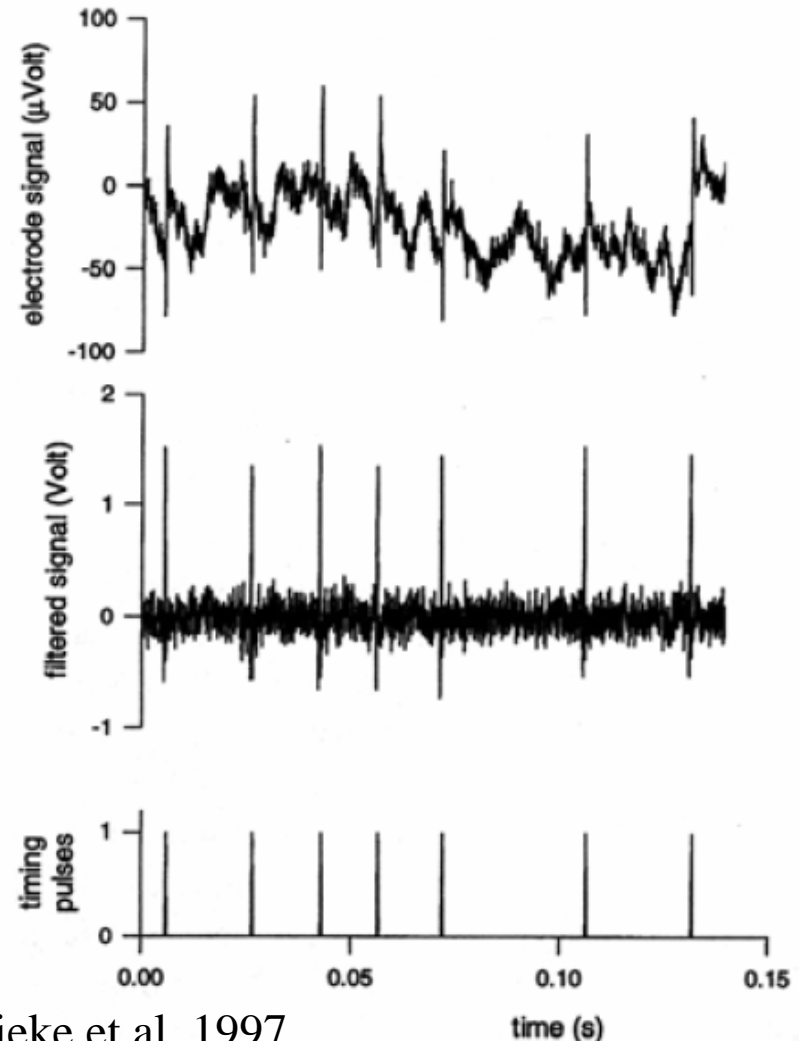
Smith and Rhode, 1987.



Extra-cellular recording

Can only observe
action potentials
(spikes).

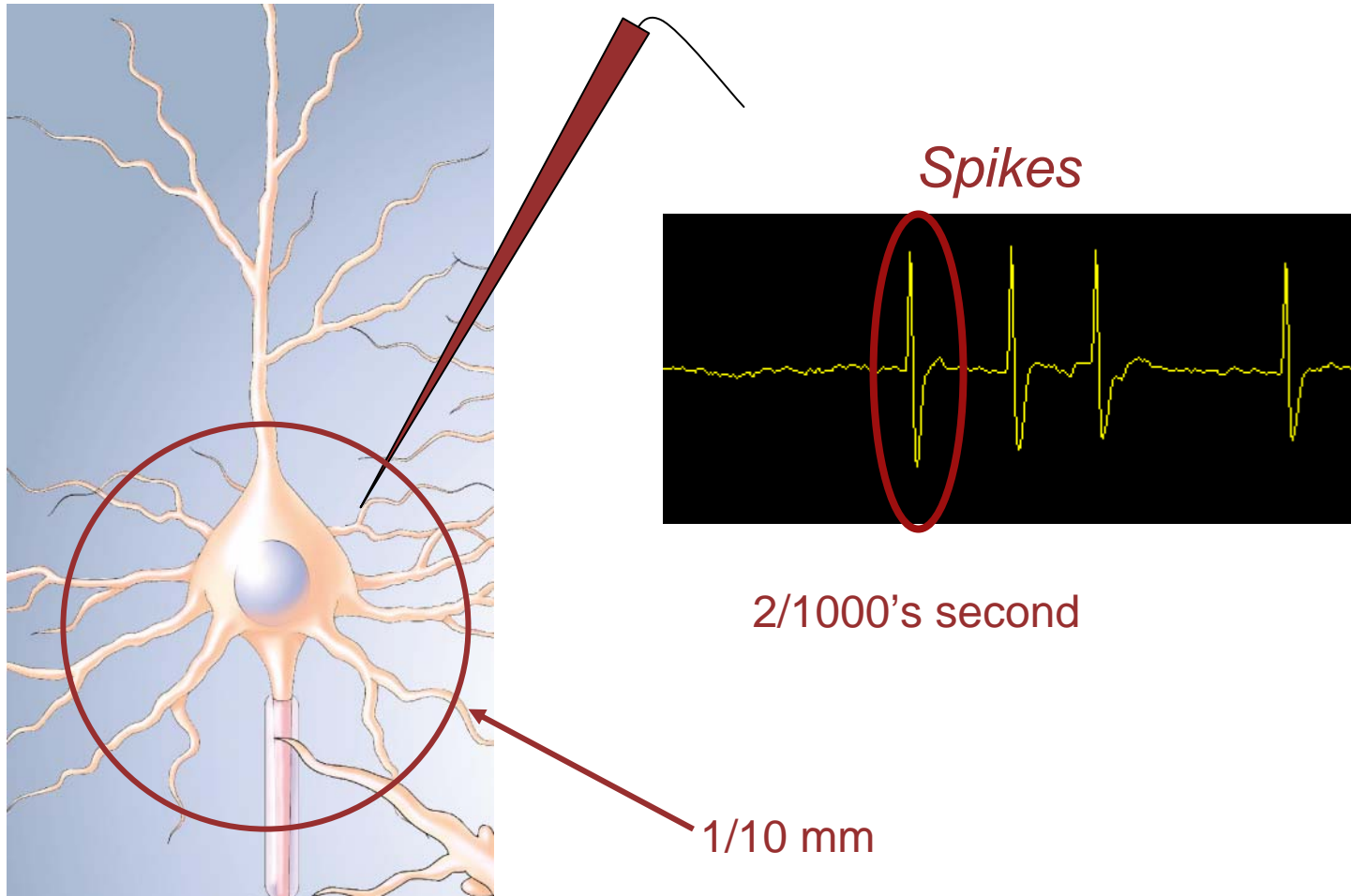
Assumption: neurons
convey information
in their spikes.



