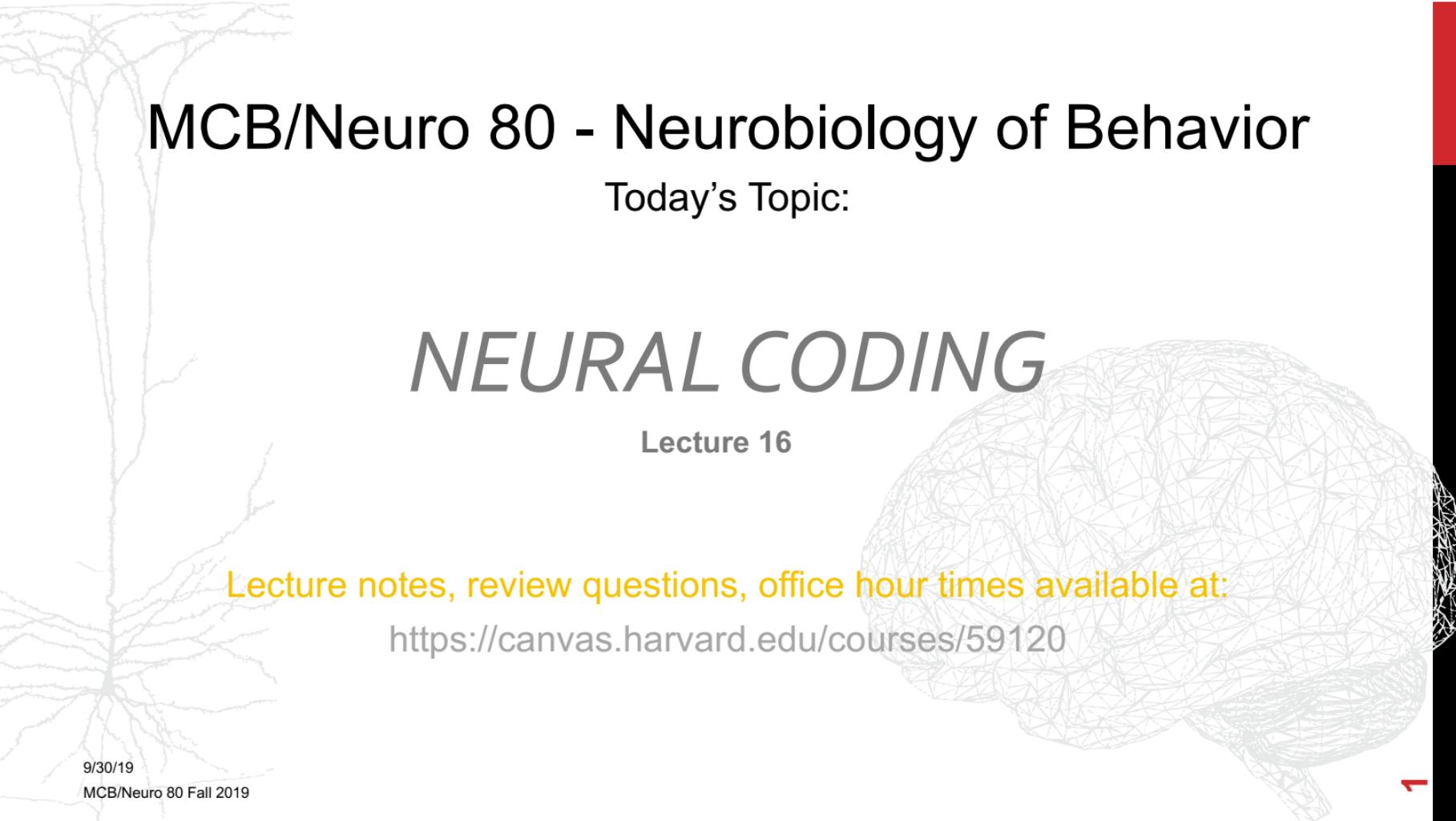


Nervo 80 Lecture 16

Oct 30, 2019



MCB/Neuro 80 - Neurobiology of Behavior

Today's Topic:

NEURAL CODING

Lecture 16

Lecture notes, review questions, office hour times available at:

<https://canvas.harvard.edu/courses/59120>

CLIMBING MT. POTENTIAL (IN PRACTICE)



Response

Sensory/motor diseases
Upper Motor
Spinal Circuits

Neuronal processing

Cognition
Structural changes and aging
Long term synaptic plasticity
Memory systems

Stimulus (sensing information)

Information Coding
Other Senses
Visual system:
• Sensory transduction
• Visual circuits
• Cortical visual processing

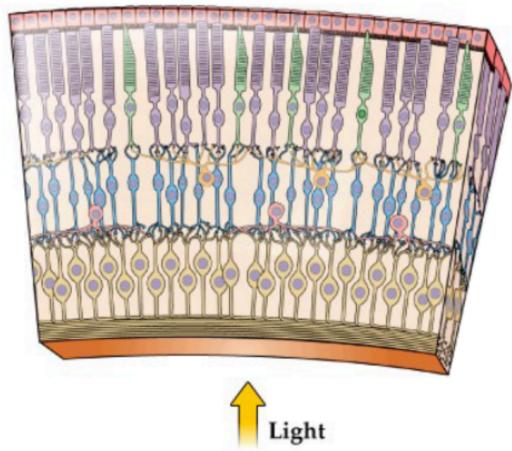
What is neural code?

How information is represented in the activity of neurons

“Encoding” concerns how information (e.g. orientation) is encoded in spikes

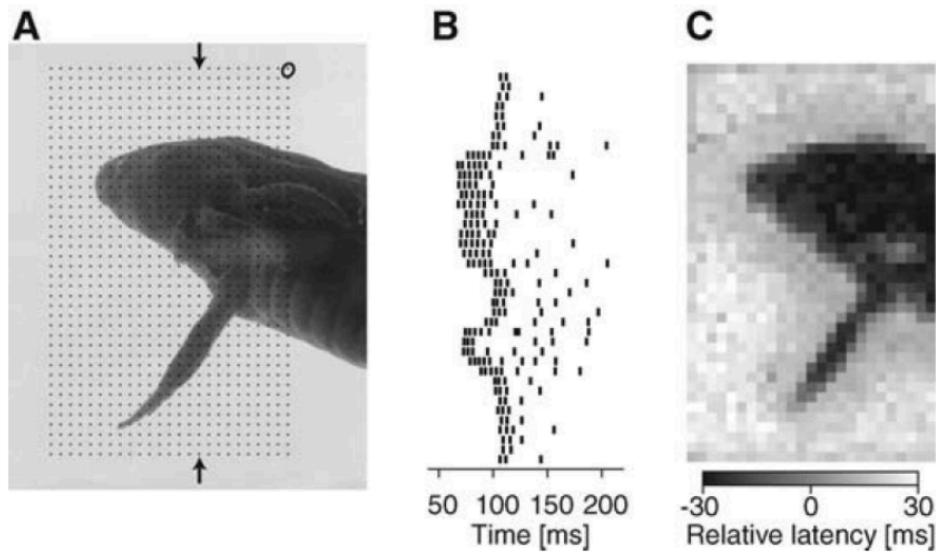
A code only makes sense if someone/something is “decoding” it

How is an image represented in the activity of neurons?



