



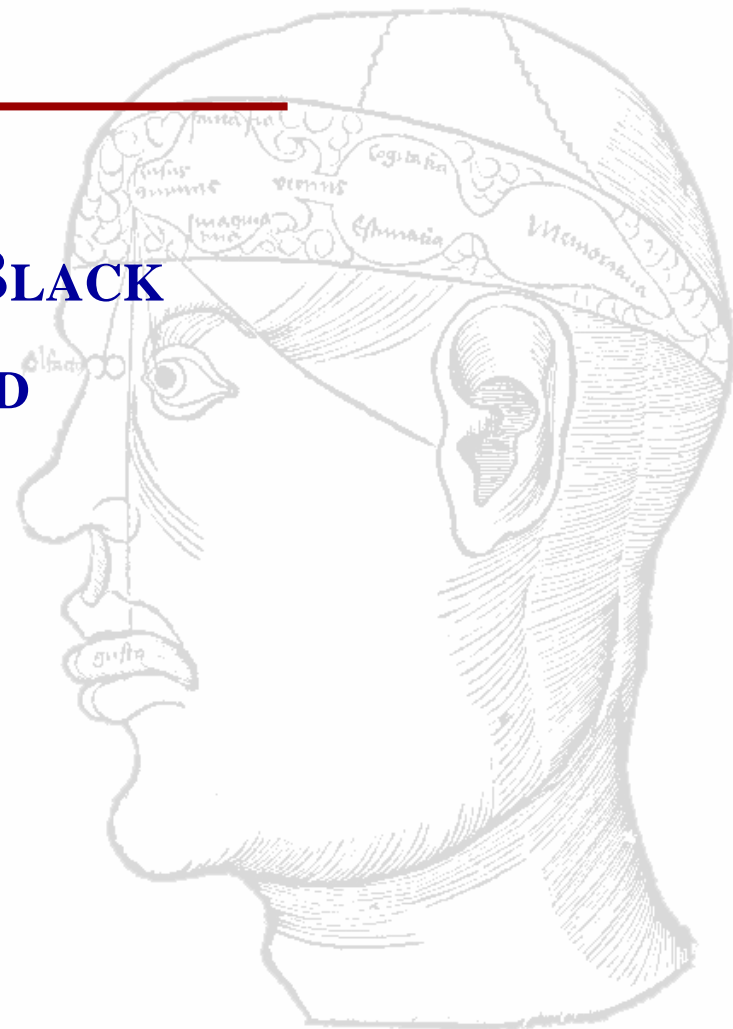
Topics in Brain Computer Interfaces

CS295-7

Professor: **MICHAEL BLACK**

TA: **FRANK WOOD**

Spring 2005



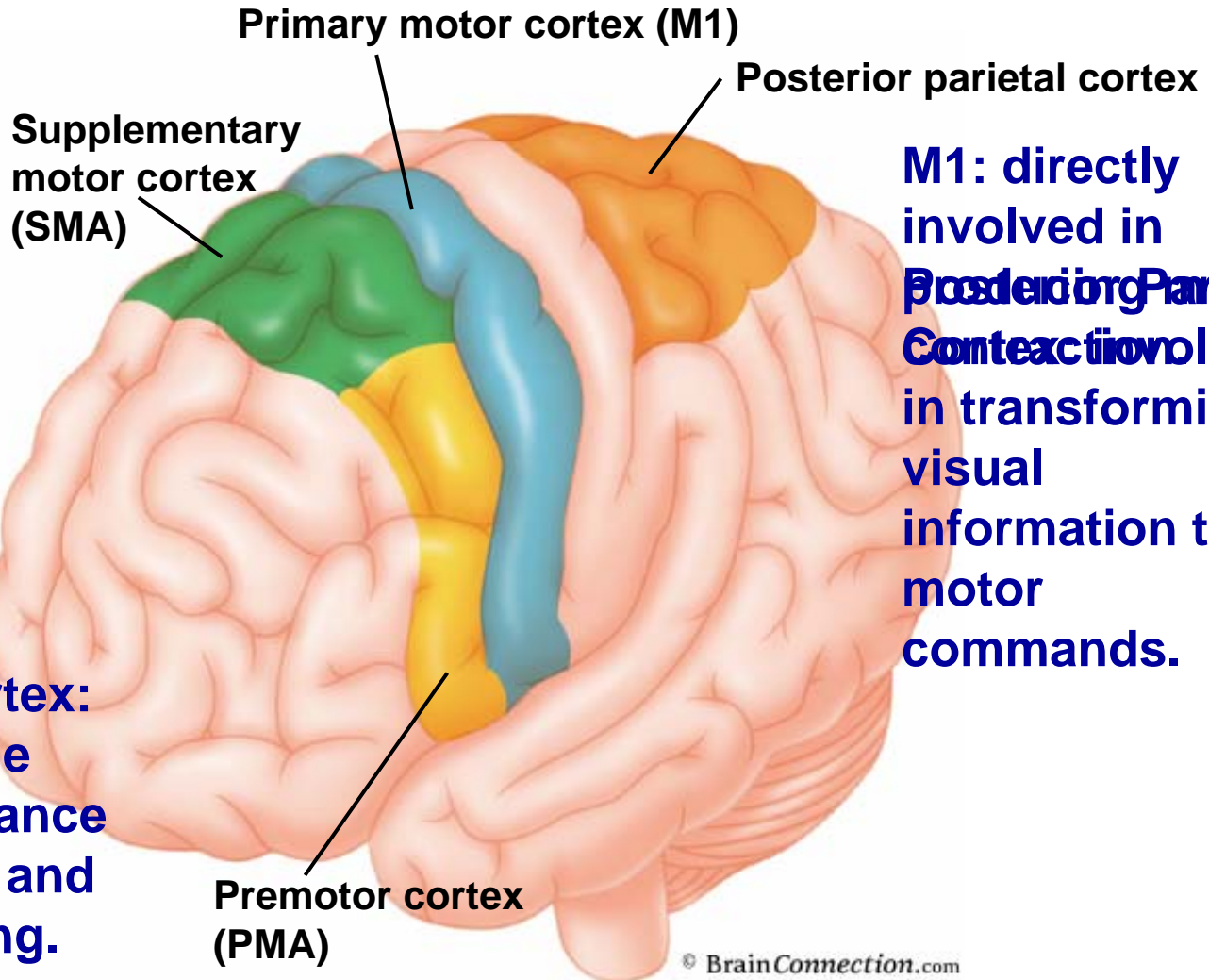


From what part of
the brain should
we record?



Motor Systems

SMA:
involved in
the planning
of complex
movements
and in two-
handed
movements.



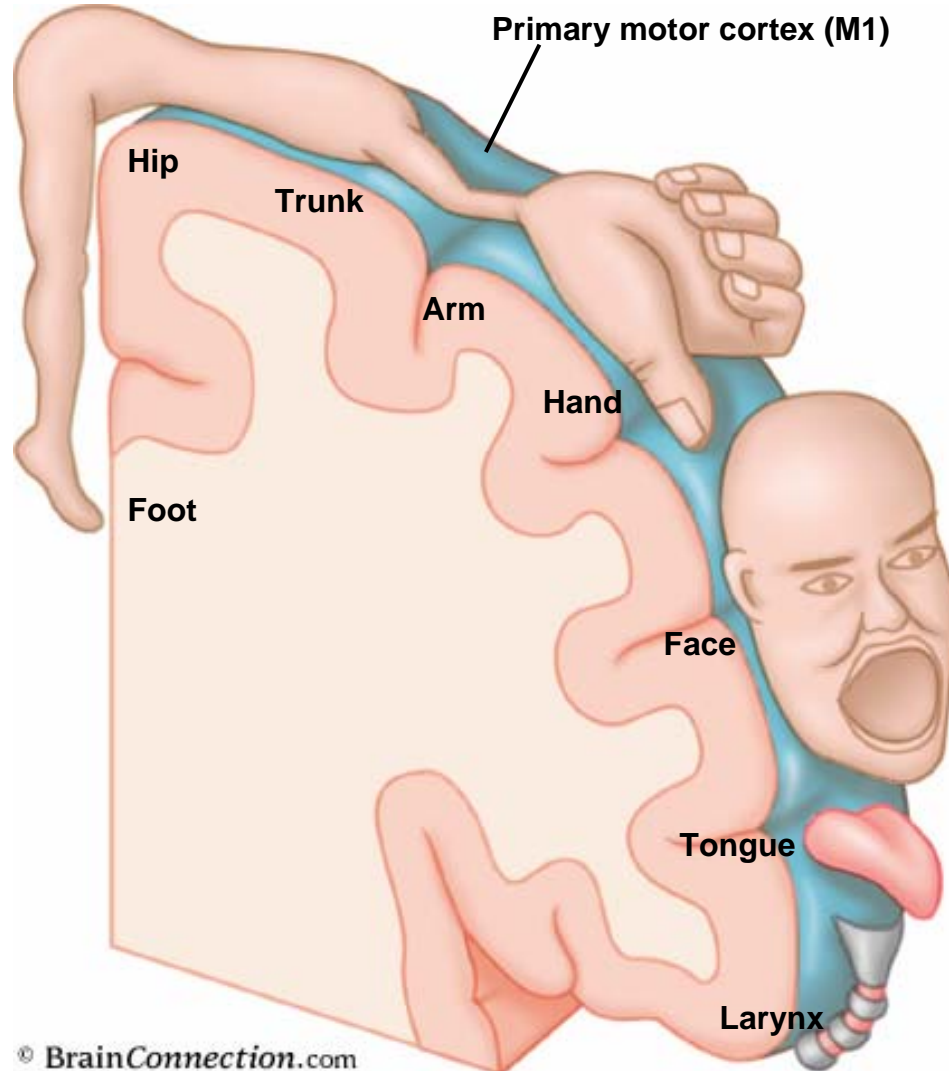
M1: directly involved in
Posterior Parietal Cortex
involved in transforming visual information to motor commands.

Premotor Cortex:
involved in the sensory guidance of movement and motor planning.

