

# Computational neuroscience

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# What is the neural code?

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- techniques for recording from the brain
- tools for discovering how the brain represents information
- models that express our understanding of this representation
- some methods for inferring what the brain is doing based on its activity (*week 3*)
- using information theory to quantify neural representations (*week 4*)
- the biophysical basis of how the brain processes inputs and performs complex computations (*week 5*)

# Recording from the brain

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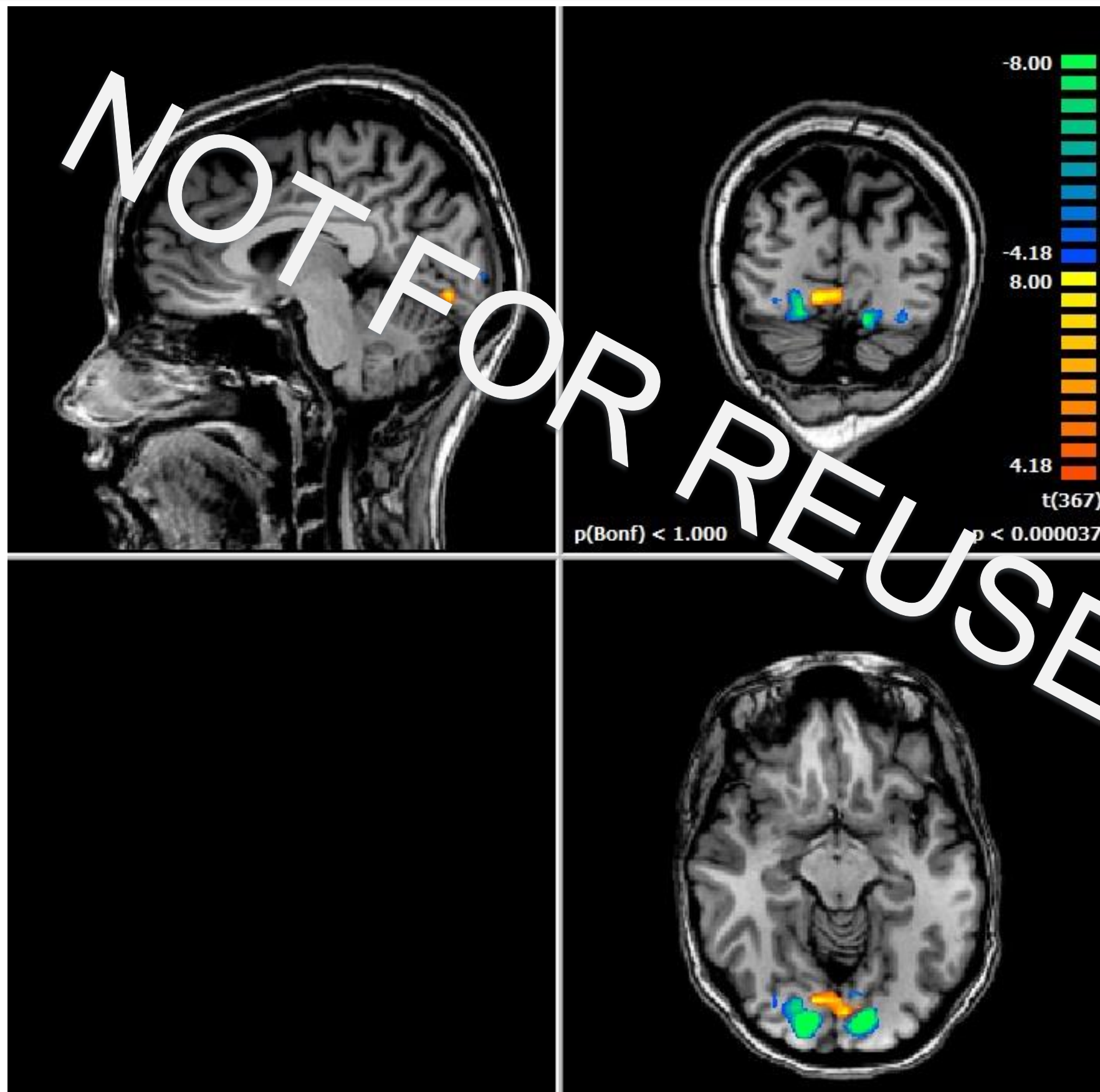
NOT FOR REUSE