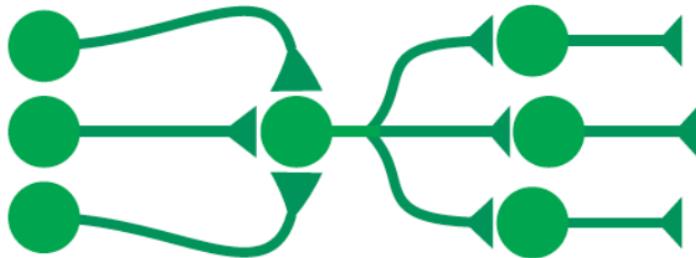
When an image moves over the retina, different RGCs fire at different times

Together, their spatial + temporal firing patterns can be used to reconstruct the stimulus



Circuit motifs

Convergence/divergence



One postsynaptic cell receives convergent input from many different presynaptic cells

An individual neuron can make divergent connections to many different postsynaptic cells

What is the purpose?

Circuit motifs

Feedback/recurrence

Feedforward excitation



A Presynaptic cell excites
a postsynaptic cell

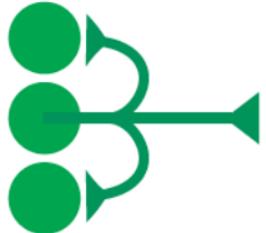
Feedback excitation



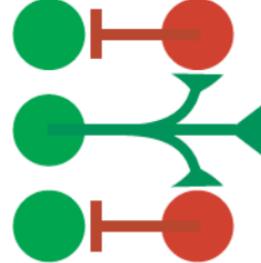
A presynaptic cell connects to a
postsynaptic cell, and the postsynaptic
cell in turn excites presynaptic cell

Circuit motifs

Lateral excitation



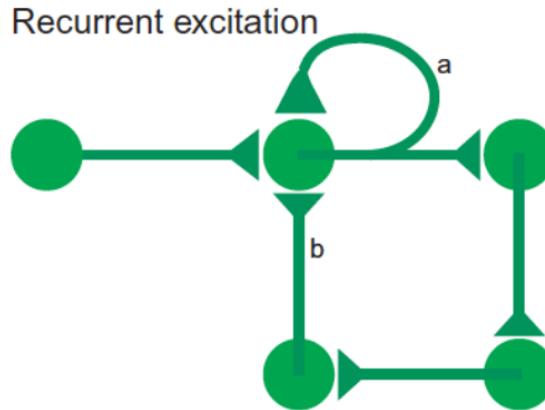
Lateral inhibition



A presynaptic cell excites neighboring cells in the network

A presynaptic cell excites inhibitory interneurons and they inhibit neighboring cells in the network

Circuit motifs



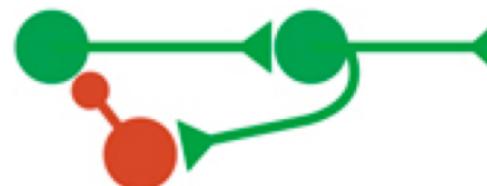
A variant of feedback excitation in which a presynaptic neuron excites a postsynaptic neuron that can feedback to excite itself (a) or other neurons which ultimately feedback (b) to itself.

Feedback vs. feedforward inhibition

Feedforward Inhibition



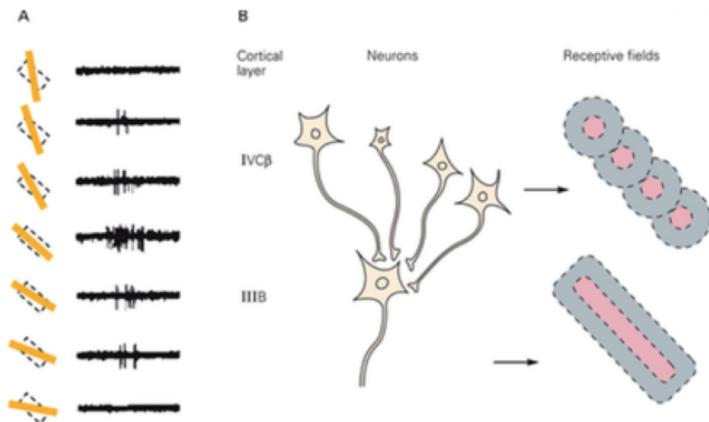
Feedback Inhibition



A presynaptic cell excites an inhibitory interneuron which inhibits the postsynaptic cell

a presynaptic cell connects to a postsynaptic cell, and the postsynaptic cell in turn connects to an interneuron, which then inhibits the presynaptic cell

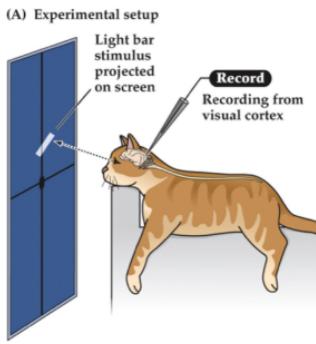
How neural circuits create receptive fields



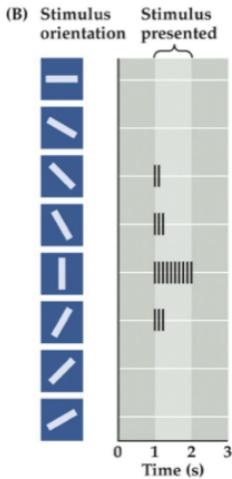
Cells prefer lines going in a specific direction “simple cells”