© BrainConnection.com



Motor System



© BrainConnection.com



What is represented?

Using wrist and fingers

Parkinson's Disease Clinic
King's College Hospital
A

Using elbow as fulcrum

Parkinson's Disease Clinic
King's College Hospital
B

Using shoulder as fulcrum (outstretched arm)

Parkinson's Disease Clinic
King's College Hospital
C



Signing Your Name

Prefrontal Cortex: I'll sign my name.

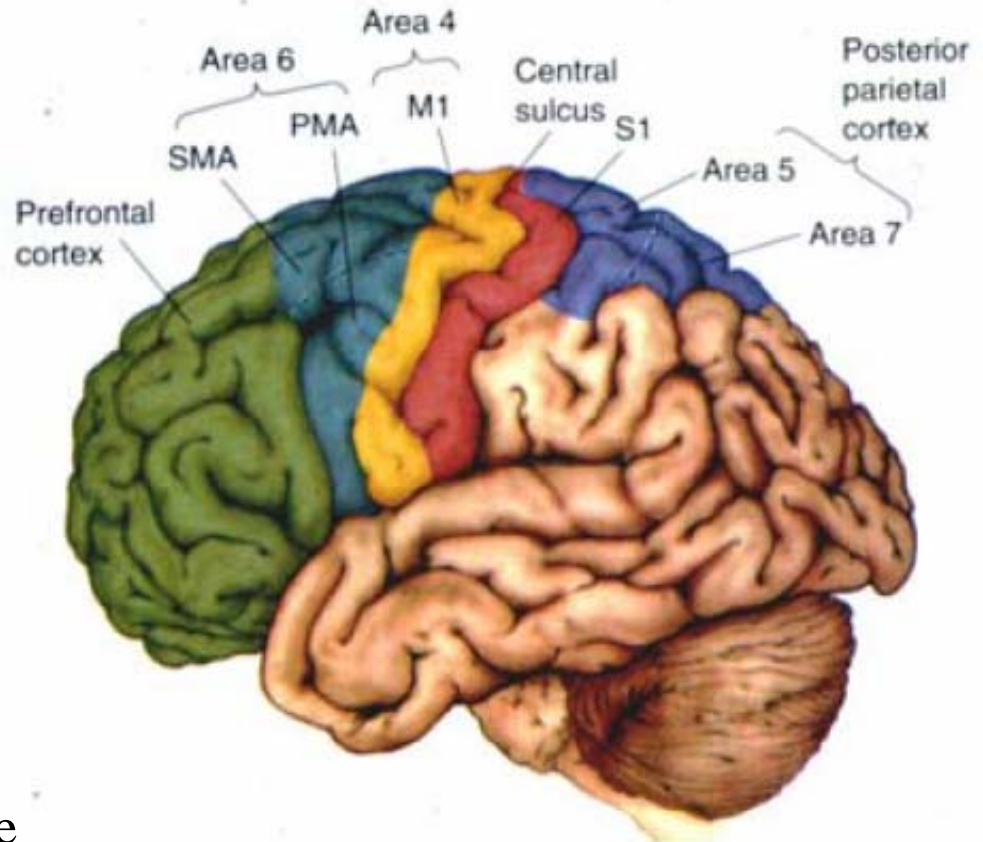
Posterior Parietal: combine visual and somatosensory information to localize pen wrt body.

Premotor cortex: plan motion of hand wrt target path.

Cerebellum: formulate details of movement in terms of dynamics.

Primary Motor Cortex: sends motor commands down spinal cord.

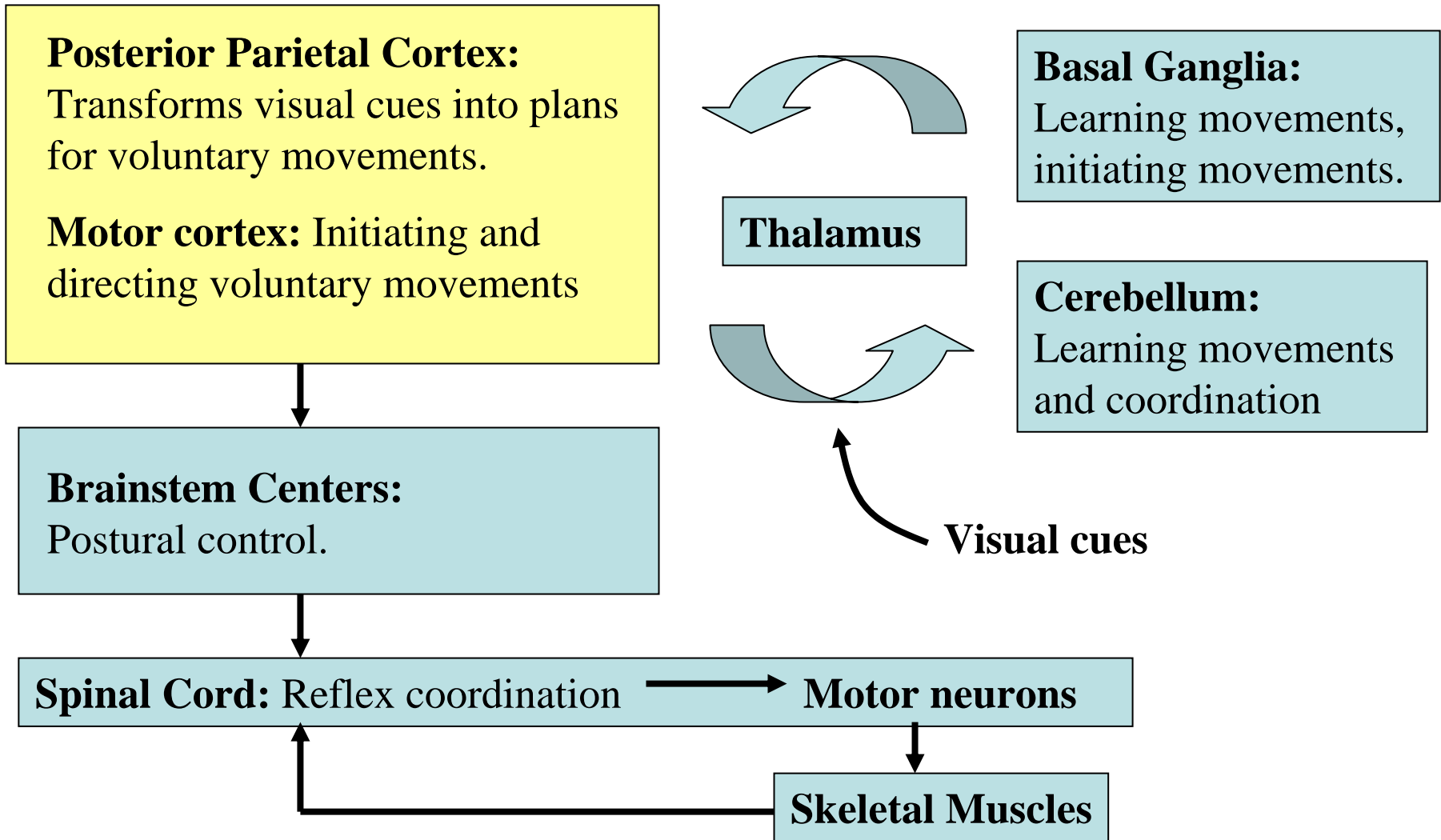
Brain Stem maintains stable posture during writing.



Purves D. et al. (1997)