Rieke et al, 1997



Computational Elements of the Brain

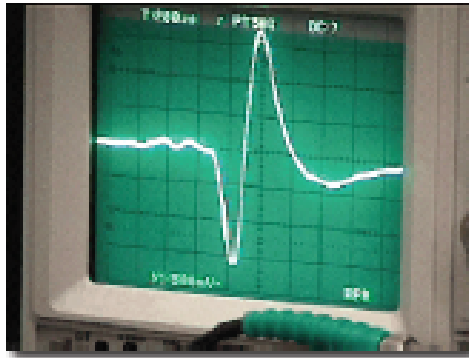


Source: Bear, Connors, Paradiso

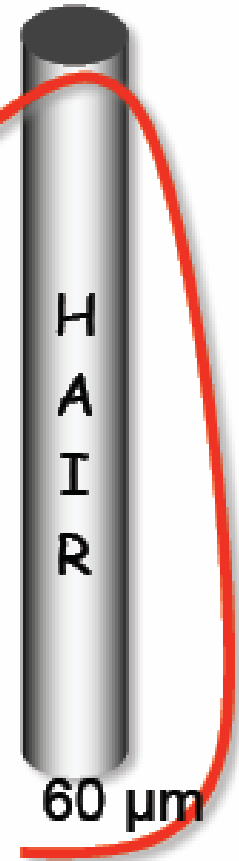
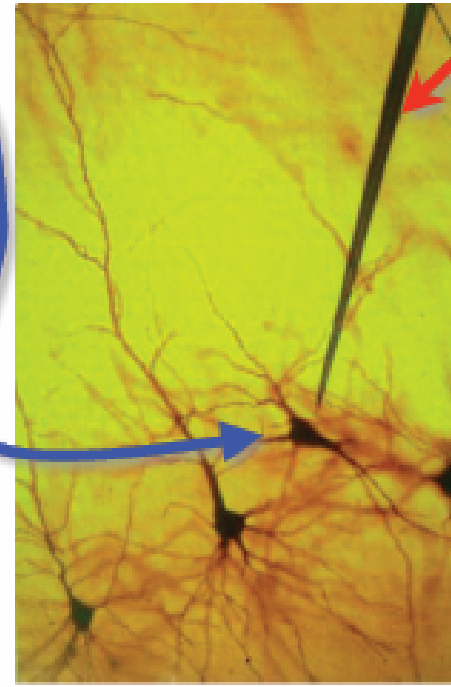


Extra-cellular Recording

SIGNAL



SENSOR



Spike

- 1/1000 of a second electrical impulse
- rates carry information
(rate = how many/time)