Elongated ON or OFF area flanked with antagonistic surround

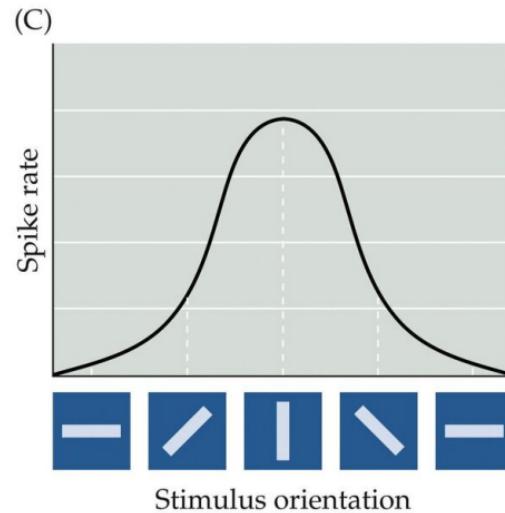
Orientation tuning in the visual cortex



NEUROSCIENCE 6e, Figure 12.8 (Part 1)
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NEUROSCIENCE 6e, Figure 12.8 (Part 2)
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NEUROSCIENCE 6e, Figure 12.6 (Part 3)
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Record from visual cortex

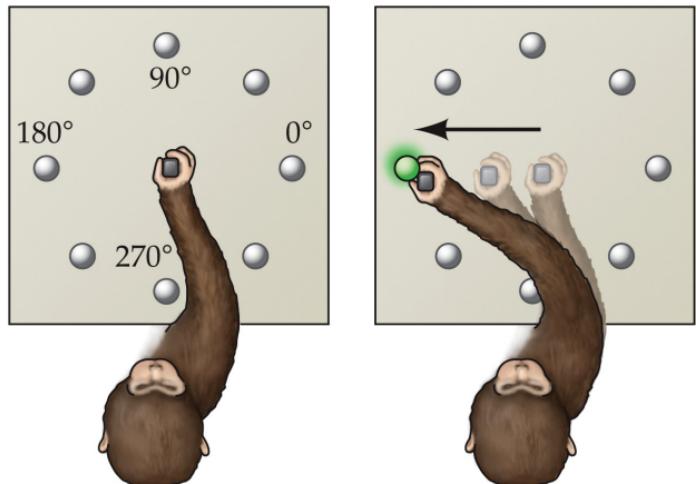
Stimulate with bars of different orientation on the screen

Measure spike rate (rate of action potentials) in neurons in visual cortex

Neural coding of movement parameters

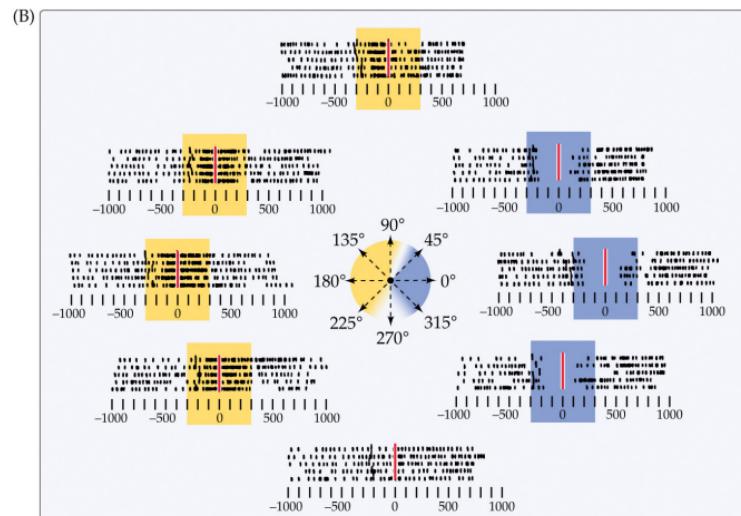
Neurons in motor cortex are tuned to different parameters of movement, including direction, velocity, joint angle etc.

(A)



NEUROSCIENCE 6e, Figure 17.8 (Part 1)
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(B)

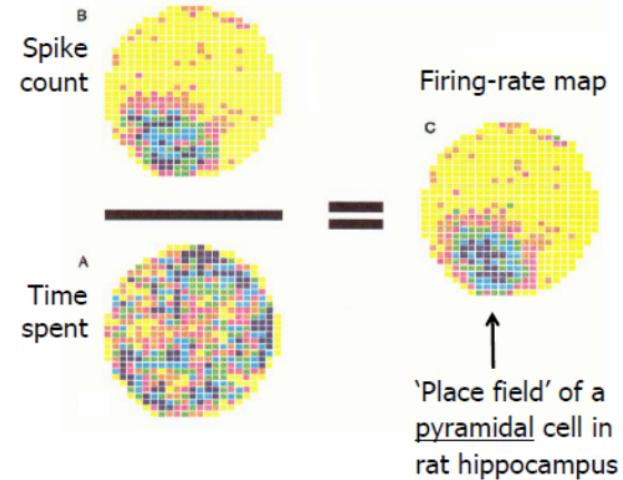
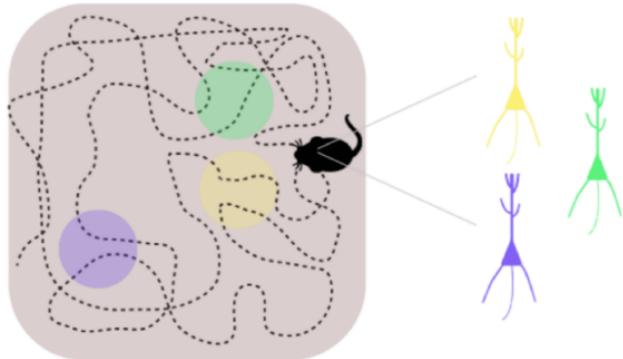


NEUROSCIENCE 6e, Figure 17.8 (Part 2)
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After Georgopoulos et al. (1986) *Science* 233: 1416–1419.

Other analogs of receptive fields

Hippocampal Place fields



Place fields analogous to receptive fields of sensory neurons, in that the firing region corresponds to a region of sensory information in the environment.

(Muller et al. 1987)

How is information represented in neural activity?

Synaptic potentials?

Action potentials?

Field potentials (like EEG)?

fMRI signals?