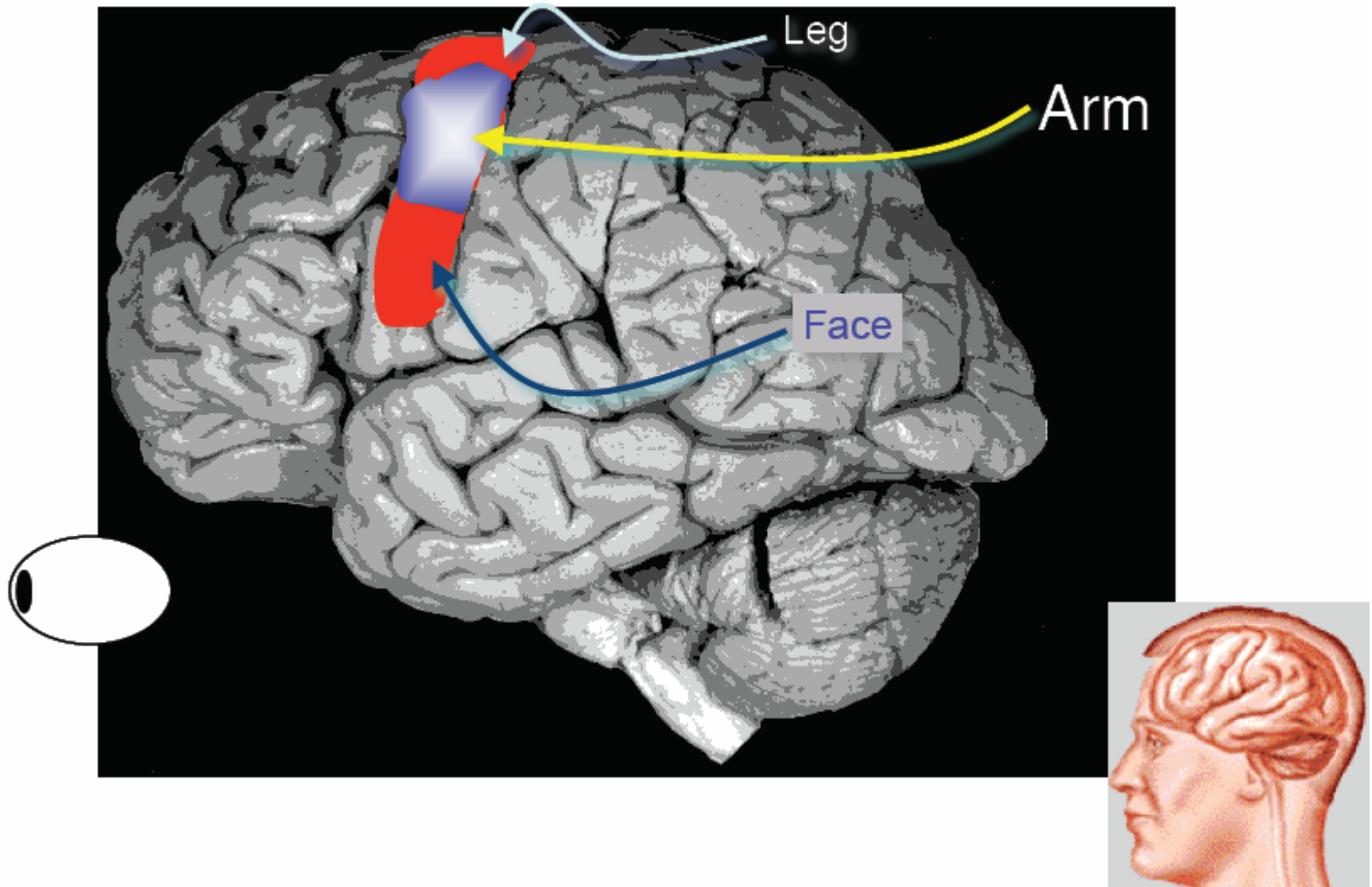


Summary





Motor Control

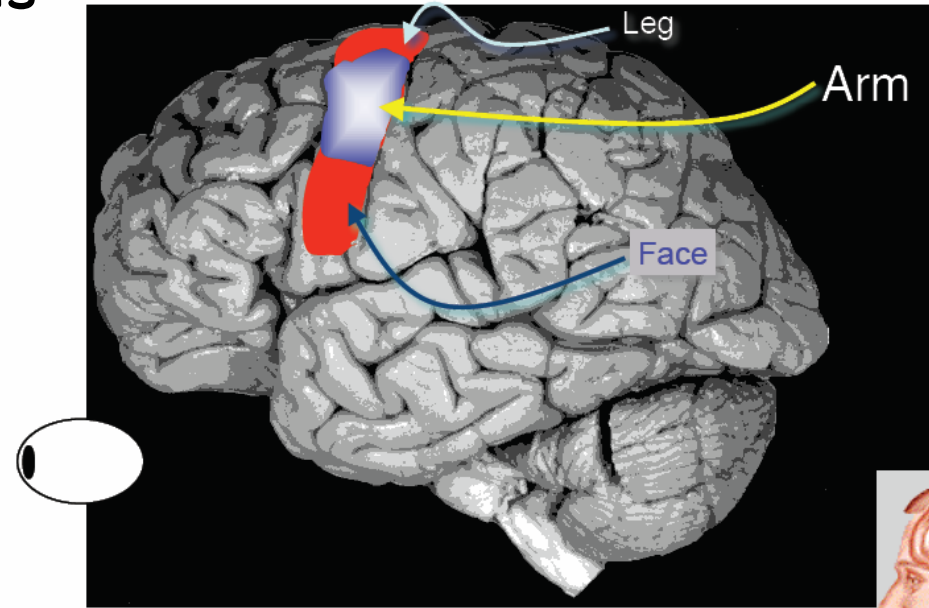




Controlling a Motor Prosthesis

MI arm area of motor cortex.

- * know that activity of cells **related to hand motion**
- * **accessible** (in monkeys and humans)
- * ***hypothesis***: natural for controlling continuous motion of a prosthesis



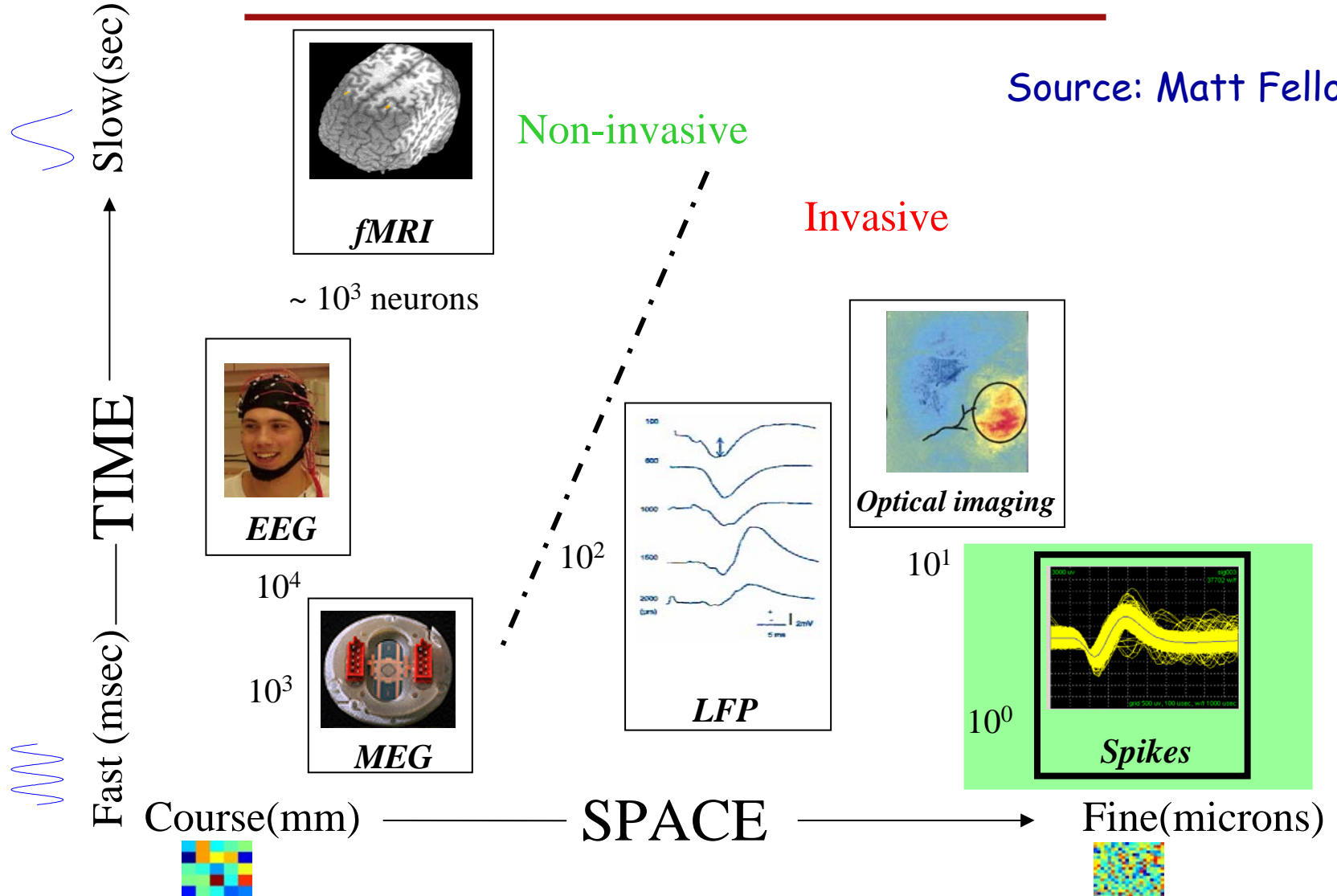


How can we **record** the neural signals?