# Recording from the brain: fMRI

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# Recording from the brain: fMRI





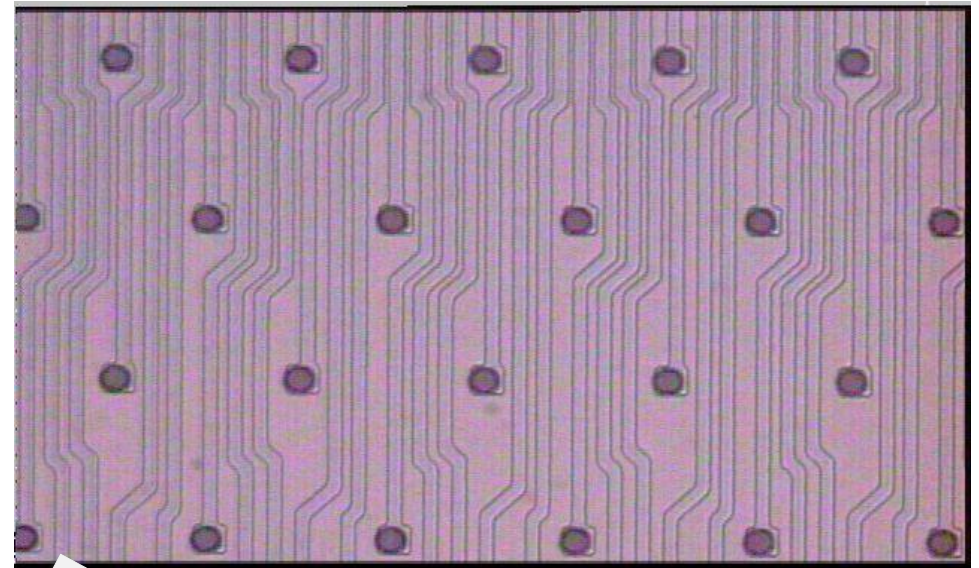
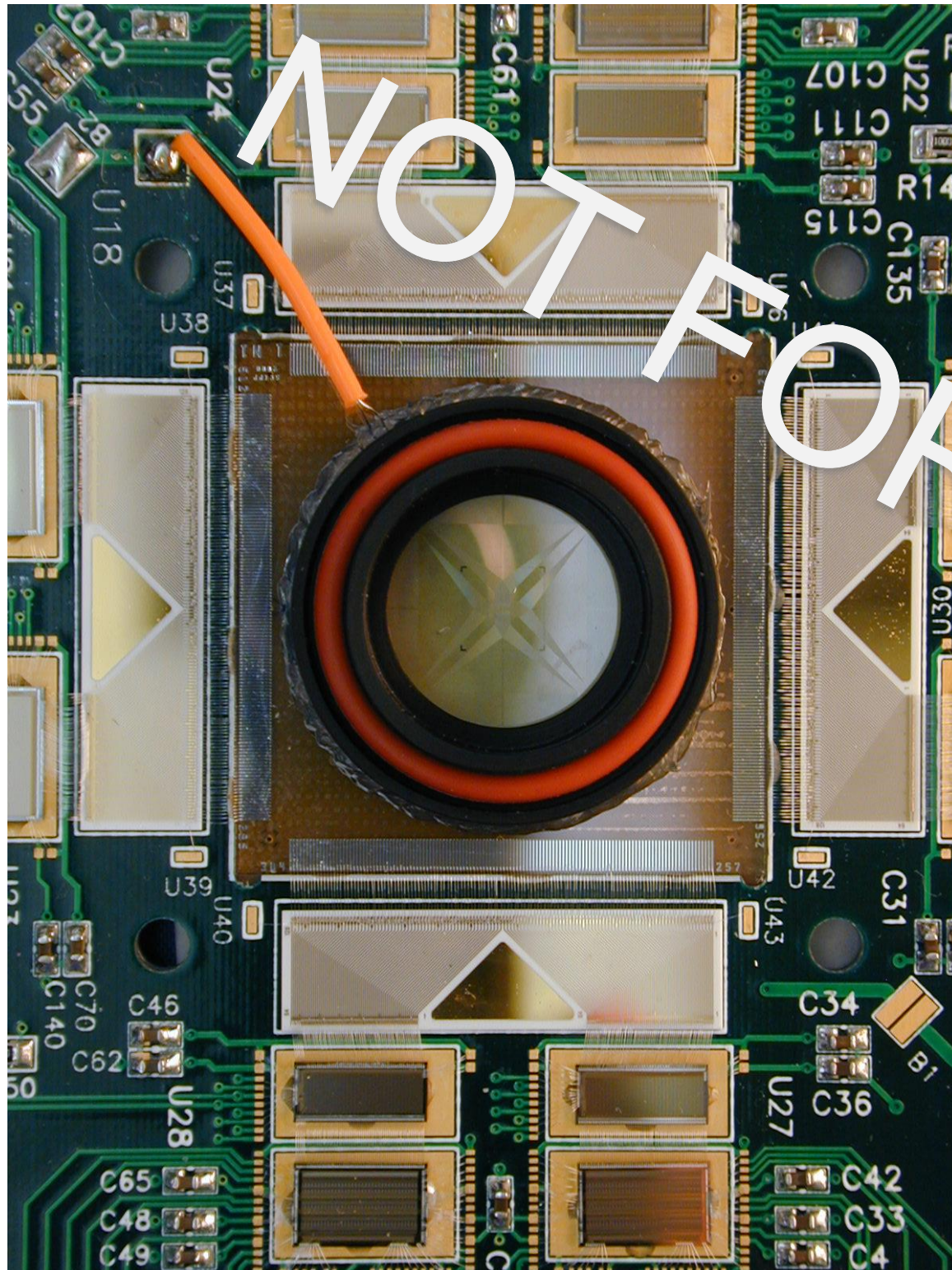
# Recording from the brain: EEG