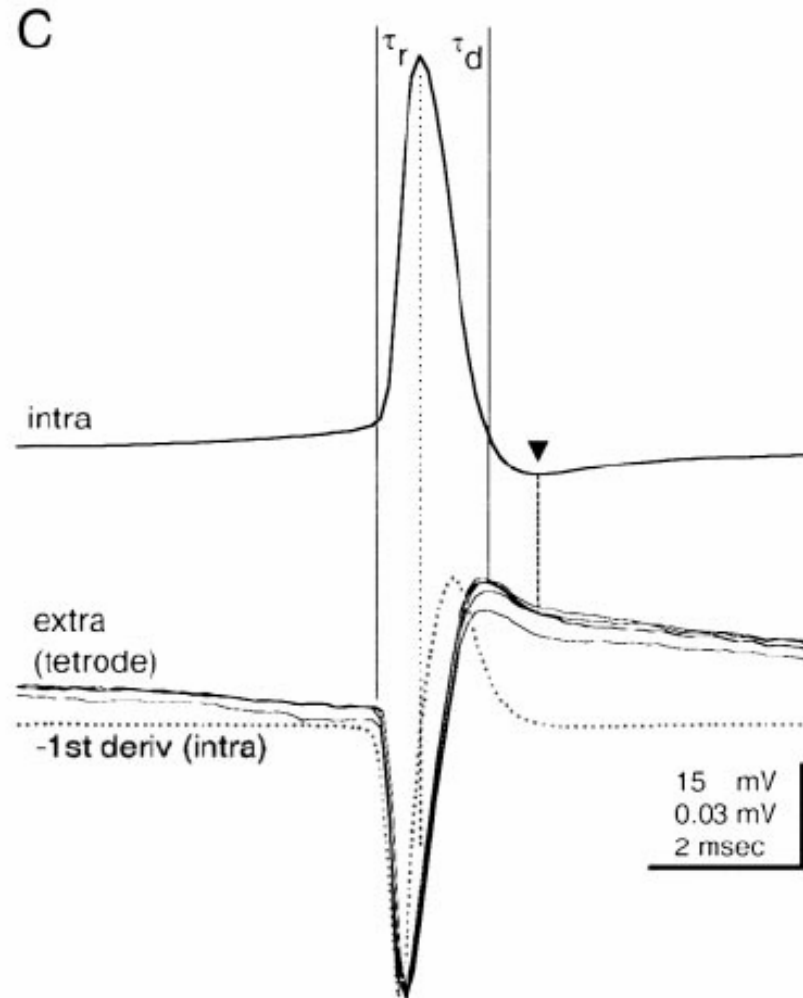
Microelectrode
(insulated, tapered conductor)



Recording Spikes

Intra-cellular recording

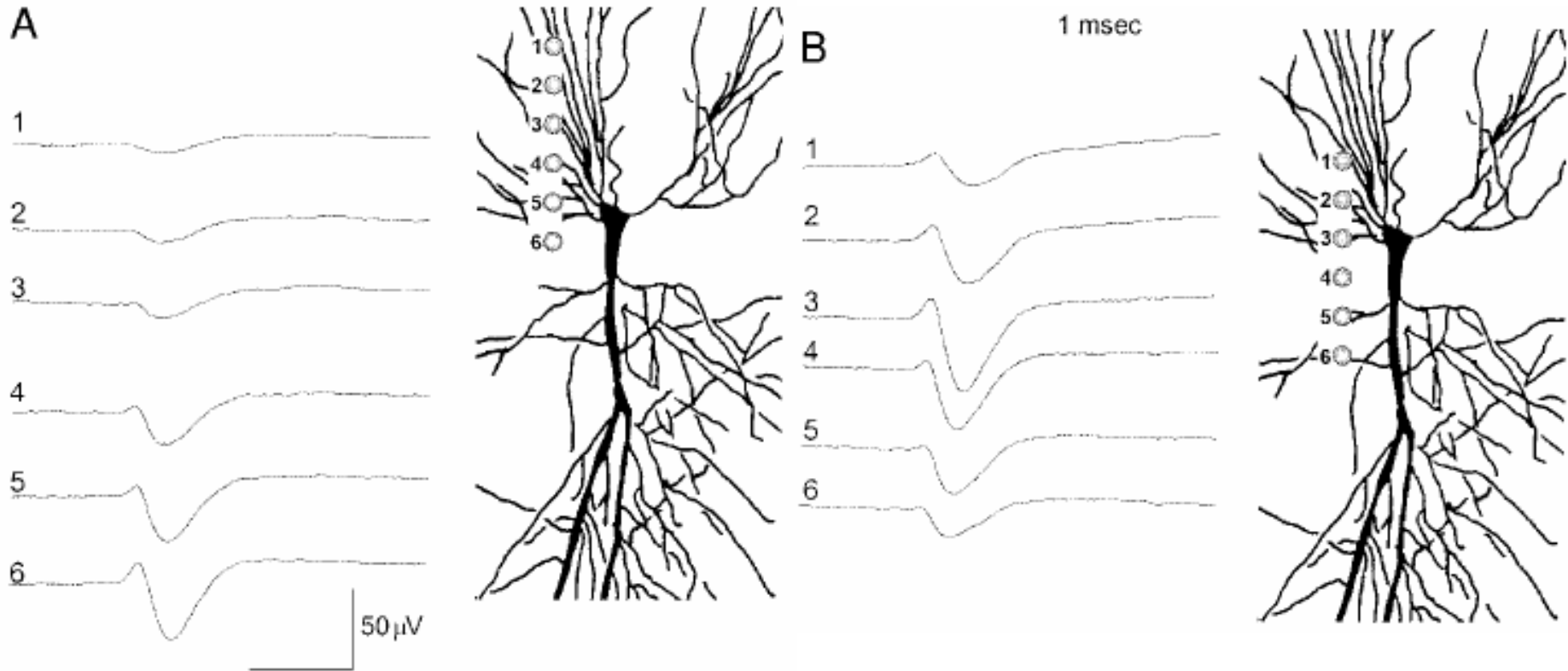
Extra-cellular recording



Source: Henze et al. 2000



Recoding as a function of depth

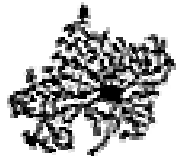
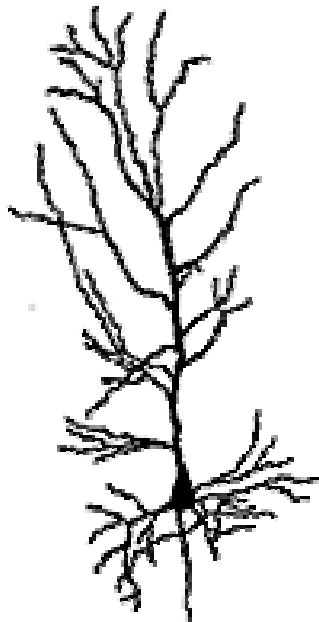