Sensing the Brain

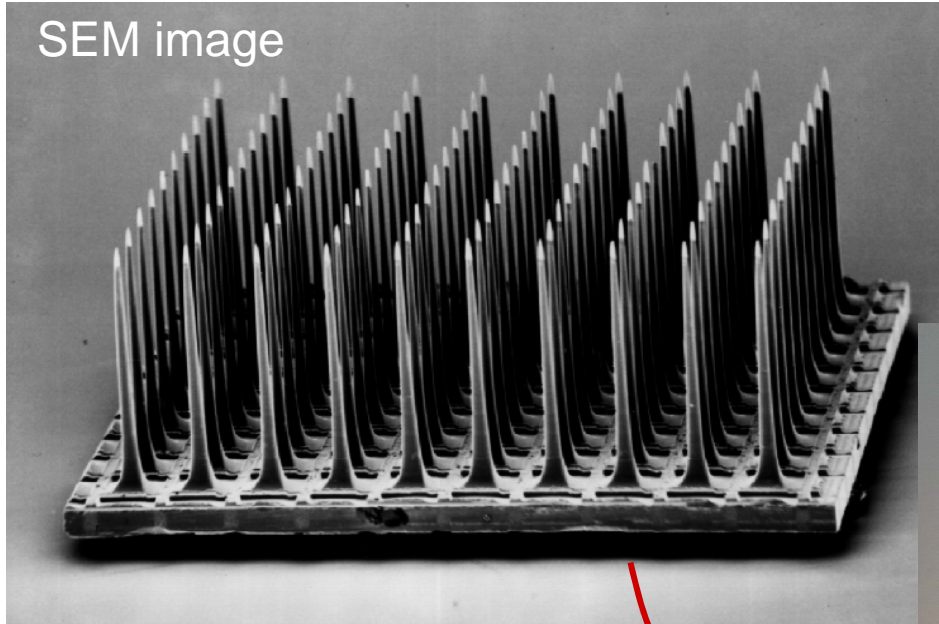
Source: Matt Fellows





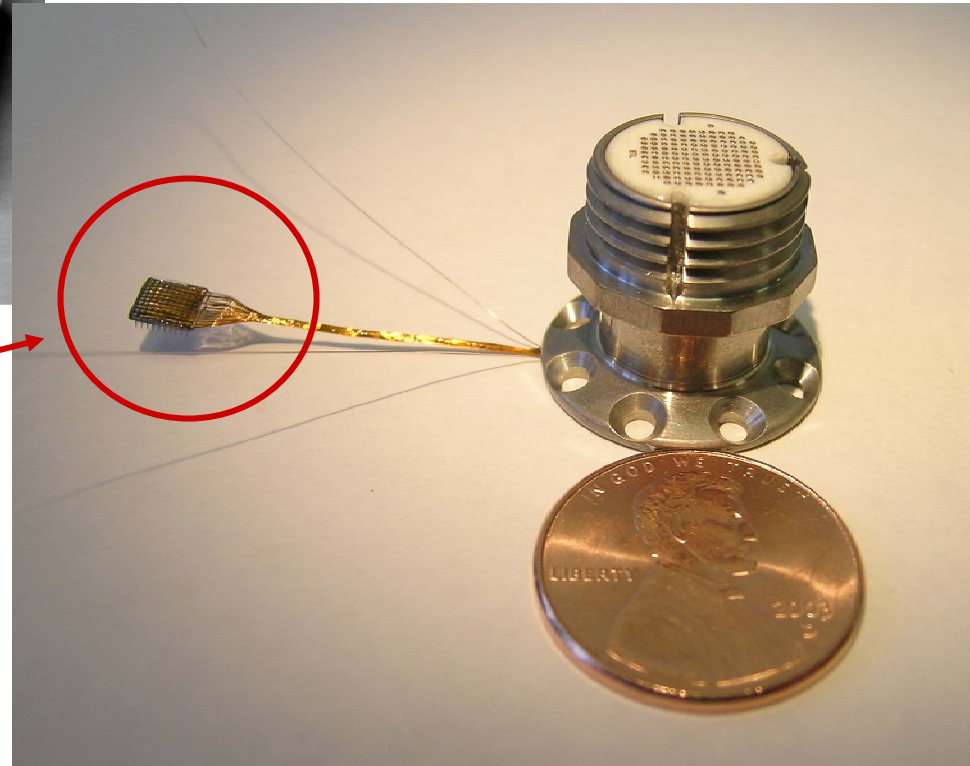
Cyberkinetics Array

SEM image



100 "ideal" microelectrodes
10x10 grid,
4x4 mm platform
1 or 1.5 mm long, Si shafts,
Pt coated tips
Glass separation
Parylene insulation coating

Extra-cellular recording





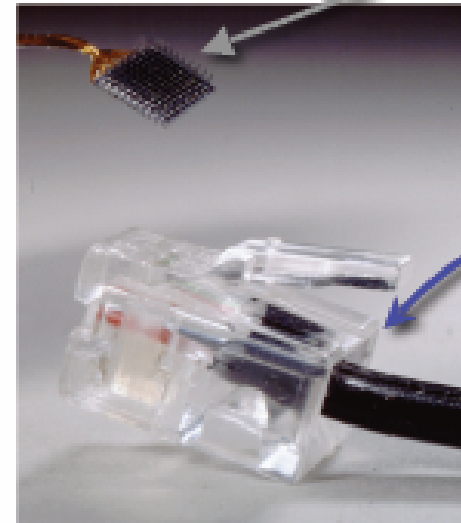
Array

Utah = Bionic =
Cyberkinetics array.

Fixed electrode depths
- can't move them to
get a better signal.
Take what you get and
make the most of it.

Inventor: Richard Normann, Univ. of Utah.

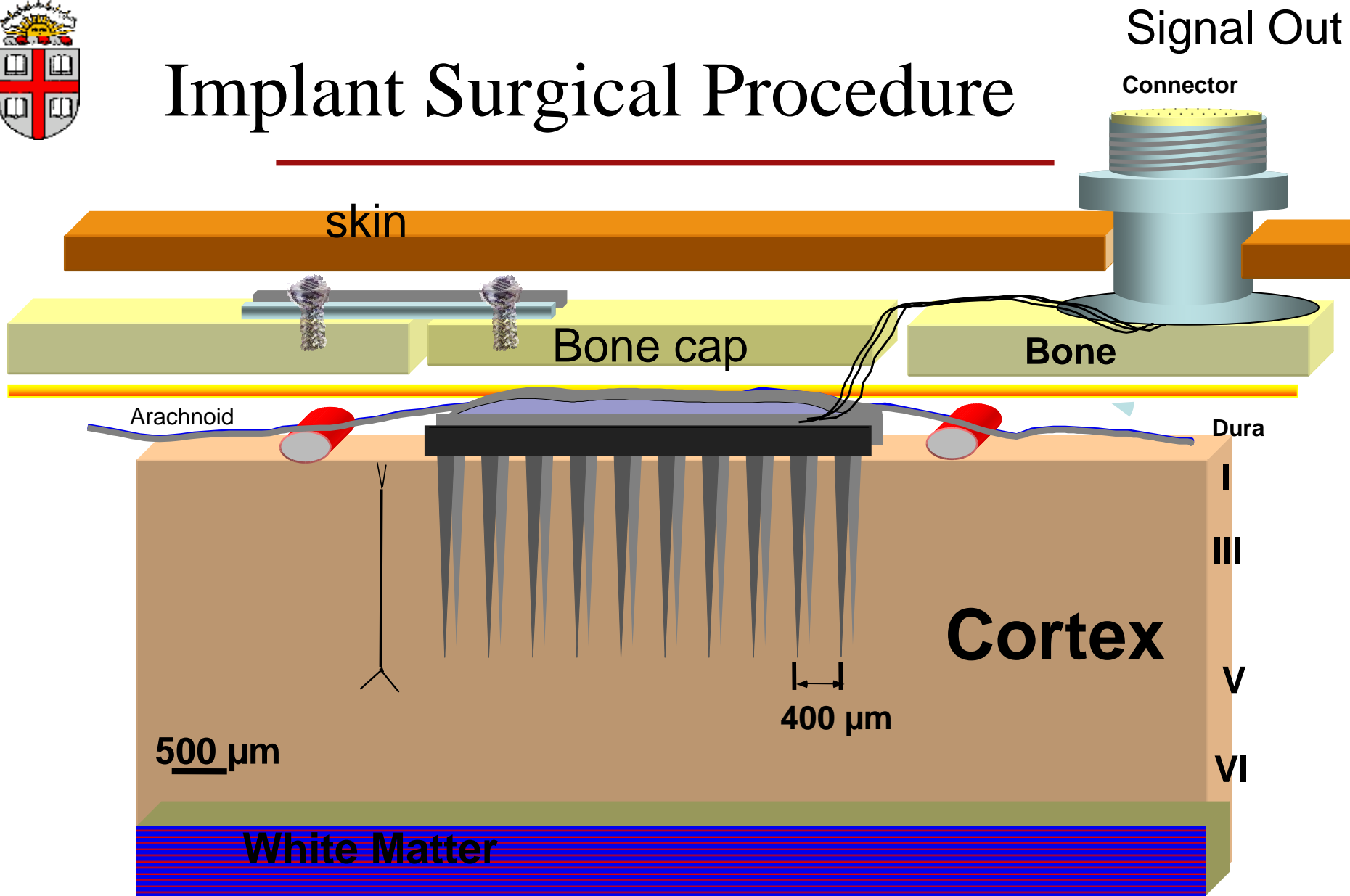
Array: platform
with 100 Hair
thin probes



Phone
jack



Implant Surgical Procedure



J. Donoghue 1/2001



Surgical Implantation

WARNING:
Graphic images of surgical
procedure follow.