Rate coding

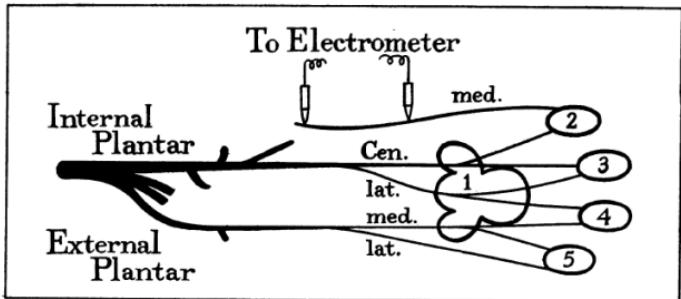


Fig. 1. Digital nerves to plantar surface of cat's hind foot.

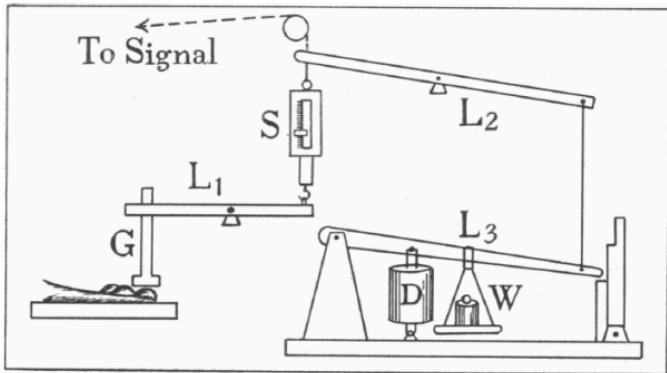
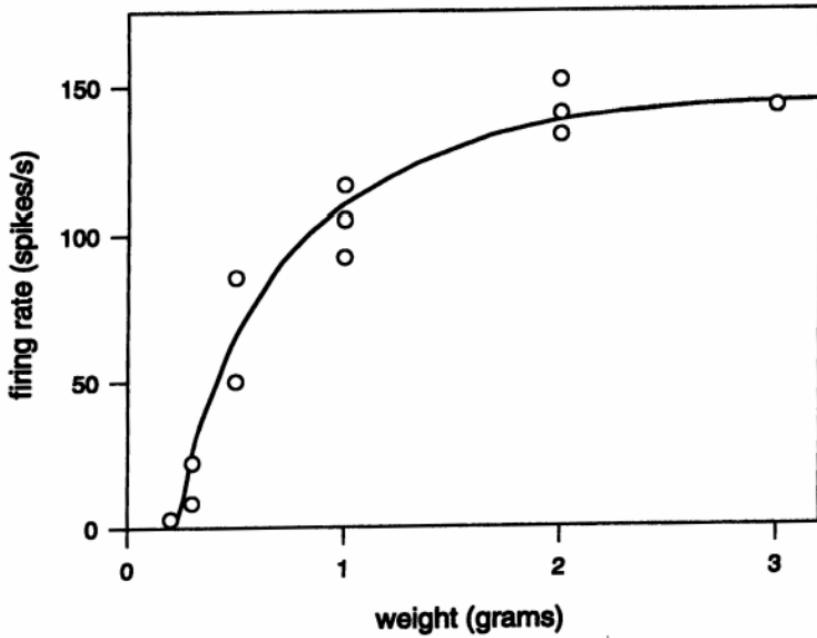


Fig. 2. Stimulating apparatus.

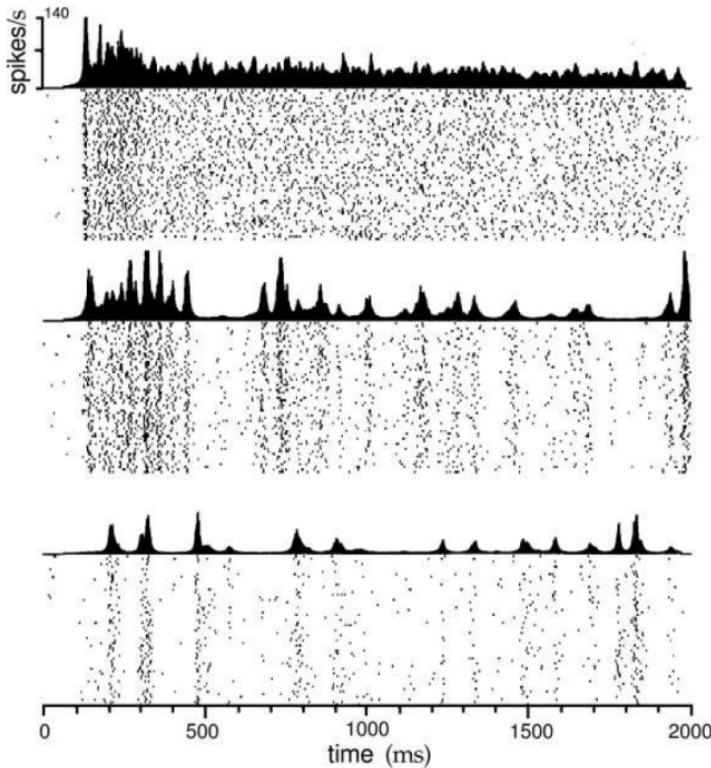


Rate of firing of spikes is proportional to stimulus strength

Rate coding vs. spike time coding

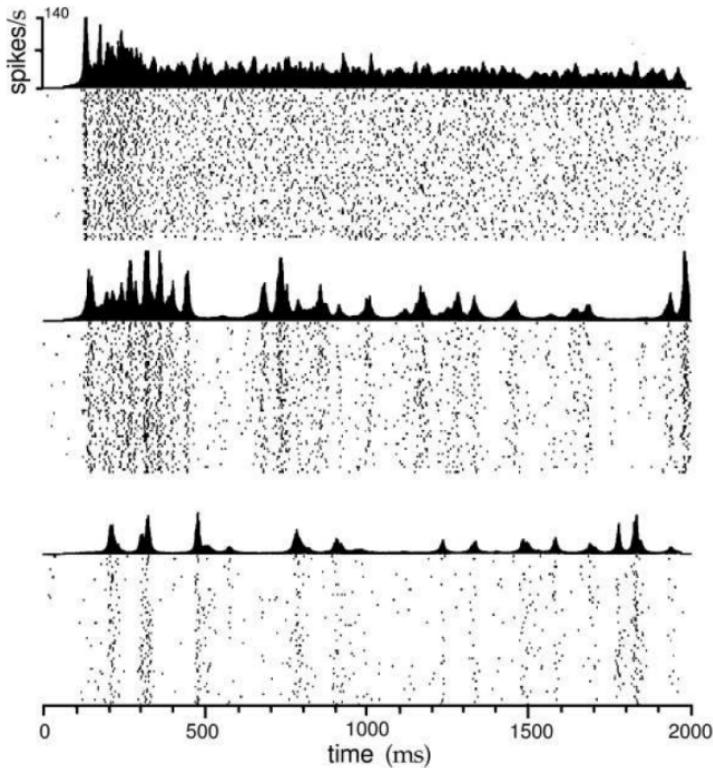
Response of the same neuron in the MT cortex of monkeys, to different types of visual stimuli