Source: Henze et al. 2000

http://www.cns.nyu.edu/~siddha/SPF_papers/Henze.pdf



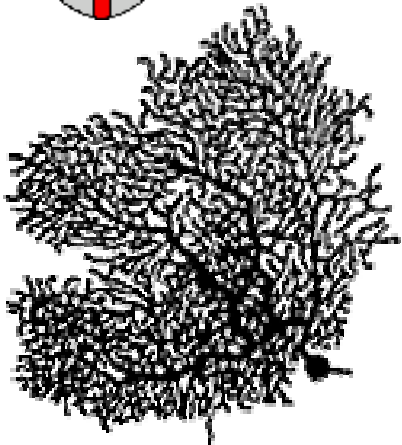
PYRAMIDAL CELL



INFERIOR OLIVARY NUCLEUS NEURON



GRANULE CELL



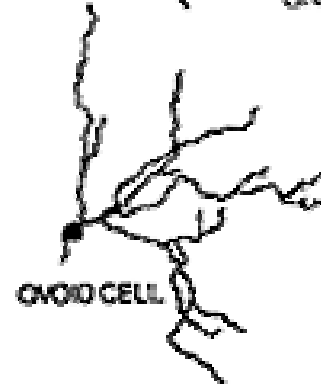
PURKINJE CELL



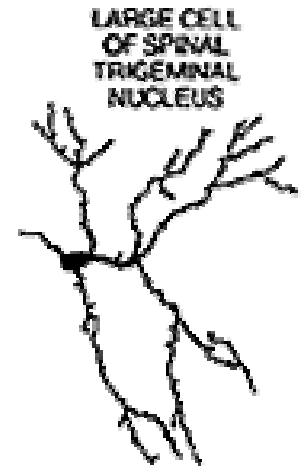
SMALL GELATINOSA CELL



SPINDLE-SHAPED CELL (SUBSTANTIA GELATINOSA)

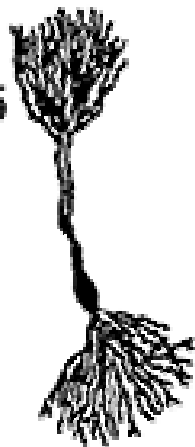


OVOID CELL

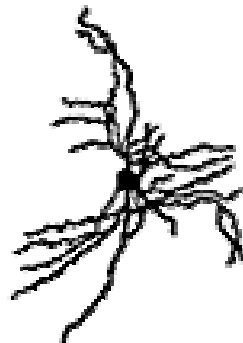
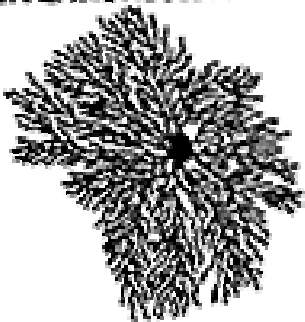


LARGE CELL OF SPINAL TRIGEMINAL NUCLEUS

DOUBLE PYRAMIDAL CELL (AMMON'S HORN)