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# Reading out the neural code: electrode arrays



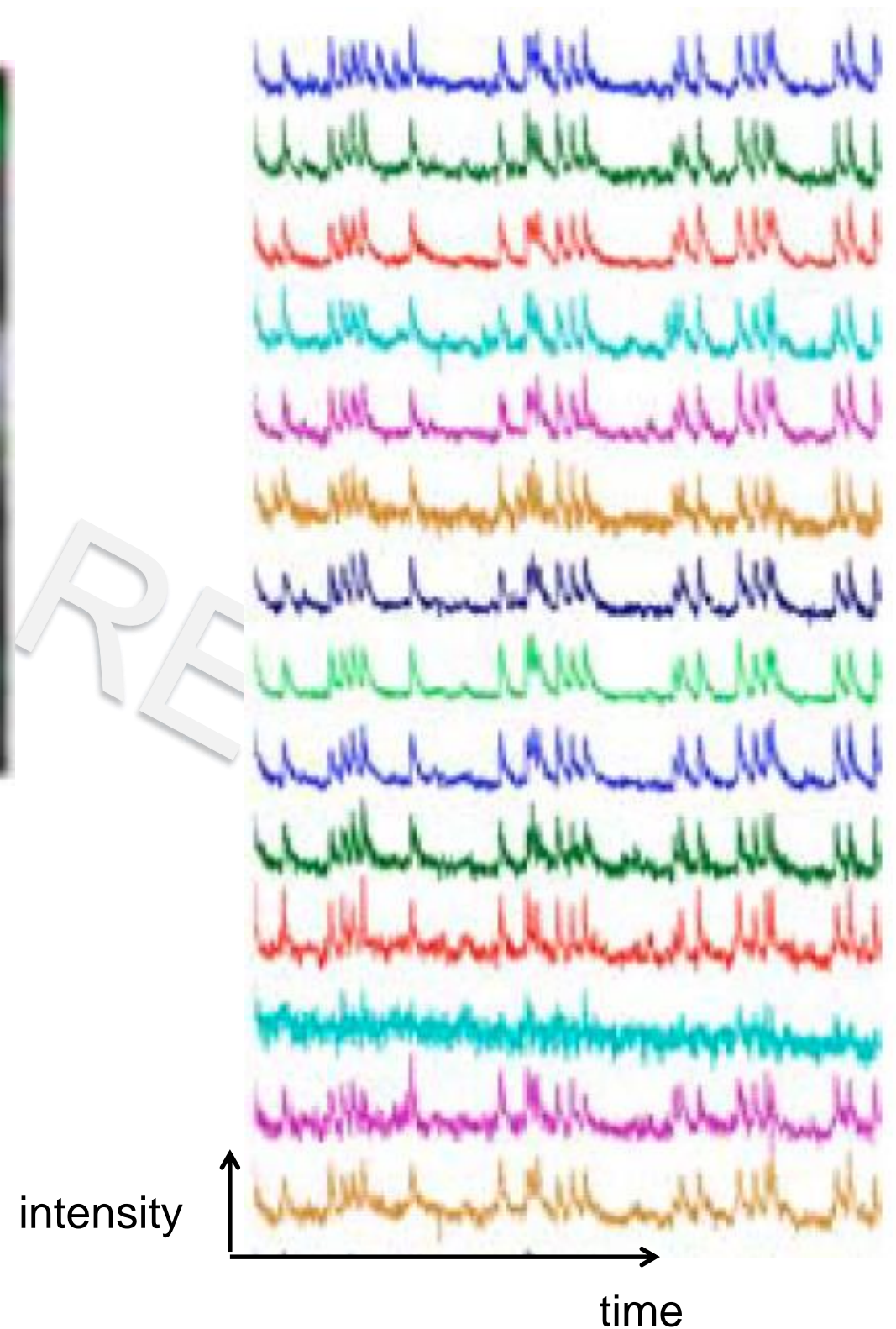
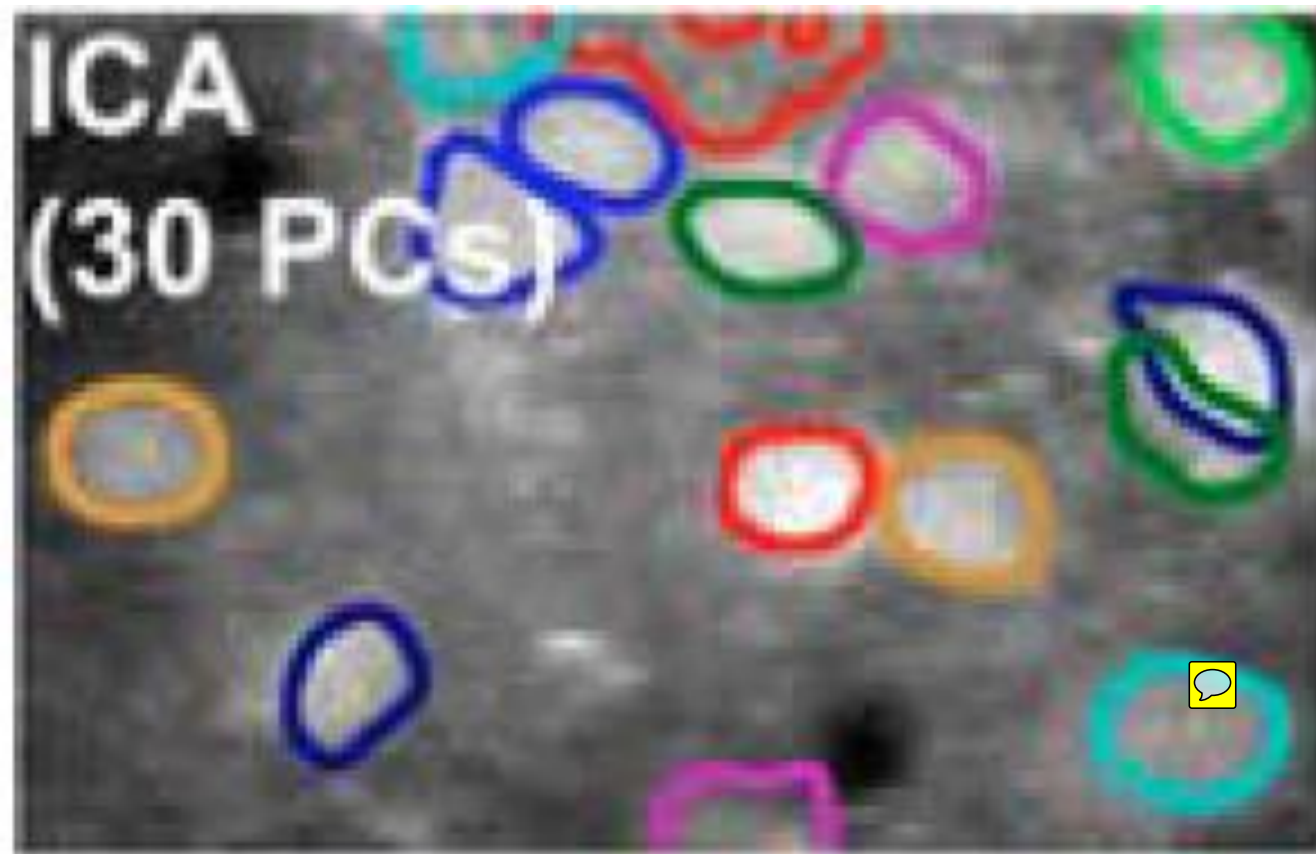