Some stimuli evoke reliable responses across many trials



Reliability of response to a stimulus

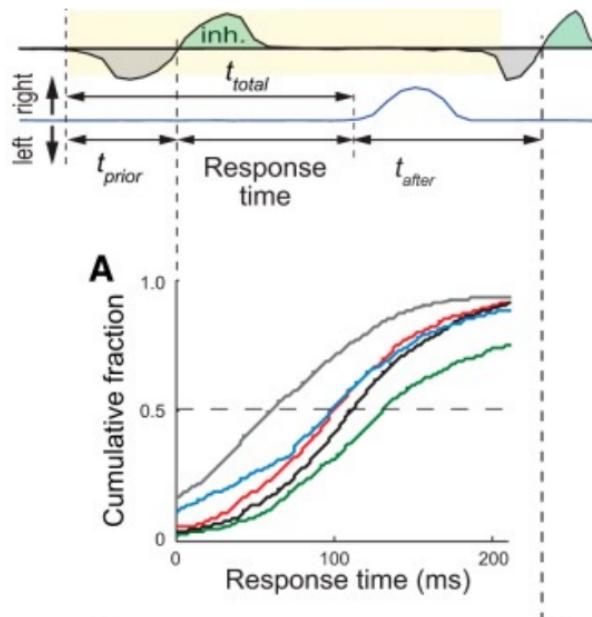
How reliable the response is, sets the fundamental limit of how reliable the response or behavior of the animal is



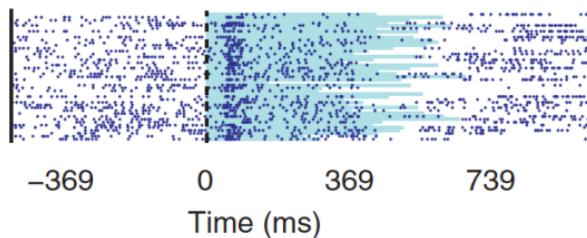
Low levels of variability favor sensitive or “fine” discrimination

Information is processed quickly – only a few spikes matter

A mouse has to smell 2 odors and move left if it's one odor and right if the other

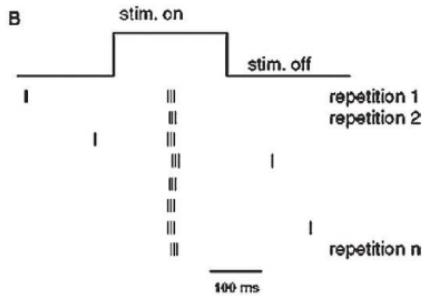


The time it takes for an animal to make a decision about the stimulus it encountered is much less than a second. Only few spikes in the input stage occur in this time.

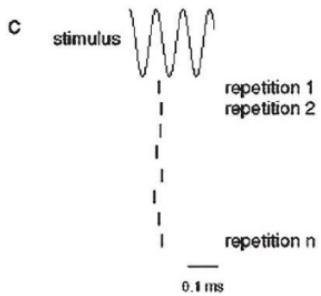


Temporal coding

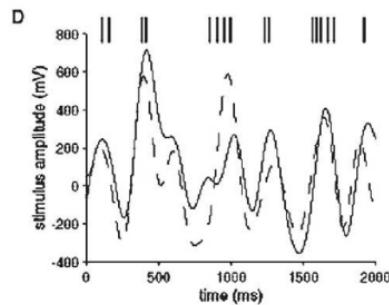
Sparse representation



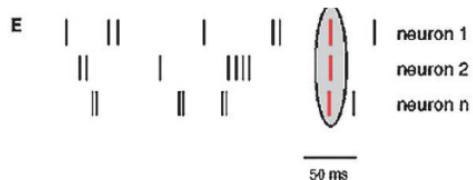
Precise spike timing



Time varying spikes



Spiking from multiple neurons



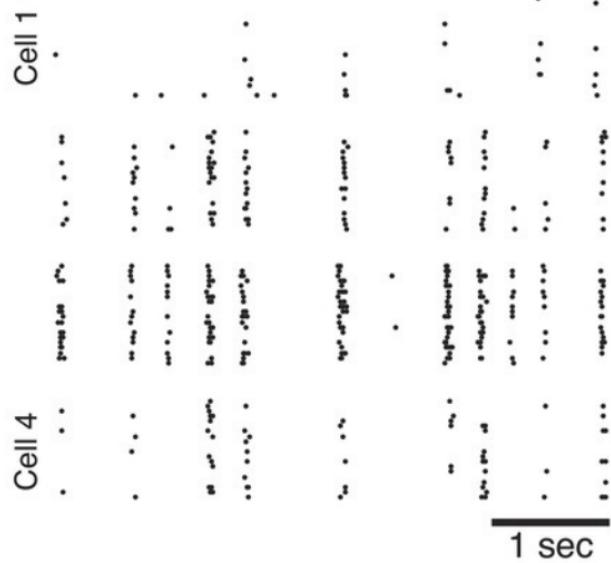
Temporal coding can mean different things – here are some examples