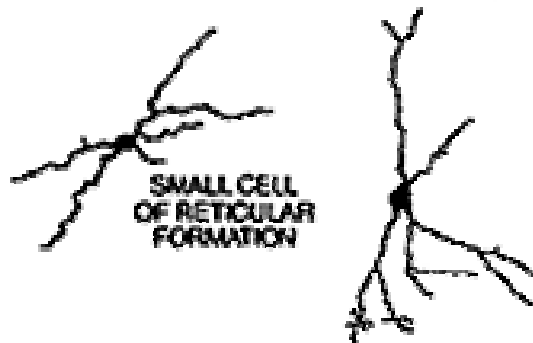


CELL OF THALAMIC NUCLEUS

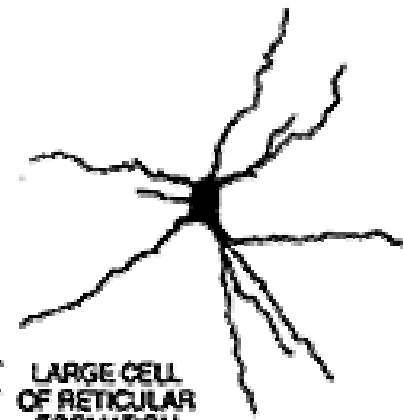


NEURON FROM PUTAMEN OF LENTIFORM NUCLEUS

CELL FROM GLOBUS PALLIDUS



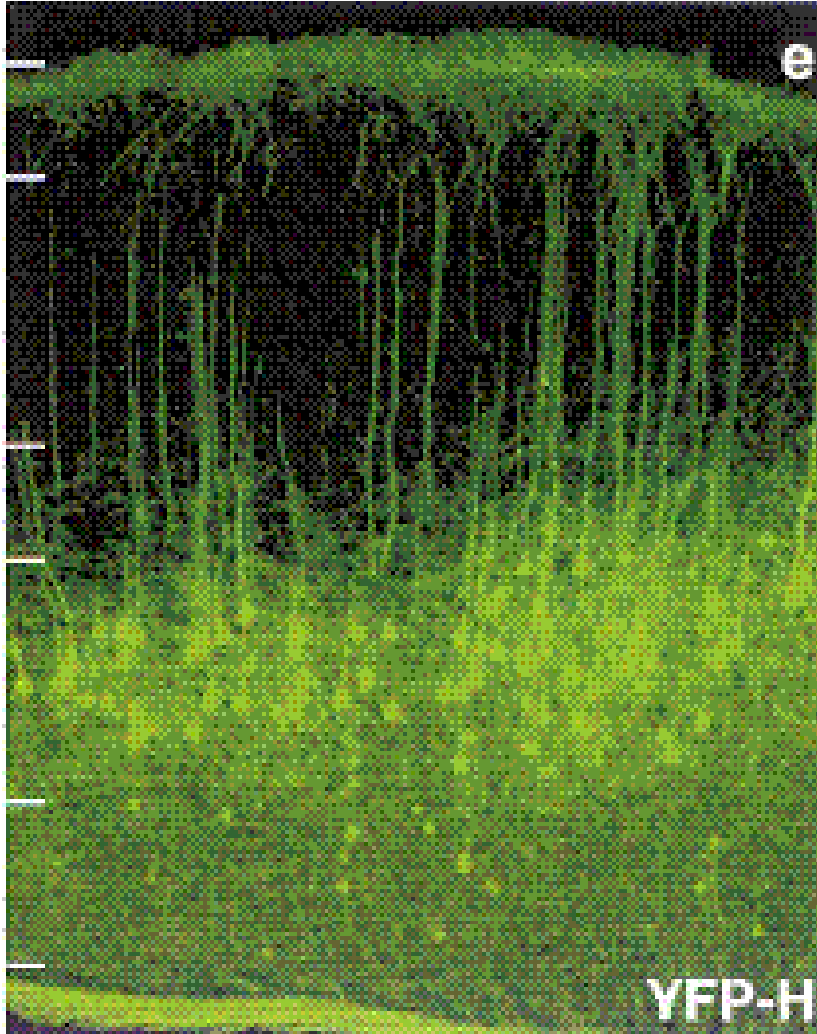
SMALL CELL OF RETICULAR FORMATION



LARGE CELL OF RETICULAR FORMATION



Pyramidal Cells in Cortex



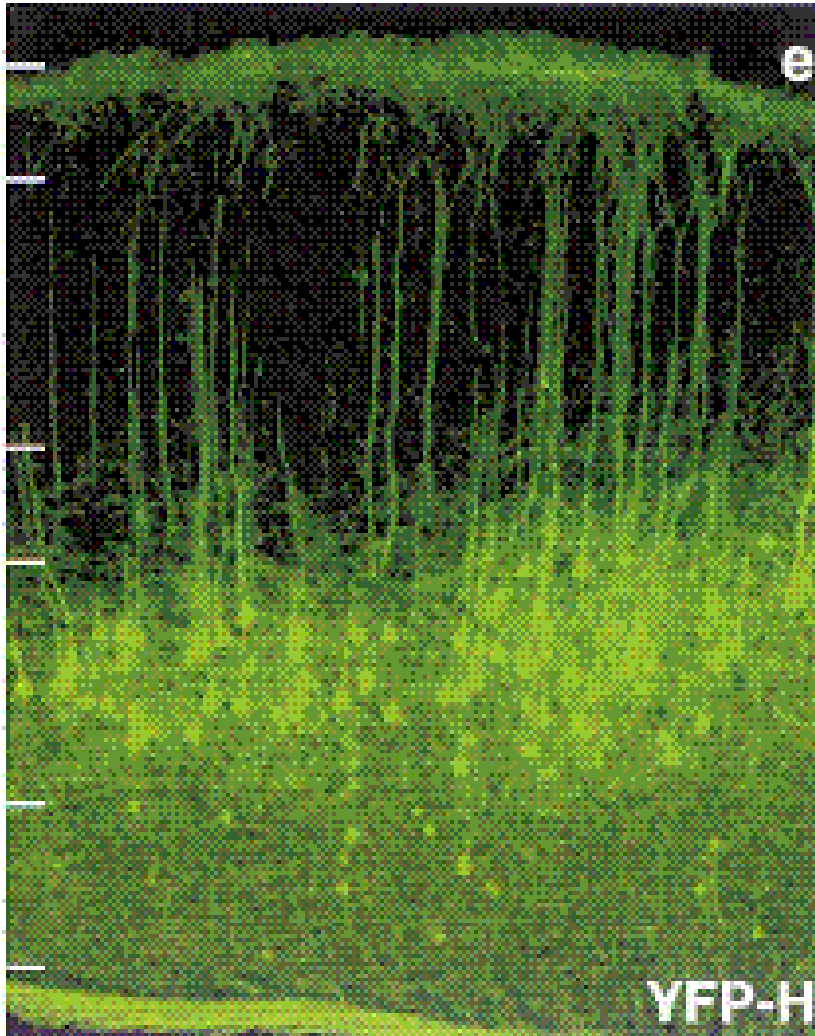
A dense population.

Pyramidal cells
arranged roughly
parallel to each other.

