

Systems Neuroscience

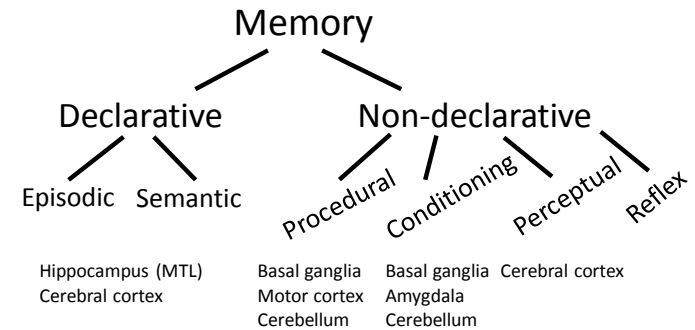
CISC 3250

Memory

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 JMH 332



Types of memory



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Declarative vs. non-declarative memory

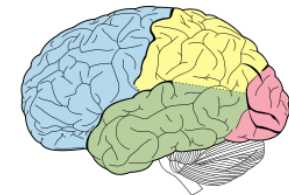
- Declarative
 - “Winter break ended on January 15”
 - “Apples are edible, chairs are not edible”
- Non-declarative
 - Throwing a baseball
 - Pattern completion (seeing the dog behind the fence)



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Short-term vs. long-term memory

- Short-term memory – aka “working” memory
 - Hold facts in memory for 1-200 seconds
 - Sometimes prolonged version of perception
 - Associated with prefrontal cortex (PFC)
- Long-term memory
 - Stores facts over years
 - Associated with hippocampus (also, amygdala)



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Modeling limits of working memory

- How much can we hold in working memory?
 - 7 ± 2 things
 - Things can be simple A Q R L G
 - Things can be complex

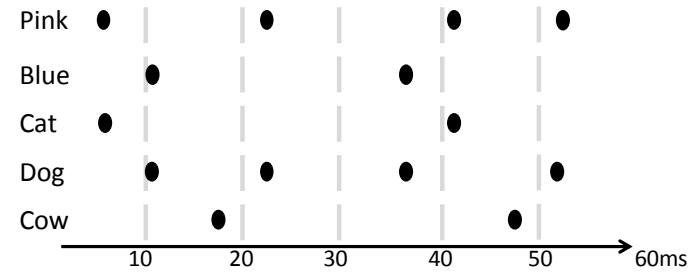


- Why is our working memory limited?
 - Binding hypothesis: distributed code with synchronous spiking – errors with spurious synchronization

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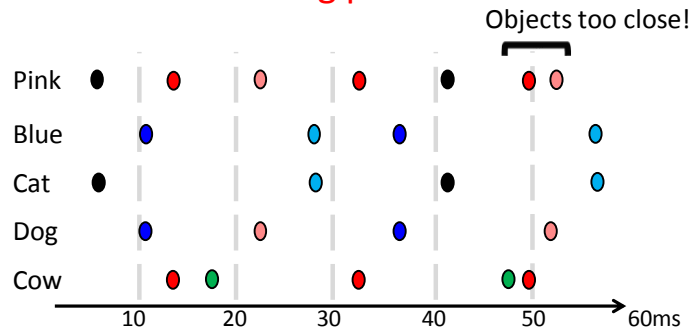
Binding hypothesis

Neurons firing at “same time” represent same thing



Spurious synchronization –

binding problem

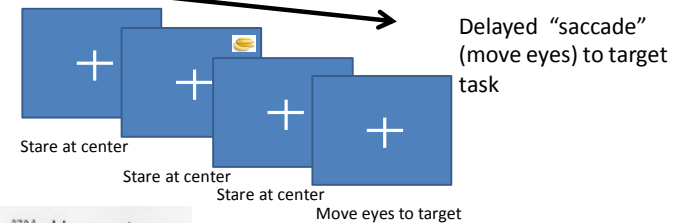


If spikes occurring within 1 ms of each other are considered synchronous, hard to incorporate increasing number of spikes in fixed time

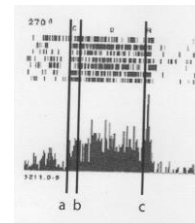
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Working memory

time over experiment



Delayed “saccade” (move eyes) to target task



Neural memory in dIPFC for delayed-action task

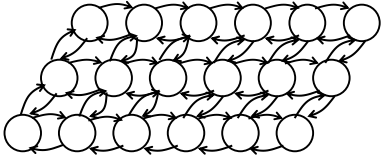
- a: stimulus display onset
- b: stimulus display offset
- c: performance of action

Funahashi et al. 1989

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Neural dynamics in "cortical sheet"

- Cortical sheet: group of neurons on same level of hierarchy interacting with lateral connections
- Balance between local cooperation and local inhibition