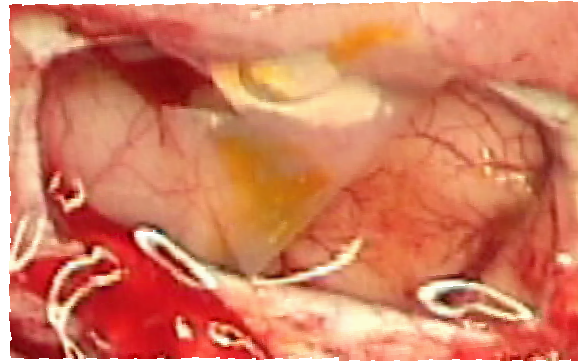


Preclinical Safety: Removal and Re-implantation

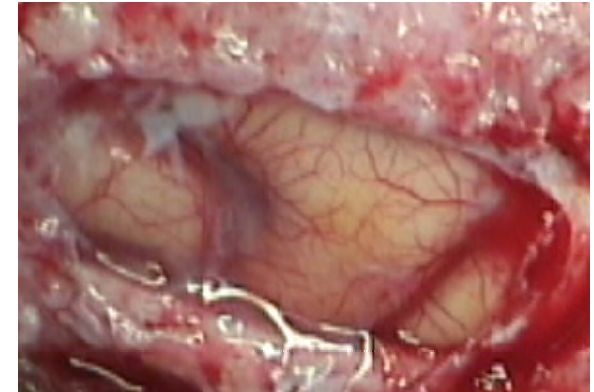
First Implant



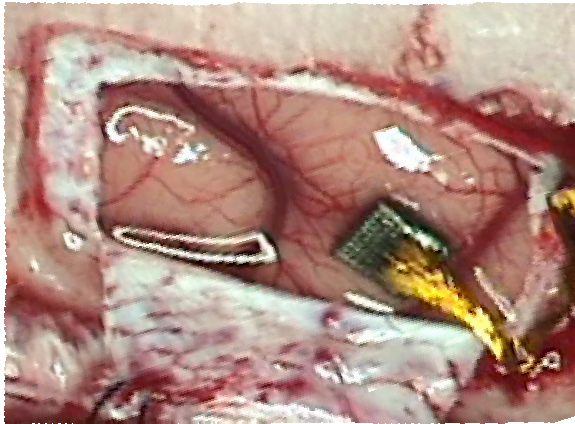
Explant



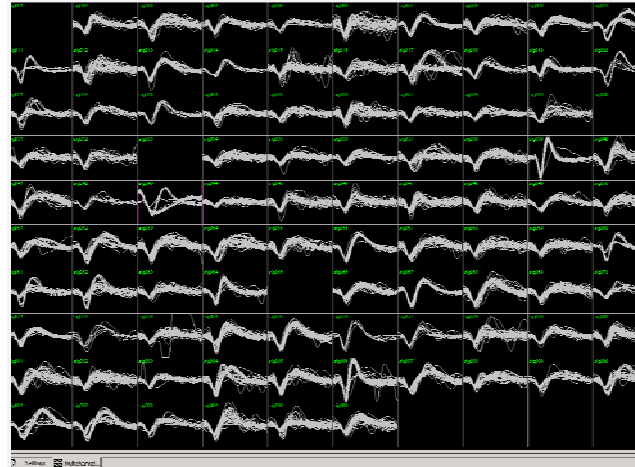
Second Implant



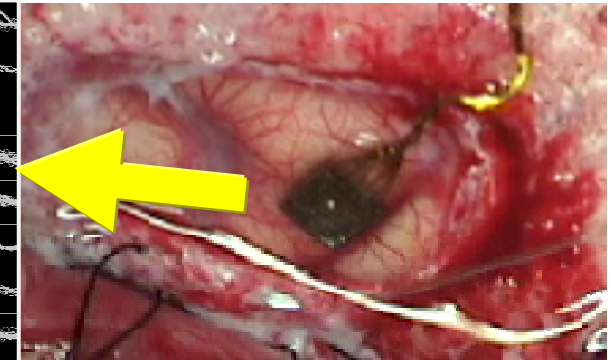
F1 Original Implant



F2 + 4 wks Removed



F3 +3 months

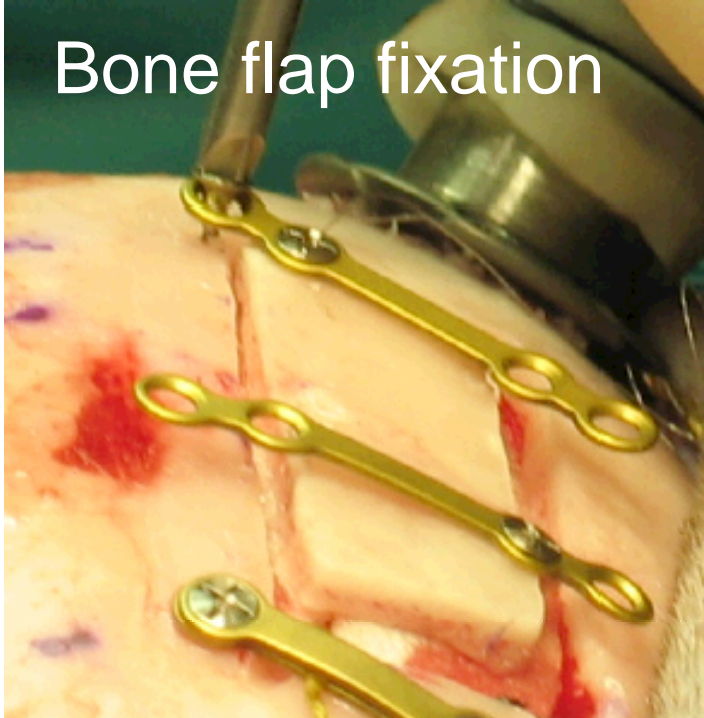


Donoghue Lab



Surgical Methods

Bone flap fixation



Skin closure

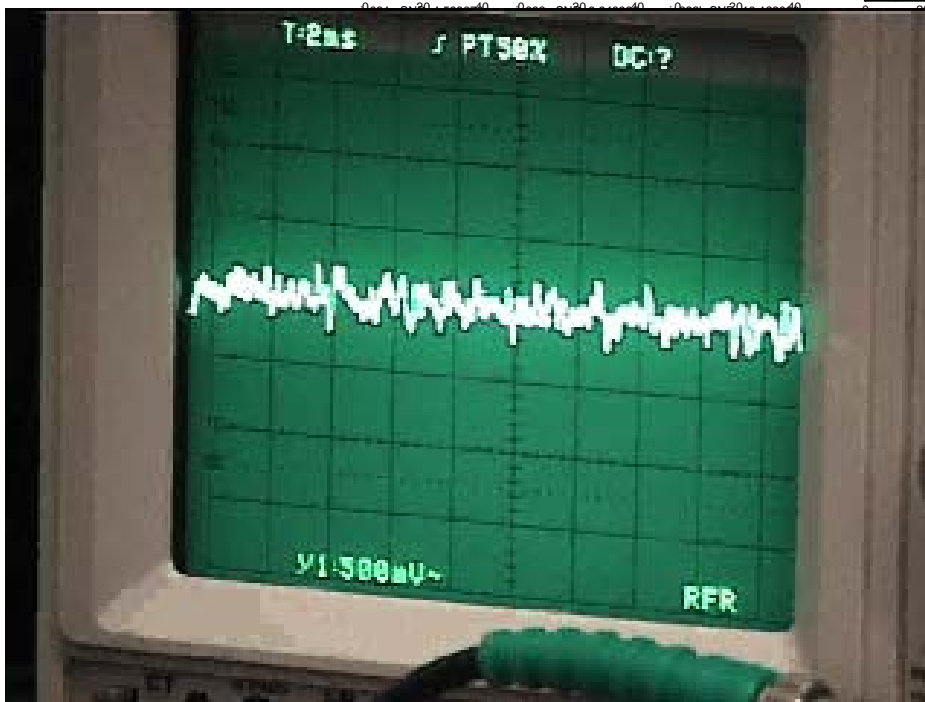
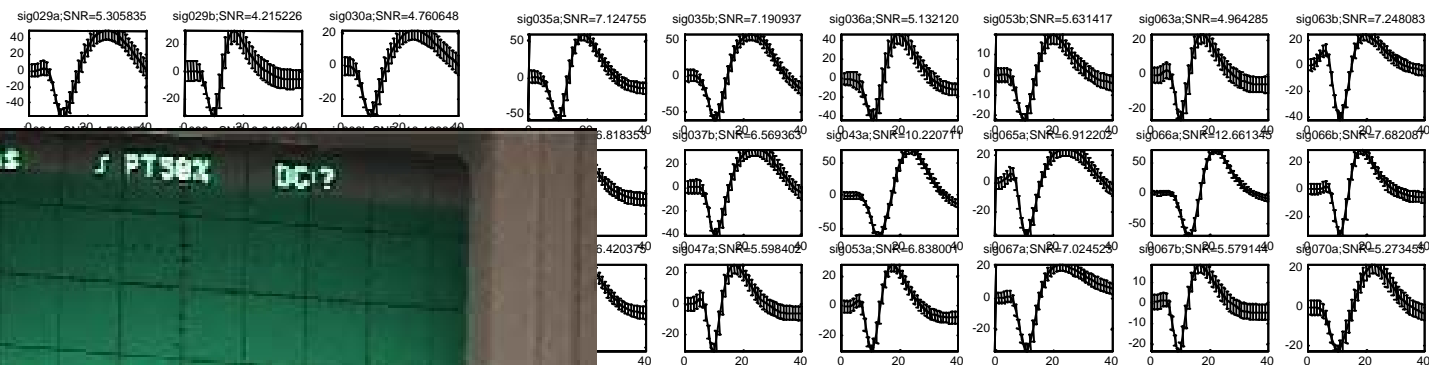
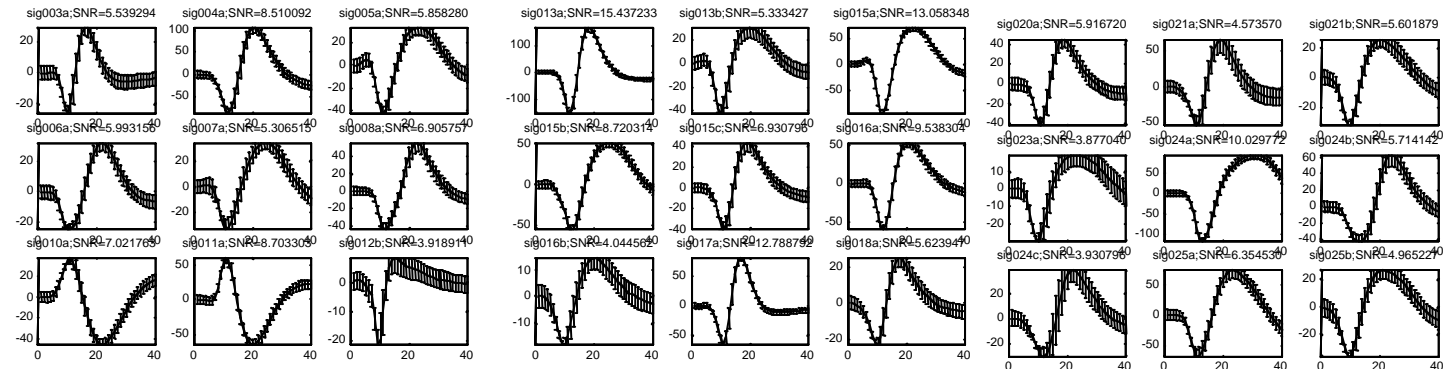


Intended to follow human neurosurgical procedures and methods.