Neural coding: computational and biophysical perspectives

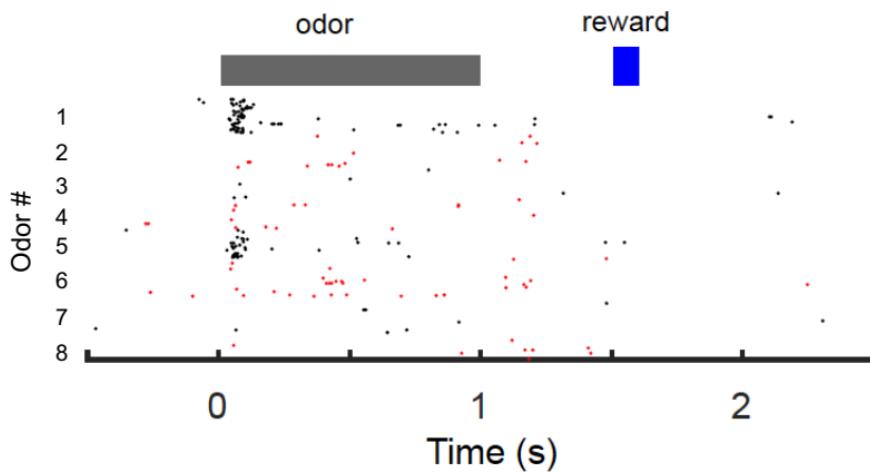
Gabriel Kreiman

Temporal coding

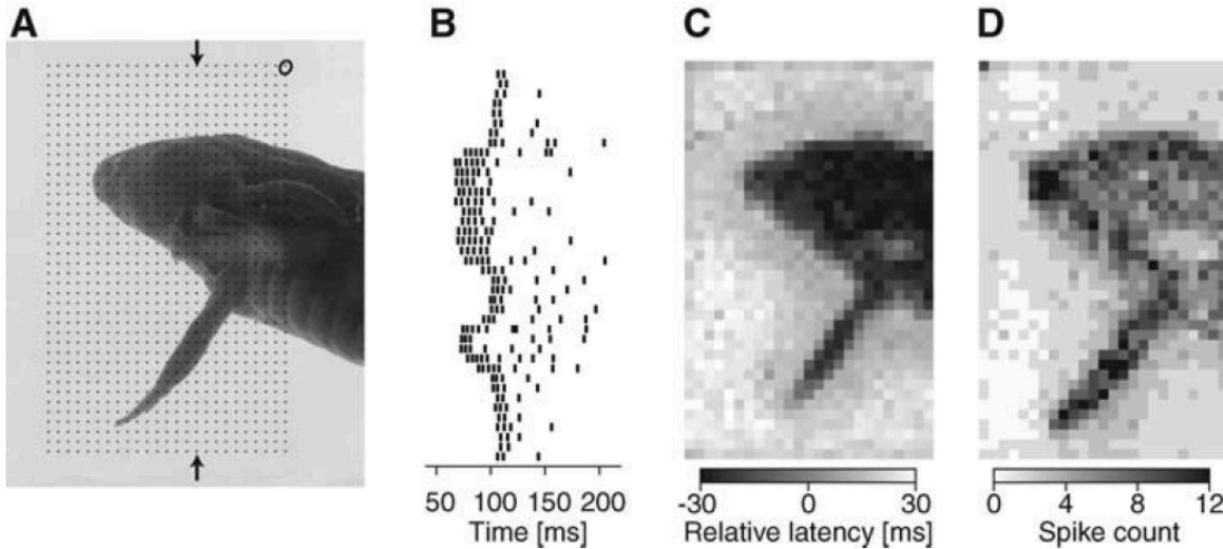
An example of precisely timed spikes in
the visual system (retina)



An example of precisely timed spikes in
the olfactory system (olfactory cortex)



Latency coding



Latency of spikes carry more information
about this image than spike count (or rate)

Single neurons, few neurons, big populations of neurons...

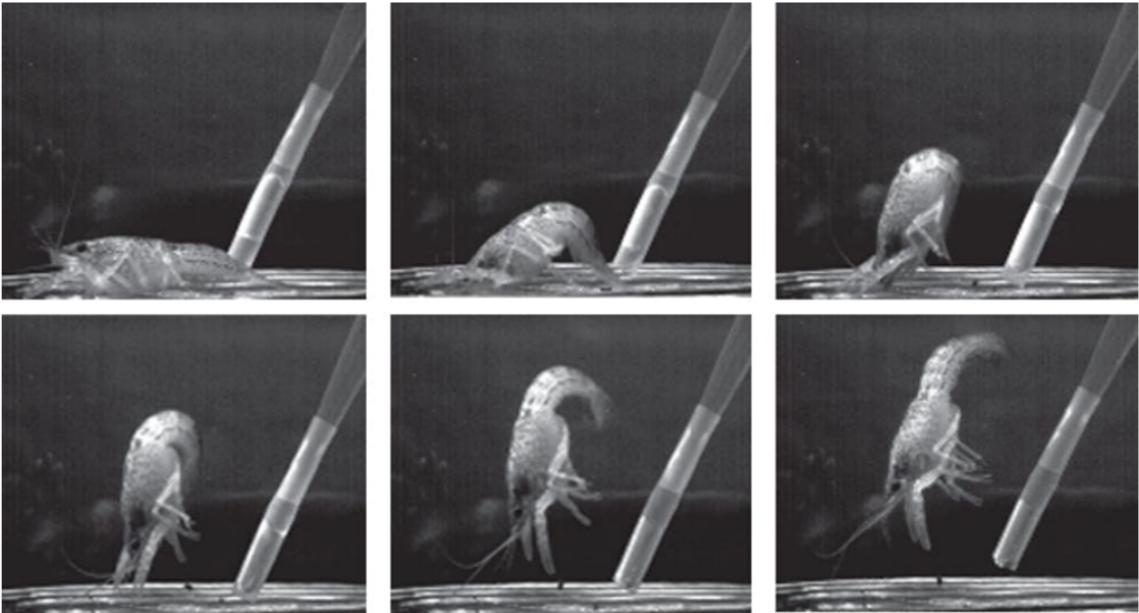
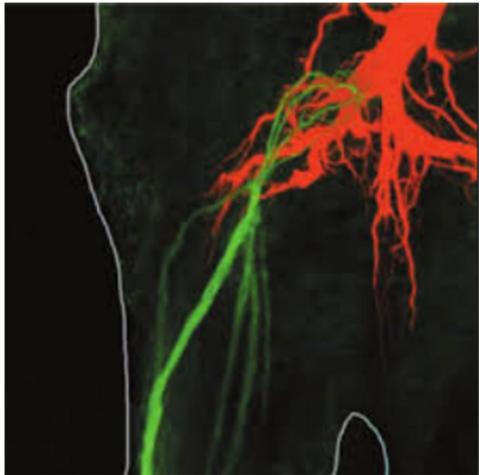
Do single neurons influence behavior
in noticeable ways, or do you need
groups (a population) of neurons to
achieve anything?

Depends on....?

- the animal you are talking about
- the region of the brain
-?