May record from
multiple cells
simultaneously (we'll
return to this later).



Pyramidal Cells in Cortex



Local Field Potential (LFP) - electrical activity of all cells averaged over some spatial neighborhood.

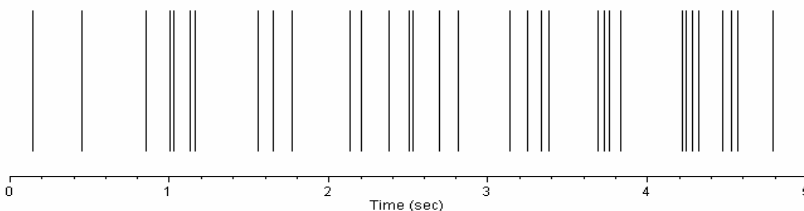
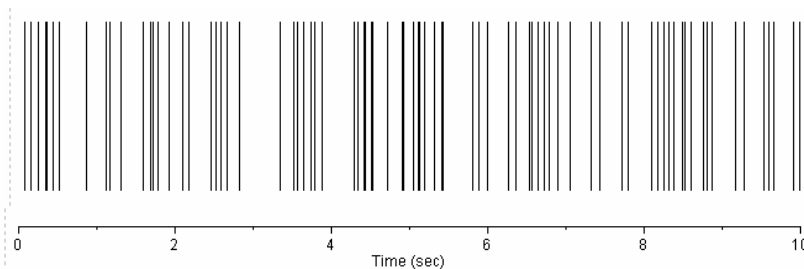
Highpass filtering in 1-2ms range gives spikes (1-2kHz).

LFP signal is lower frequency (e.g. 10-100Hz)



Spike “Sorting”

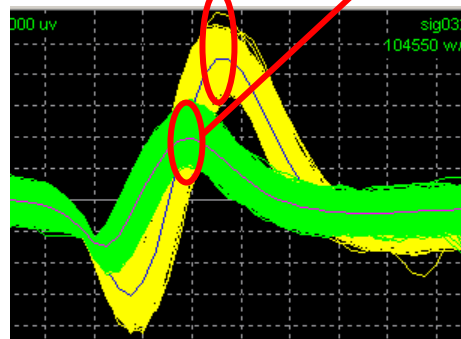
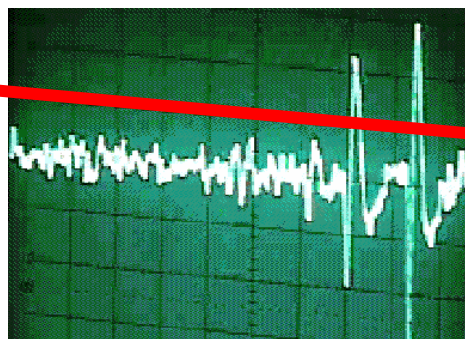
Spike Train, $\{t_i\}$, from cell j



Peak Time

Classify $S_{i,j}^*(t)$

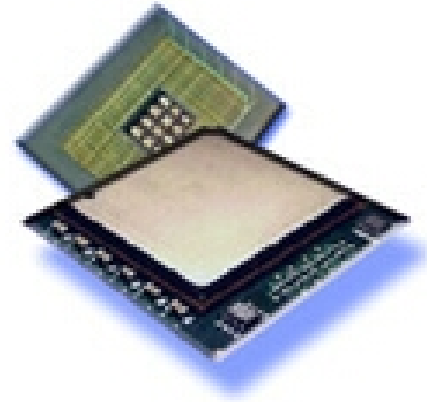
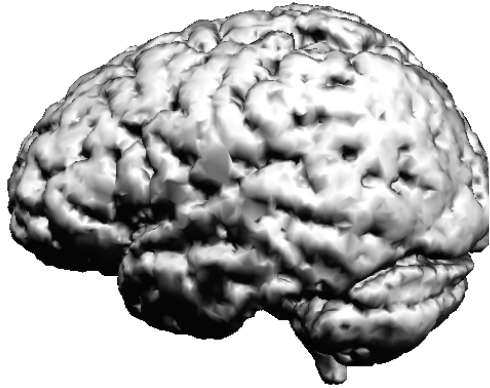
Threshold