- Limit duration
- Eliminate most foreign materials
- use established surgical methods

Percutaneous Connector



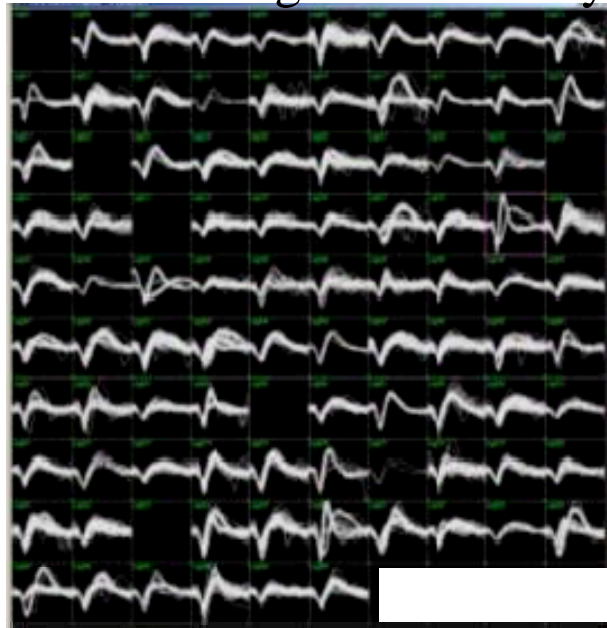


Recorded waveforms



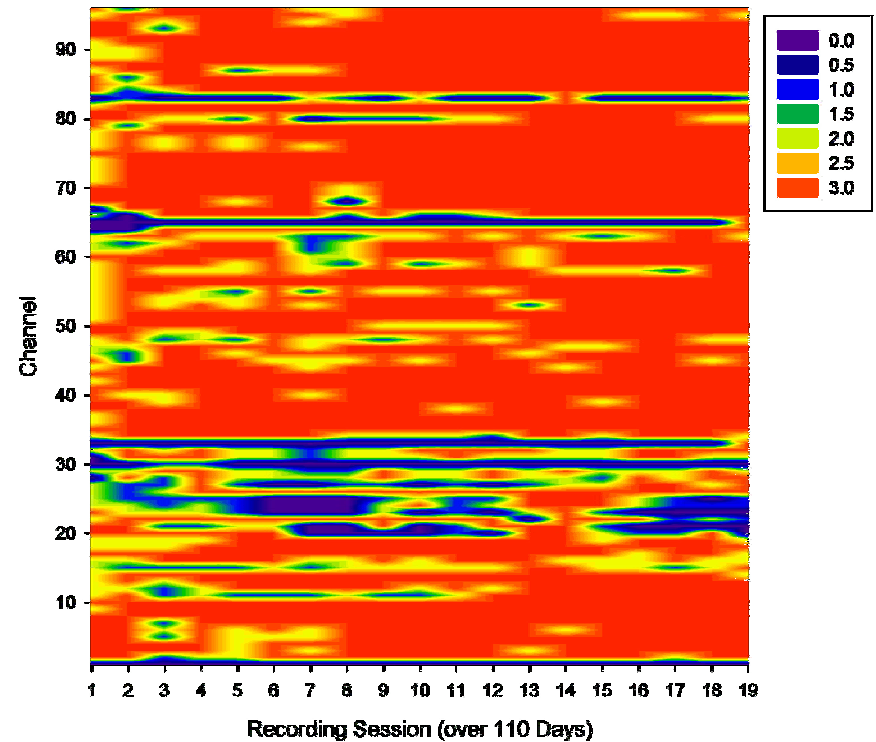
Chronic Implants

- * 39 implants in 17 macaque monkeys
(February 1996-April 2003)
- * Recordings for 1098 days



$n = 80 \pm 7$ in
3 recent MI implants

From: Selim Suner



Many neurons every day (19 tests over 110 days)

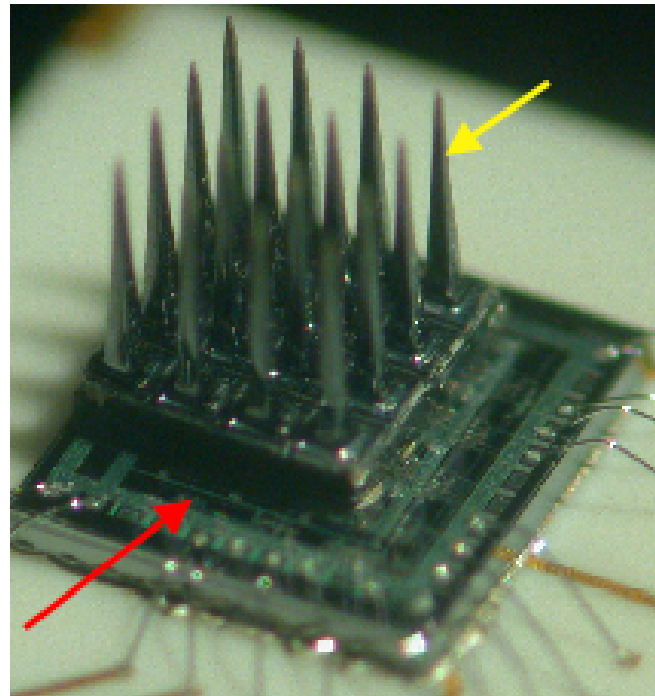
Blue - no recording
Red - best recordings

Donoghue Lab



Implant Challenges

- Electronics
 - Miniaturization
 - Encapsulation
 - Telemetry
 - Heat dissipation
 - Low power
 - On board signal processing and spike sorting



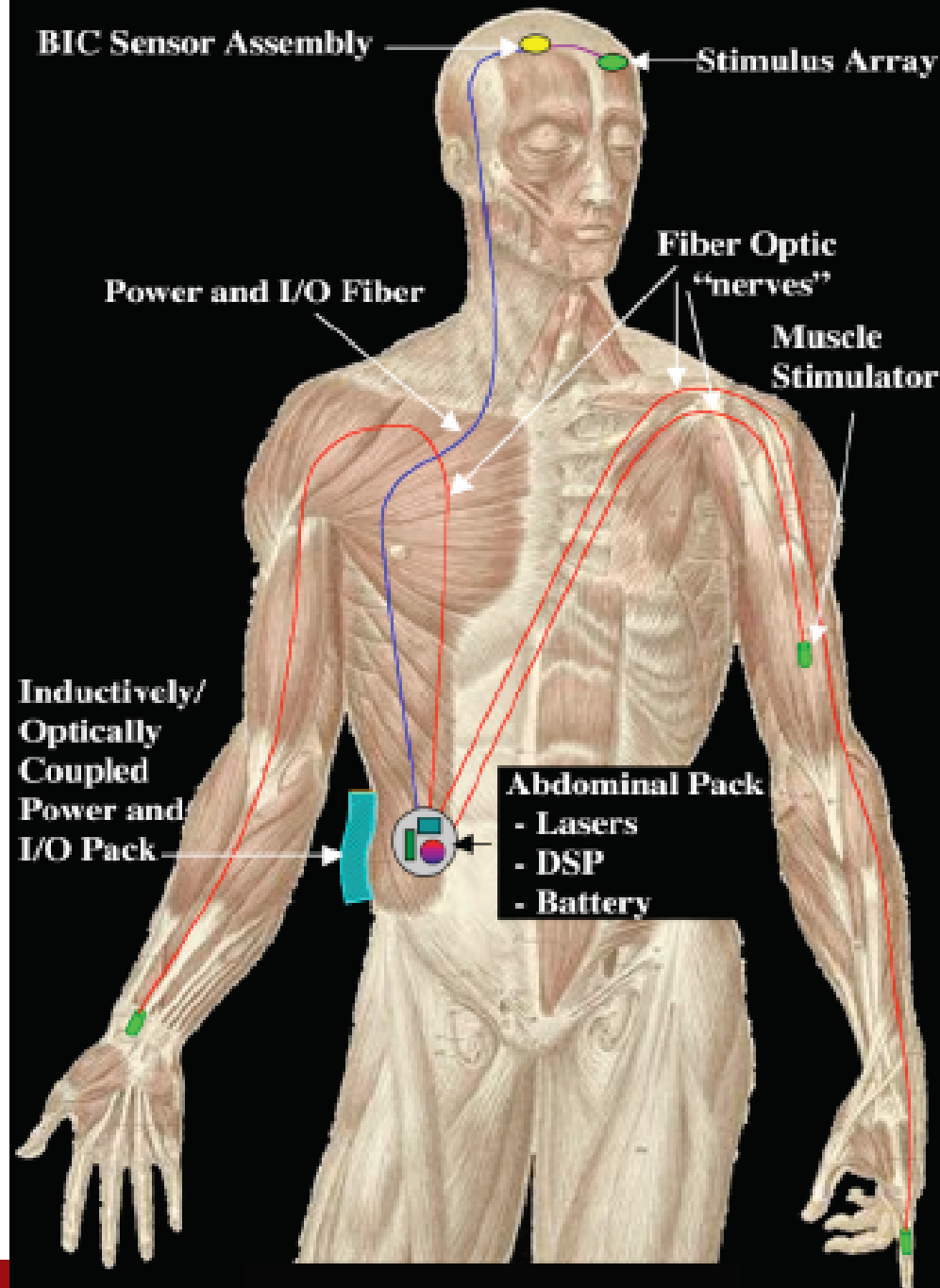
Nurmikko and Patterson

Chip-scale integration of array and electronics.



Long term vision

Nurmikko and Patterson



Integrated Microelectrode Array
with Ultralow Power Preamplifiers,
Multiplexer, and Buffer (~10 mW)

Photovoltaic Power
Supply, ADC, Clock
Circuits, VCSEL
(laser), etc.



Skin

Bone

CORTEX

Tether cable
(minimal)

Optical fiber: (laser light)
• Power/Clock Input
• Signal out (> 1 Gb/s)

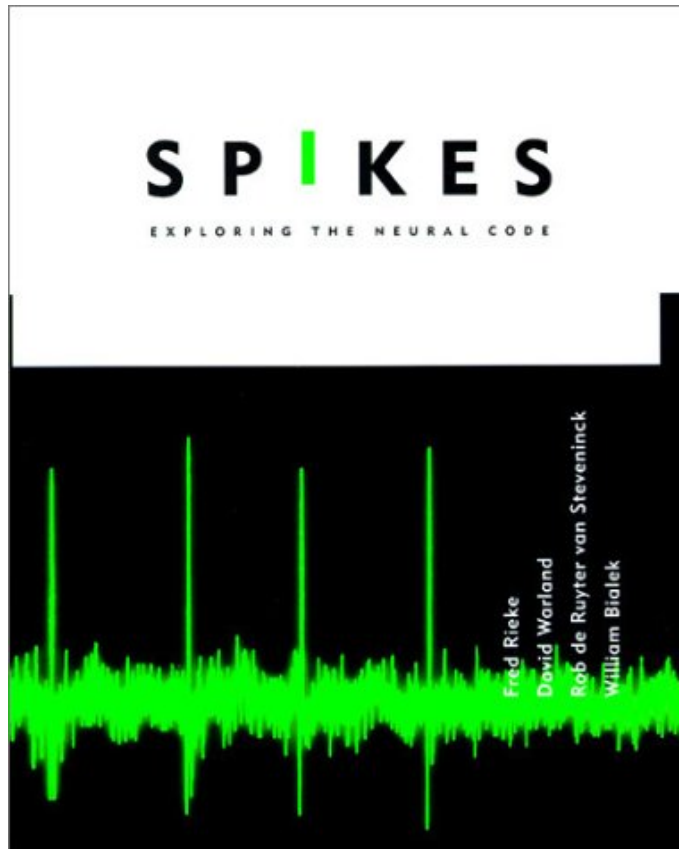
• OK also with other telemetries



What do the
neural signals
encode?