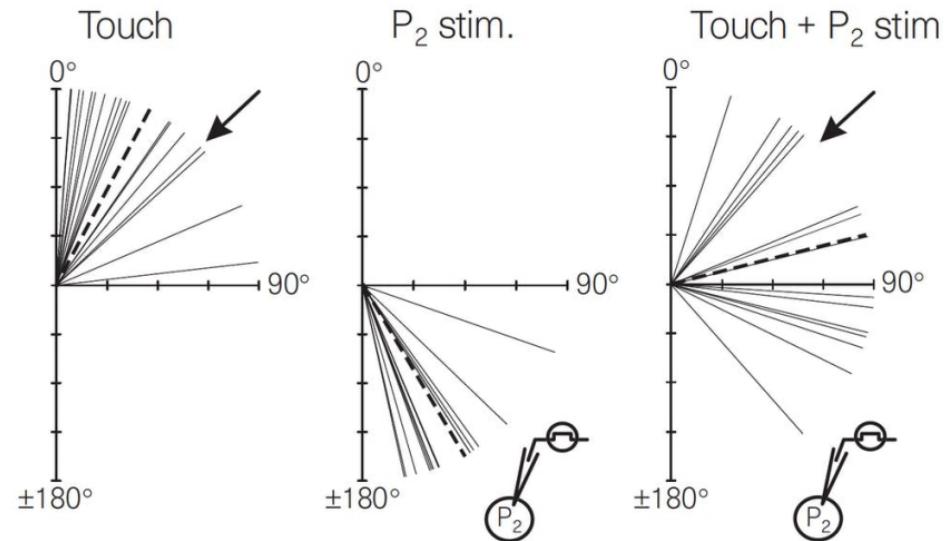
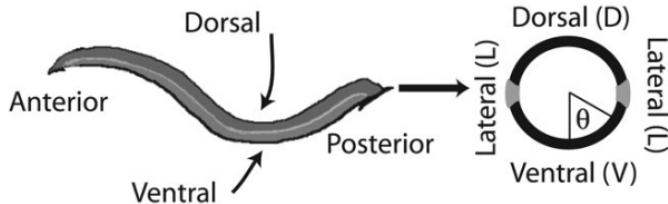
Single neuron's activity can lead to strong behavioral output

Lateral giant neuron

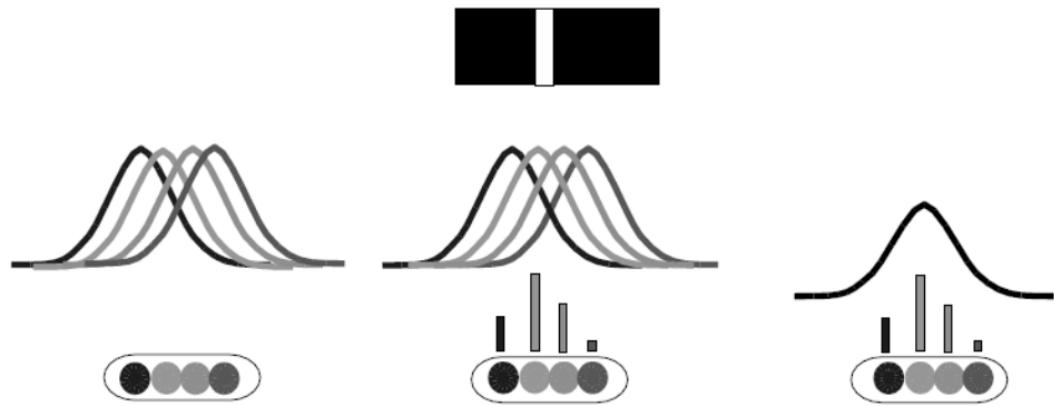
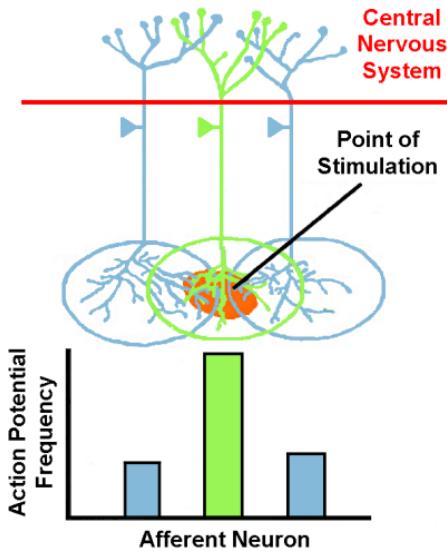


Population coding of behavioral output

Leech bending in response to touch or electrical stimulation

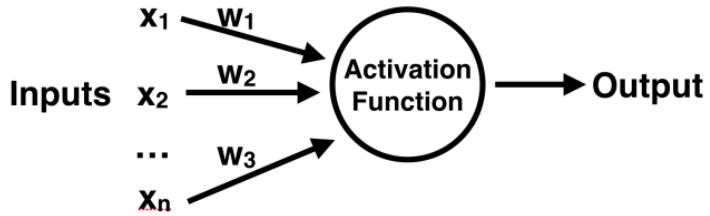
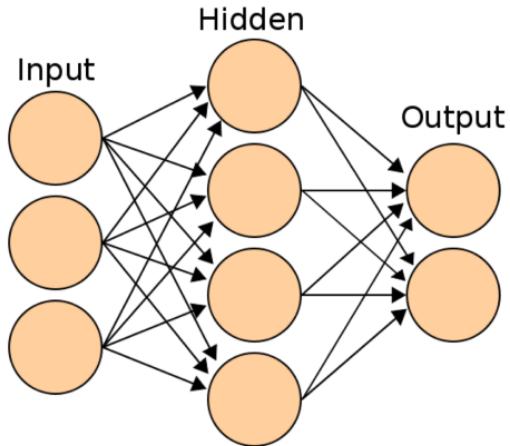


Population coding

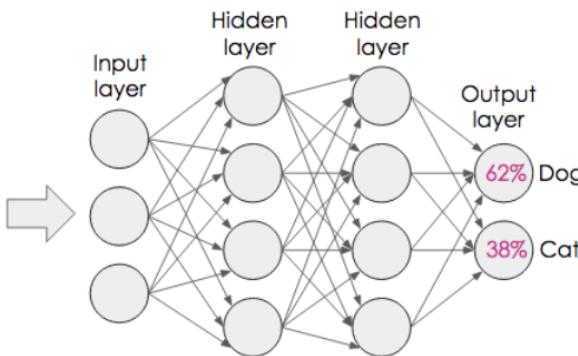


lateral inhibition increases contrast between strong and weak signals

Artificial Neural Networks



x = input spike rate
 w = synaptic strength



It should be
100% Cat :(

Learning Objectives

Identify basic circuit motifs (e.g. convergence, feedback inhibition) in simple neuronal circuits.