# Reading out the neural code: electrode arrays



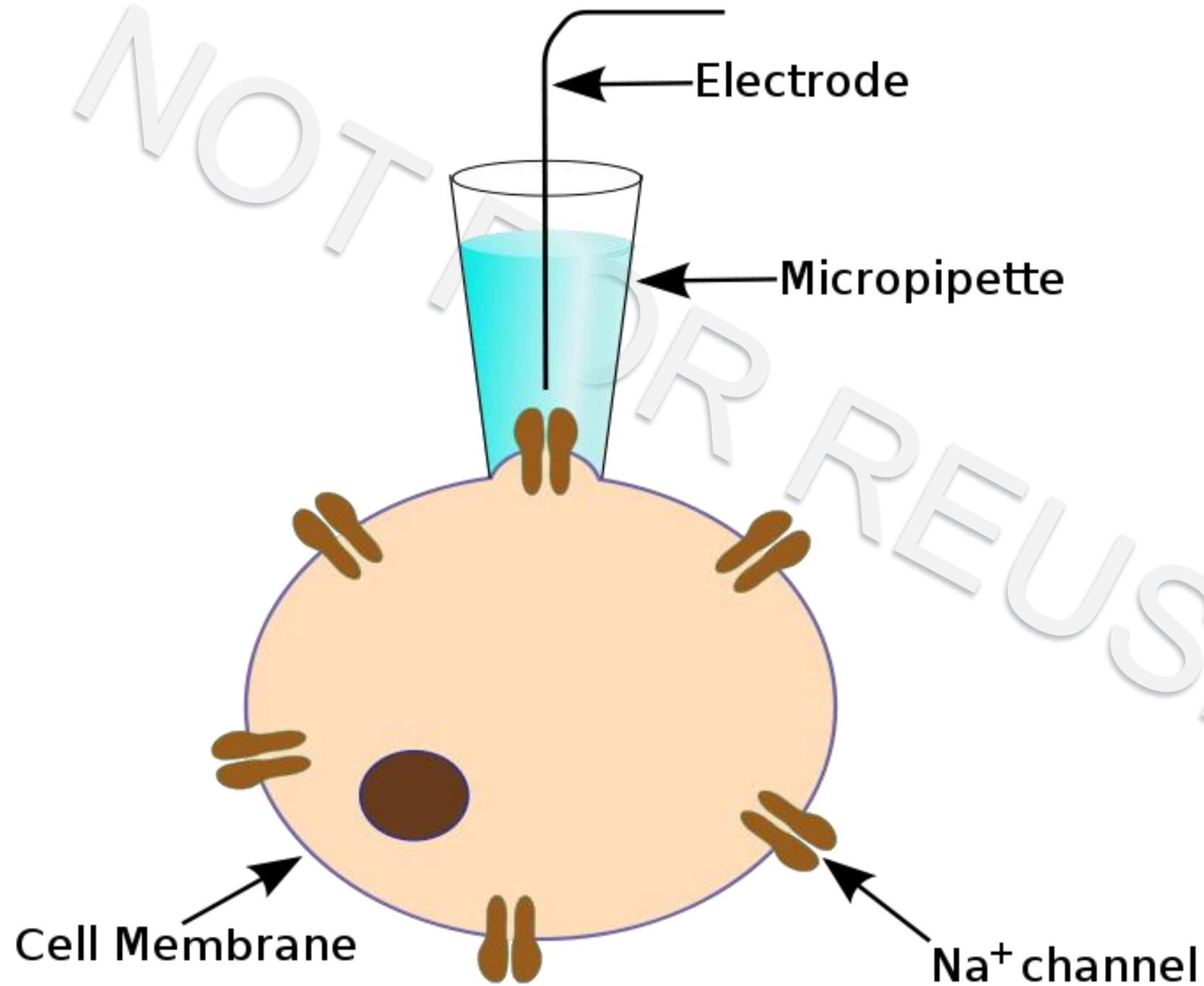


# Reading out the neural code: calcium