Language of the Brain



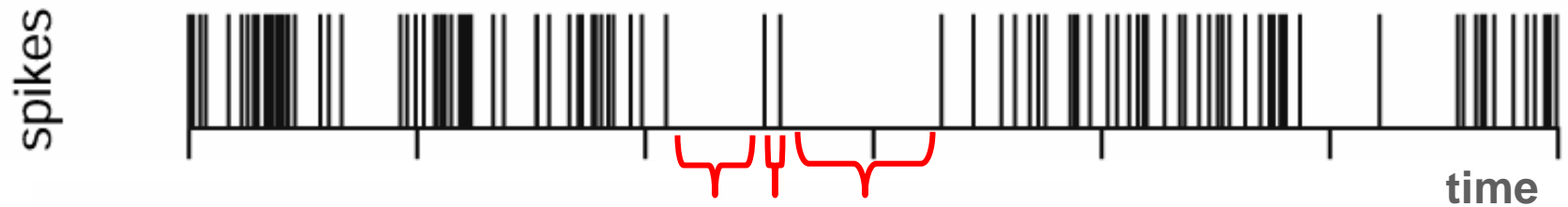
“If spikes are the language of the brain, we would like to be provide a dictionary... perhaps even providing the analog of a thesaurus.”

Rieke, et al 1997.

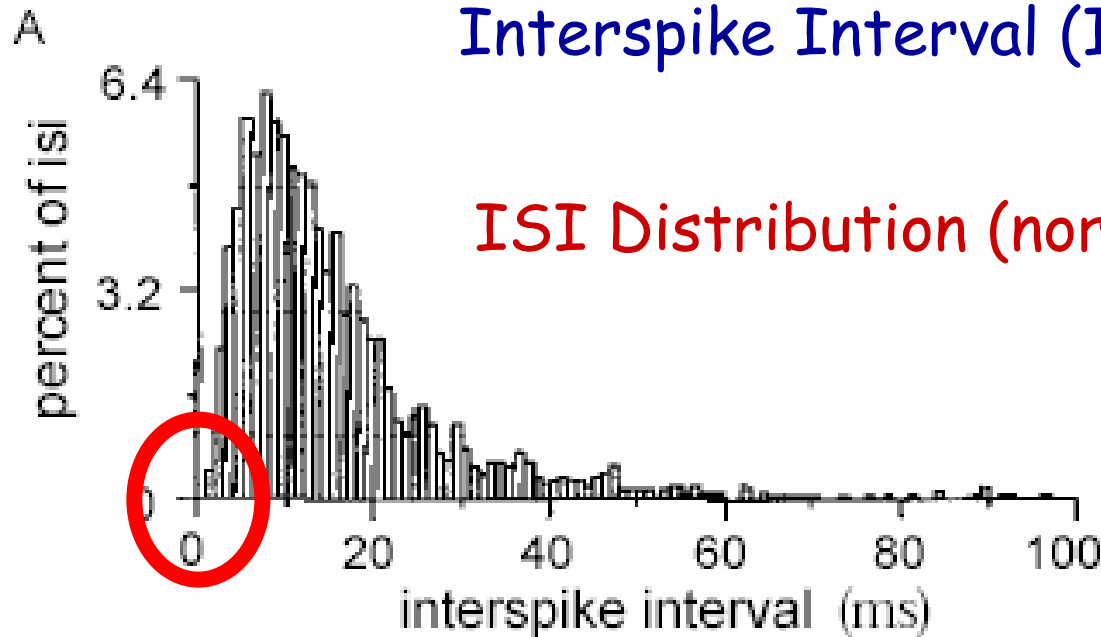


Some Terminology

Sequence of spikes from a single neuron = "spike train"



Interspike Interval (ISI)



ISI Distribution (normalized histogram)



Neural “Coding”

- How do cells represent information?
 - ie, how is representation “coded” in action potentials.

- If we understand the encoding then we can tackle the “decoding” problem.
 - inference – from activity to encoded property



Neural Coding

What are the possibilities?

You've got action potentials and now you want to represent "move the hand to the right". How might you do it?



Neural Coding

What are the possibilities?

1. Localist encoding in on/off response .
2. Rate coding.
3. Precise timing – pattern of spiking carries information.
4. Ensembles code information that individuals can't.
5. Synchronous firing within and across ensembles (it is the interdependencies that matter).



Neural Coding

- **Localist** view – each neuron codes a particular value
 - “computer”-like model where neurons are binary
 - at the low level cells represent things like orientation
 - at the high level they represent complex information
- Problems?



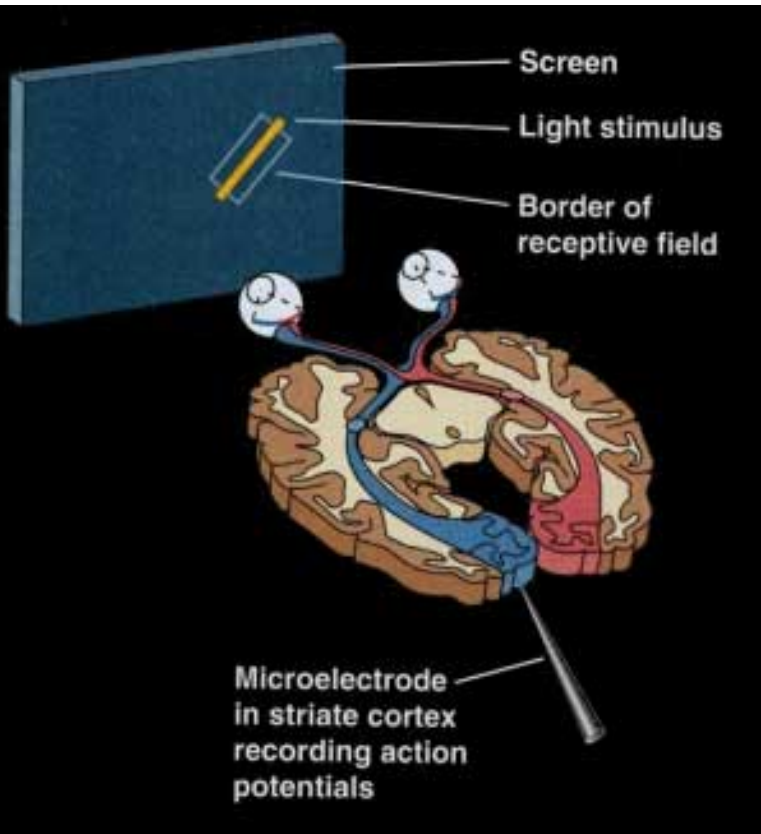
Neural Coding

Population codes

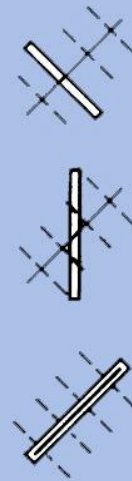
- distributed representation
- information encoded in the overall activity of many cells
- graded response – level of activity conveys information. Not binary.