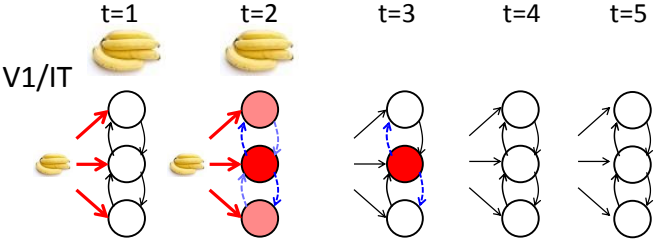
- r^{out} determined from

$$h = \left(\sum_j w_j r_j^{feedfwd} \right) + \left(\sum_k w_k r_k^{lateral} \right) + \left(\sum_m w_m r_m^{feedback} \right)$$

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Neural dynamics in action

● Neuron activated
→ Neuron exciting
→ Neuron inhibiting




Color code:
 Dark red: 1
 Light red: 0.5
 Dark blue: -0.4
 Light blue: -0.1

Neurons fire with $r^{out}=h$ linear
 Side neurons fire at $r=0.5$
 Center neuron fires at $r=1$

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Neural dynamics: equations and numbers



- $r_A^{t=2} = w_{A,in} r_{in}^{t=1} + w_{B,A} r_B^{t=1}$
- $r_B^{t=2} = w_{B,in} r_{in}^{t=1} + w_{A,B} r_A^{t=1} + w_{C,B} r_C^{t=1}$
- $r_C^{t=2} = w_{C,in} r_{in}^{t=1} + w_{B,C} r_B^{t=1}$

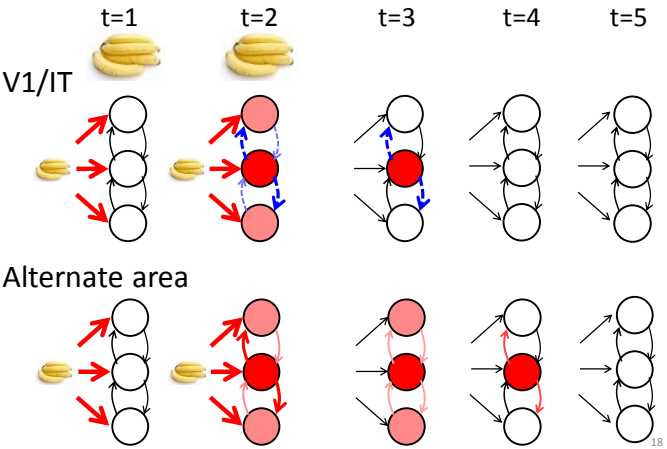
$w_{B,A} = -0.4$ $w_{B,C} = -0.4$ $w_{A,B} = -0.1$ $w_{C,B} = -0.1$
 $w_{in,A} = 0.5$ $w_{in,B} = 1$ $w_{in,C} = 0.5$

	t=1	t=2	t=3	t=4
A	0			
B	0			
C	0			
in	1	1	0	0

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Neural dynamics in action

● Neuron activated
→ Neuron exciting
→ Neuron inhibiting



V1/IT

Alternate area

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Neural dynamics, alternate area: equations and numbers



$$w_{B,A}=0.5 \quad w_{B,C}=0.5 \quad w_{A,B}=0.1 \quad w_{C,B}=0.1$$

$$w_{in,A} = 1 \quad w_{in,B} = 1 \quad w_{in,C} = 1$$

	t=1	t=2	t=3	t=4	t=5
A	0				
B	0				
C	0				
in	1	1	0	0	0

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Neural dynamics, alternate area: equations and numbers



$$w_{B,A}=2 \quad w_{B,C}=2 \quad w_{A,B}=1 \quad w_{C,B}=1$$

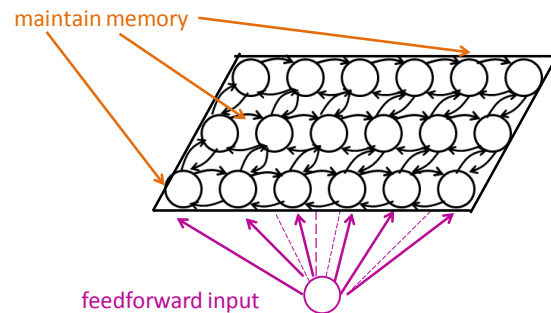
$$w_{in,A} = 1 \quad w_{in,B} = 1 \quad w_{in,C} = 1$$

	t=1	t=2	t=3	t=4	t=5
A	0				
B	0				
C	0				
in	1	1	0	0	0

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Neural system dynamics

- In an interconnected cortical sheet, neural activity can continue after feedforward input is gone



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