Analyze the spiking pattern of a neuron in response to different stimuli to predict the receptive field and coding pattern of the neuron.

Lecture 16 - Neural circuit motifs and neural coding

Pre-class notes for October 29, 2019

No textbook reading material - this lecture is designed to explore and better understand some of the coding/computational details of circuits that we have already covered.

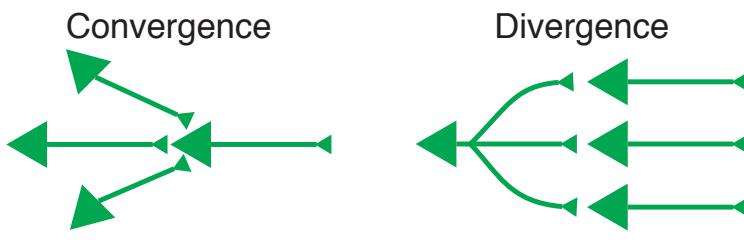
Neuronal circuit - synaptically connected neurons that carry out a specific function (e.g. reflex circuit, visual circuit).

Projection neuron - a neuron with an axon that projects outside the region that houses the neuron's cell body.

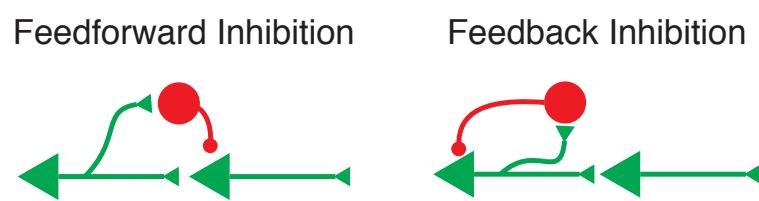
Interneuron - a neuron with the axon confined to the specific region that houses the neurons's cell body.

Neural circuit motifs

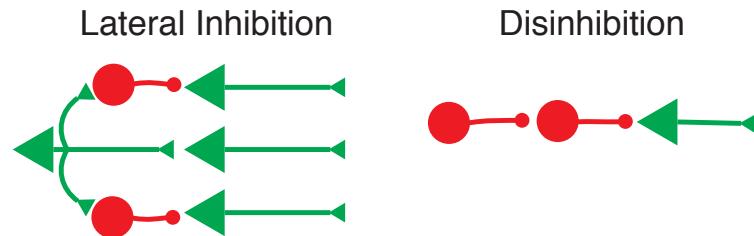
Divergence - a circuit motif where the branching of a single axon to innervates multiple target cells.



Convergence - a circuit motif where multiple neurons innervation a target cell. Both convergence and divergence allow individual neurons to integrate input from multiple presynaptic neurons and send output to multiple postsynaptic targets.



Feedback and recurrence - in addition to passing information in a single direction through the nervous system, neurons often send connections back to earlier steps in the circuit (feedback) or create loops/crossed pathways (recurrence).



Lateral Inhibition - a circuit motif in which an inhibitory neuron receives excitatory input from one or several parallel streams of excitatory neurons and send inhibitory output to many of all the postsynaptic targets of these neurons.

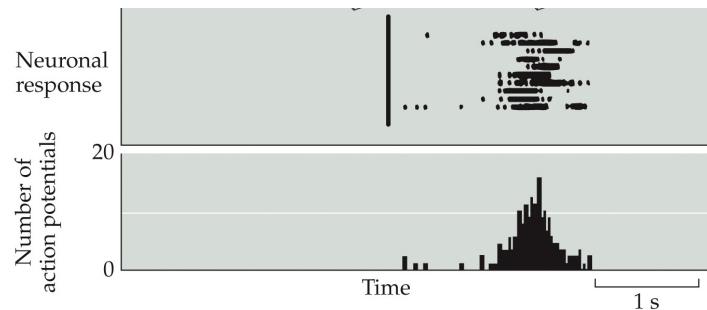
Feedforward inhibition - a circuit motif in which a postsynaptic neuron receives both direct excitatory input from a presynaptic neuron and a disynaptic inhibitory input from the same excitatory neuron via an inhibitory interneuron.

Feedback inhibition - a circuit motif in which an excitatory neuron both makes an excitatory synapse onto and receives inhibitory synapses from an inhibitory neuron.

Disinhibition - reduce the inhibitory output of an inhibitory neuron, often by inhibiting an inhibitory neuron.

Neural code - The manner in which information about a stimulus or motor act (by extension, more complex thoughts) is represented in the activity of neurons. The code is typically discussed in the context of spikes (action potentials), although one can also extend this to other signals such as EEG or even fMRI.

Raster plot - when studying the response of a cell, it is typical to repeat the experiment over many trials to see how similar (or different) the neuronal responses are to the stimulus. A raster plot is a simple method to visually examine the trial-by-trial variability of the responses. Each row will represent the neuron's response to a single trial (or occasionally the response of one neuron within a population), and the x axis will represent time.



Peristimulus time (PST)

histogram - are histograms of the times at which neurons fire. Used to visualize the rate and timing of a neuronal spike in relation to a stimulus or external event.

Rate coding - (frequency coding) where information is represented in the average firing rate (calculated over some standard period of time, on the order of hundreds of milliseconds). A stronger signal increases the firing rate.

Temporal coding - where information in the exact times of individual spikes (and not just averages over longer periods of time) carries information

Population coding - where information is represented in the collective activity of a population of neurons

Sparse coding - when pieces of information is encoded in a relatively small set of neurons.

Receptive fields - a description of the location at which a sensory stimulus must be presented in order to elicit a response from a sensory cell. In the nervous system generally, the receptive field of a sensory neuron is defined by its synaptic inputs; each cell's receptive field results from the combination of fields of all of the neurons providing input to it.

Decoding neural activity: the processing of extracting information from the activity of neurons. This is done both to understand what information is represented in the activity, as well as to get ideas about how other downstream brain circuits can interpret this information to produce appropriate response (such as movement).

Reliability of neurons: how repeatable and robust the responses (activity) of neurons is to repeated presentation of the same stimulus, or the same motor act. Reliability of neurons and circuits sets the fundamental limit to how reliable the behavior is.

Learning Objectives: (By the end of Lecture 19 you should be able answer questions about the following)

1. Identify basic circuit motifs (e.g. convergence, feedback inhibition) in simple neuronal circuits.
2. Analyze the spiking pattern of a neuron in response to different stimuli to predict the receptive field and coding pattern of the neuron.