Record $S(t)$



BRAIN VERSUS COMPUTER



Computational Elements

100,000,000,000

Neurons

100,000,000

Transistors

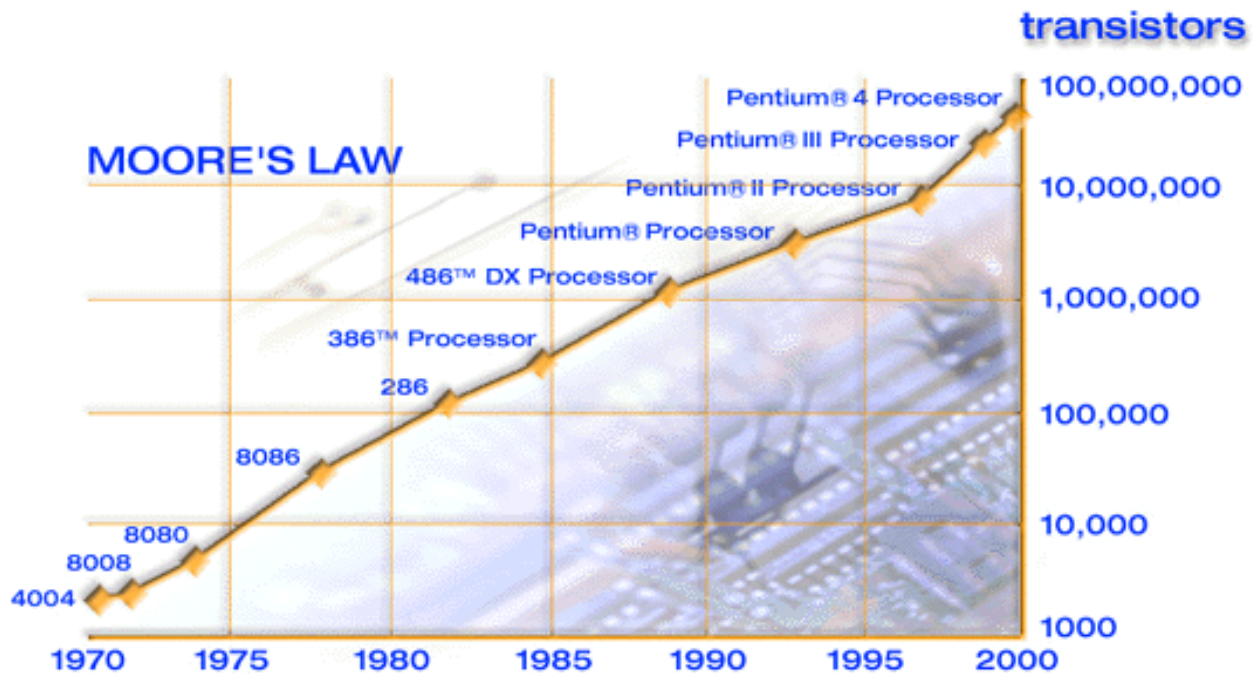
Speed (operations/second/element)