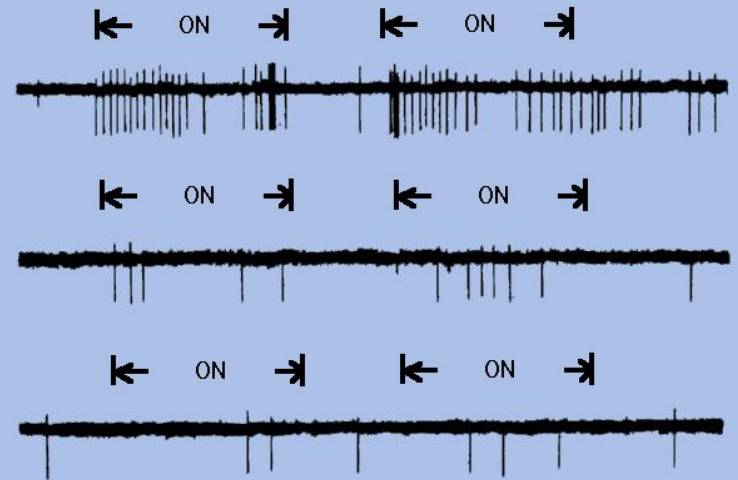
Orientation Selectivity



Stimulus



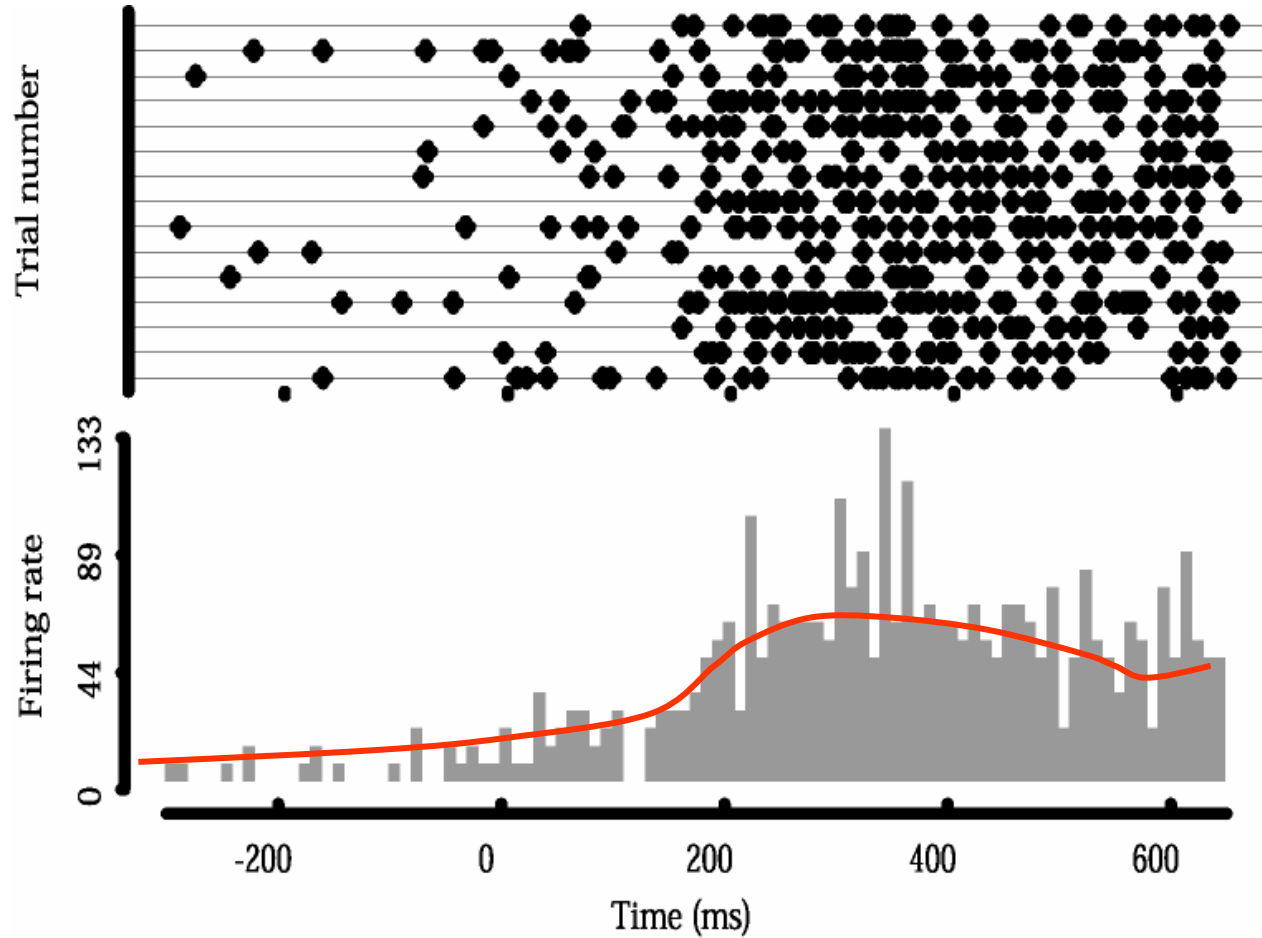
Output from cell



Hubel & Weisel, 1962



Cracking the Neural Code

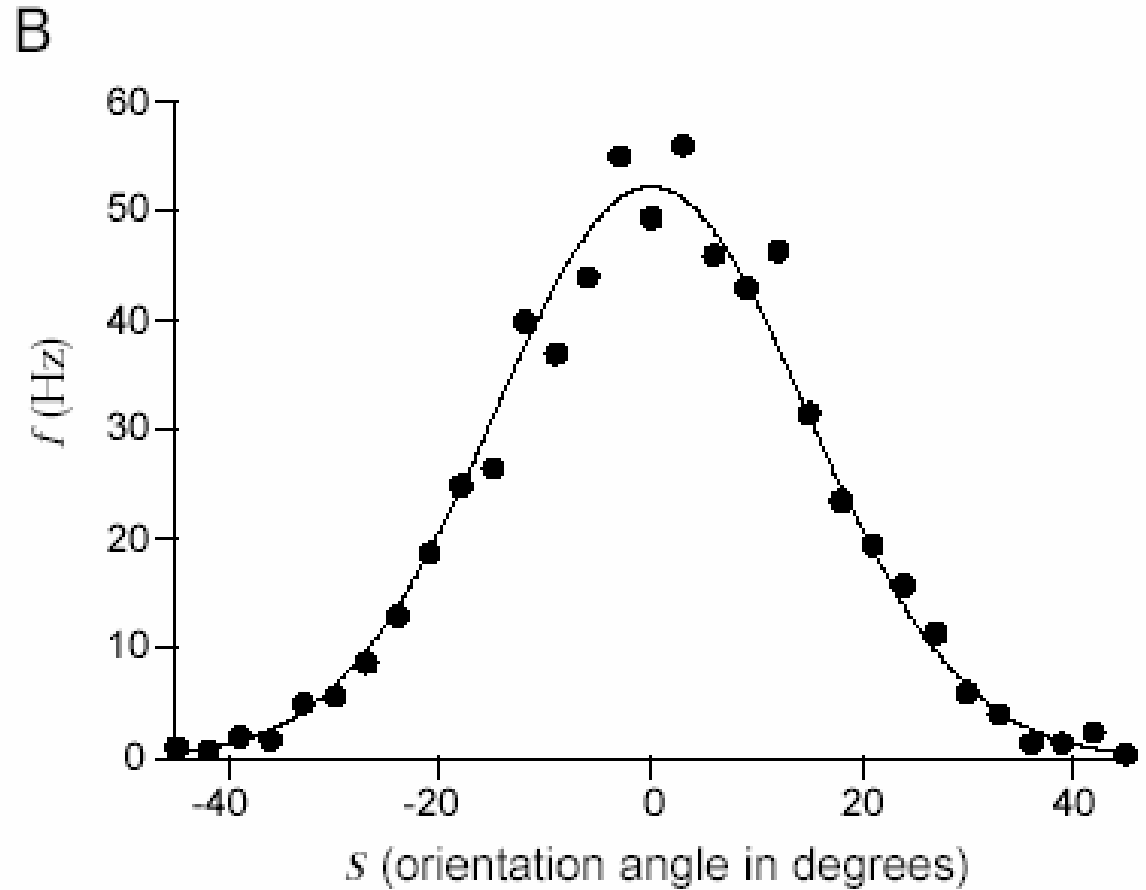
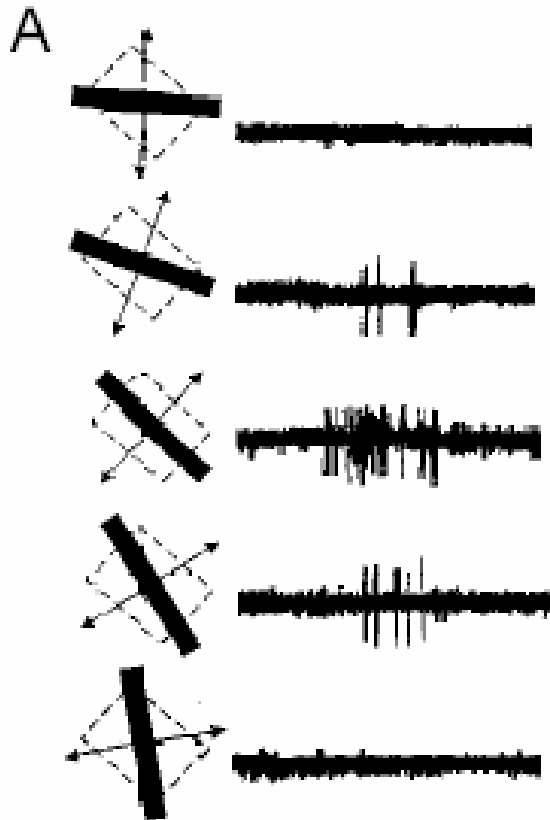


"rasters"

Source: Rob Kass

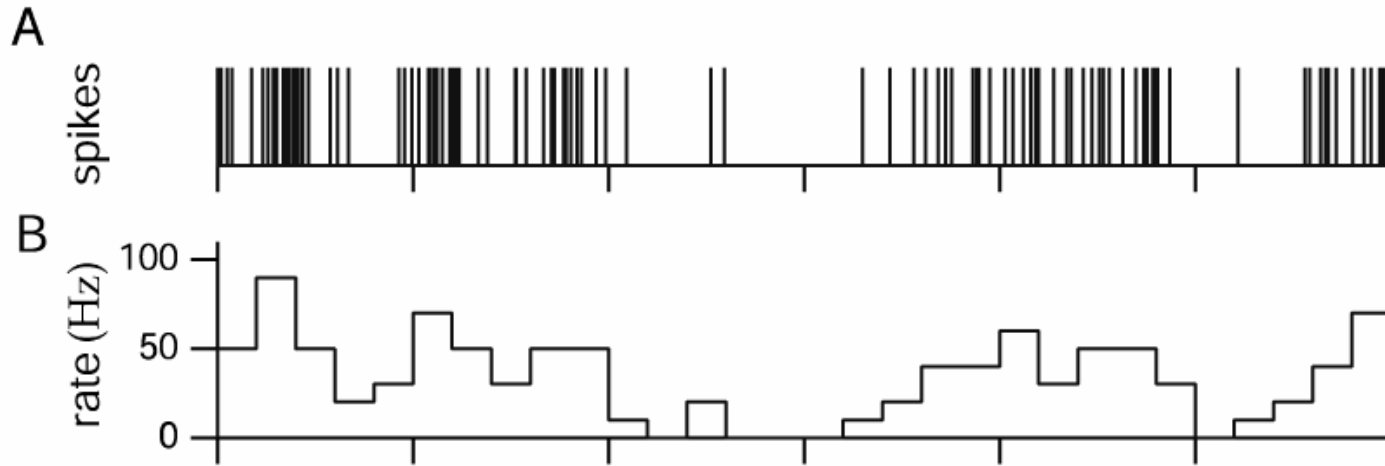


Orientation Tuning





Estimating Firing Rate



Source: Zemel & McNaughton, NIPS2000 tutorial

$$\text{rate} = (\# \text{ of spikes in time bin}) / (\text{length of time bin})$$

Related to the probability a cell will spike (fire) in a given time interval.

Typically consider 50-70ms time bins.