30-300

$1.5 * 10^9$



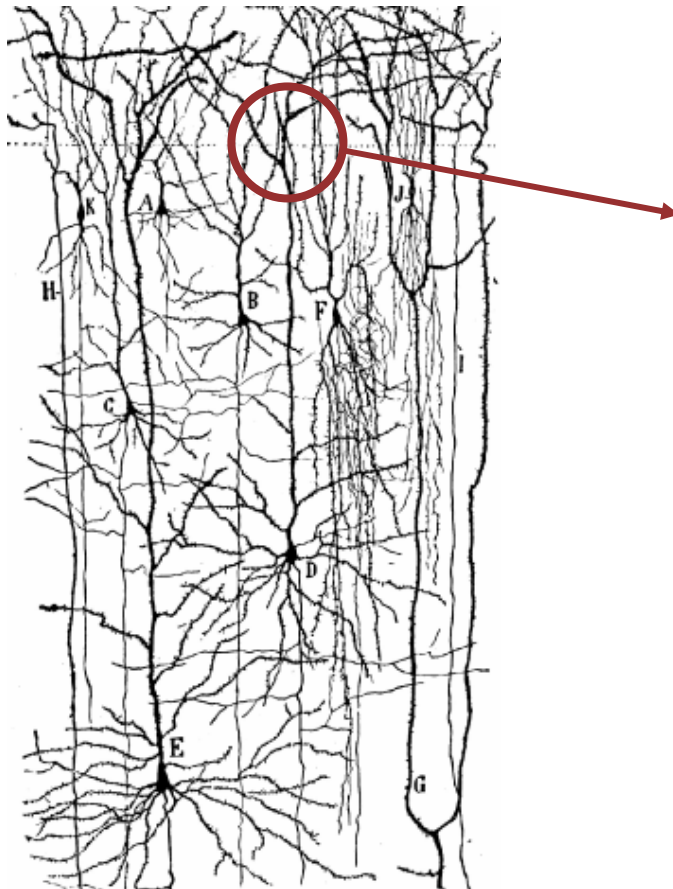
MOORE'S LAW



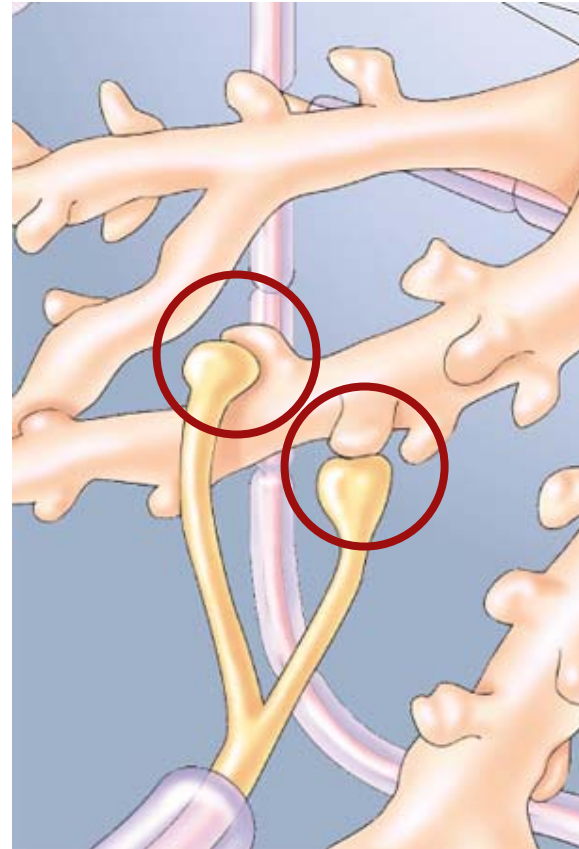
source: Intel



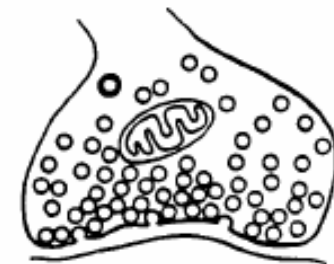
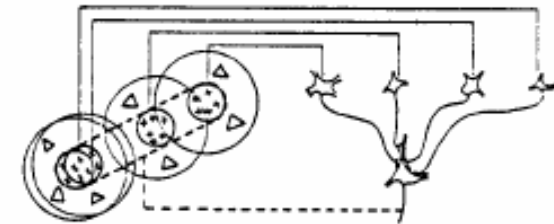
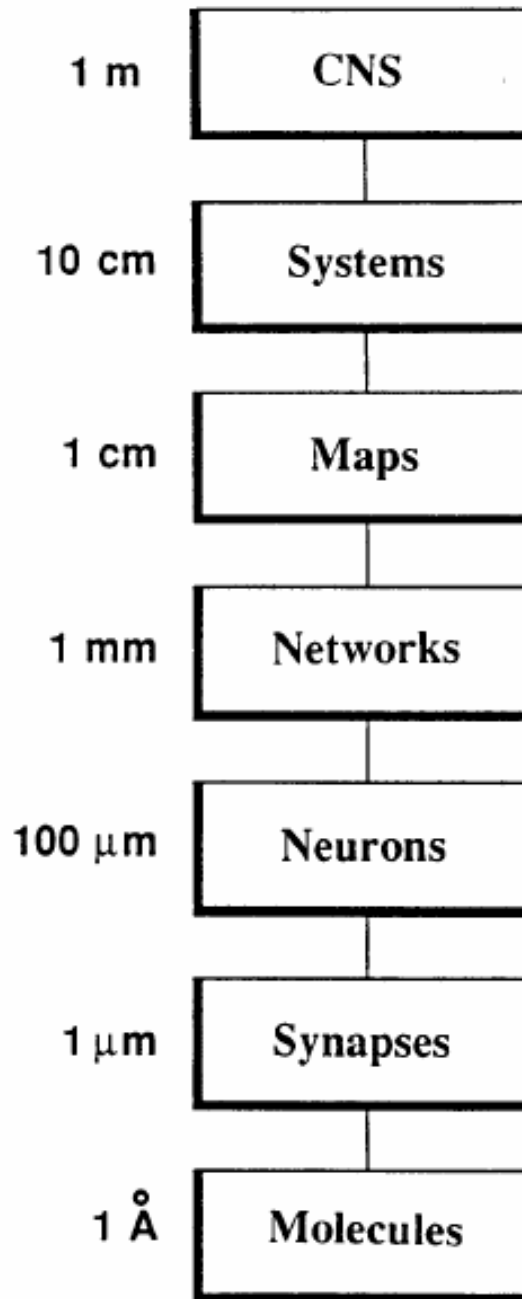
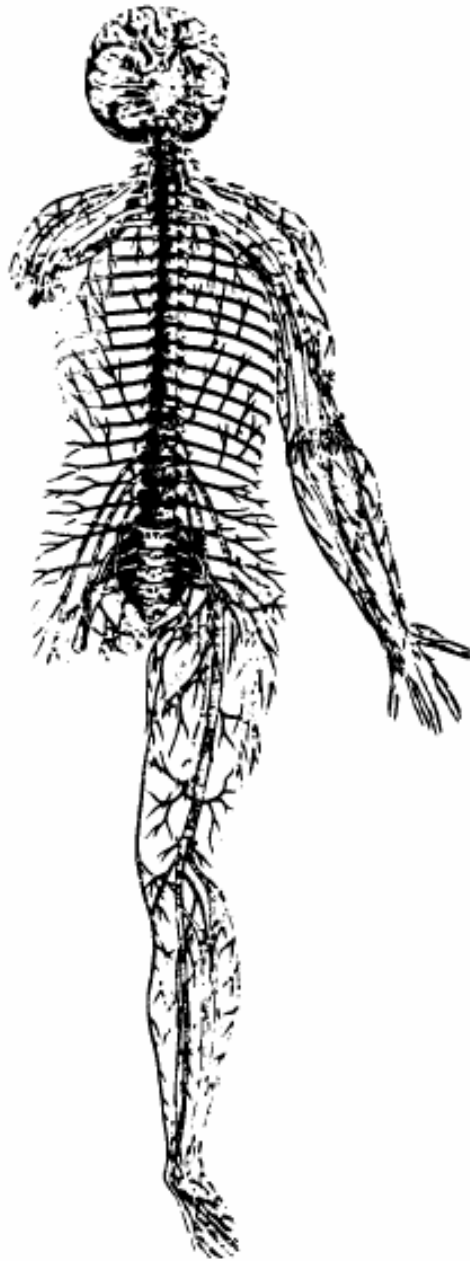
MASSIVE CONNECTIVITY



SYNAPSES



source: David Sheinberg





From what part of
the brain should
we record?