imaging



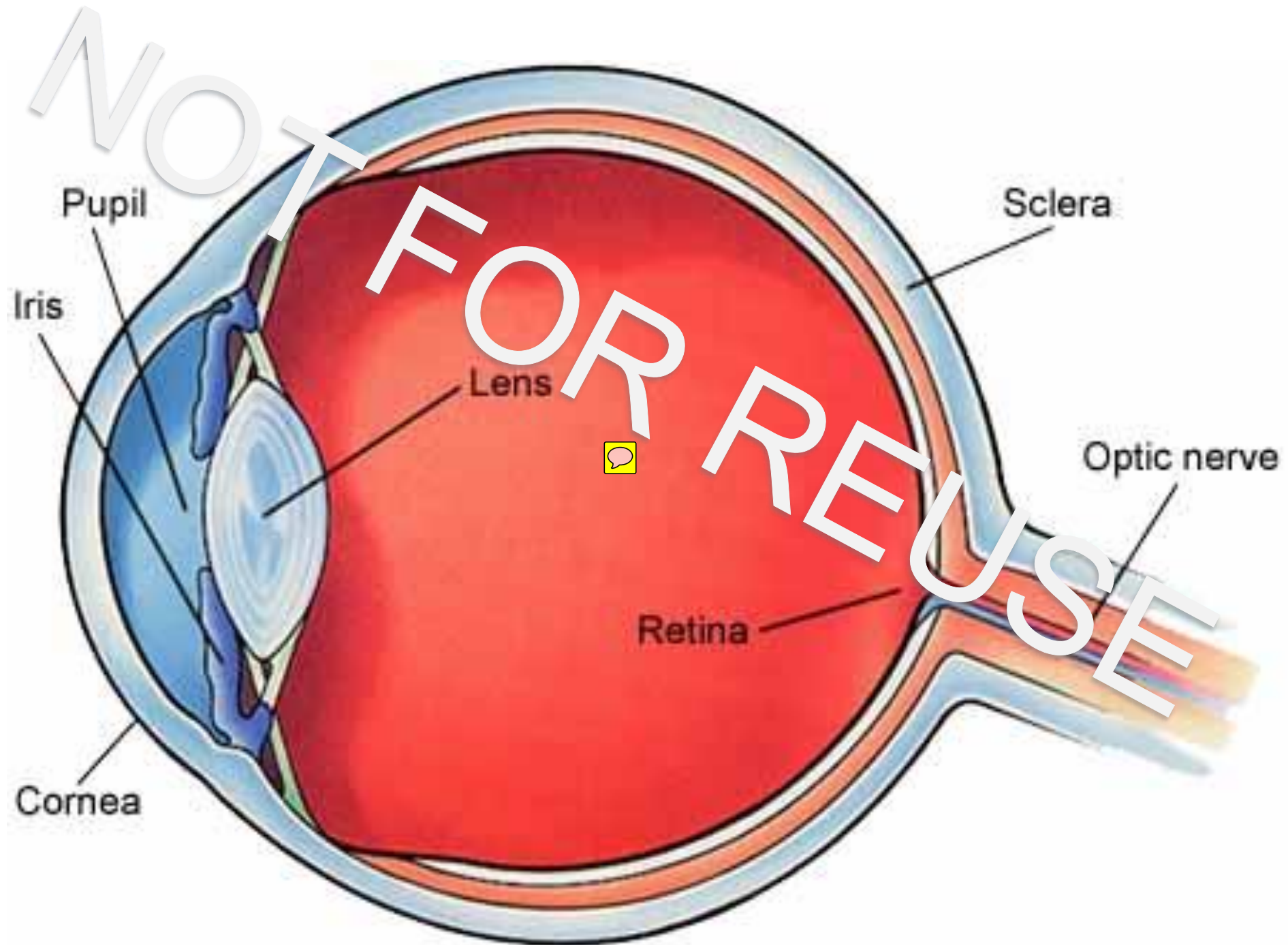
# Looking inside single cells

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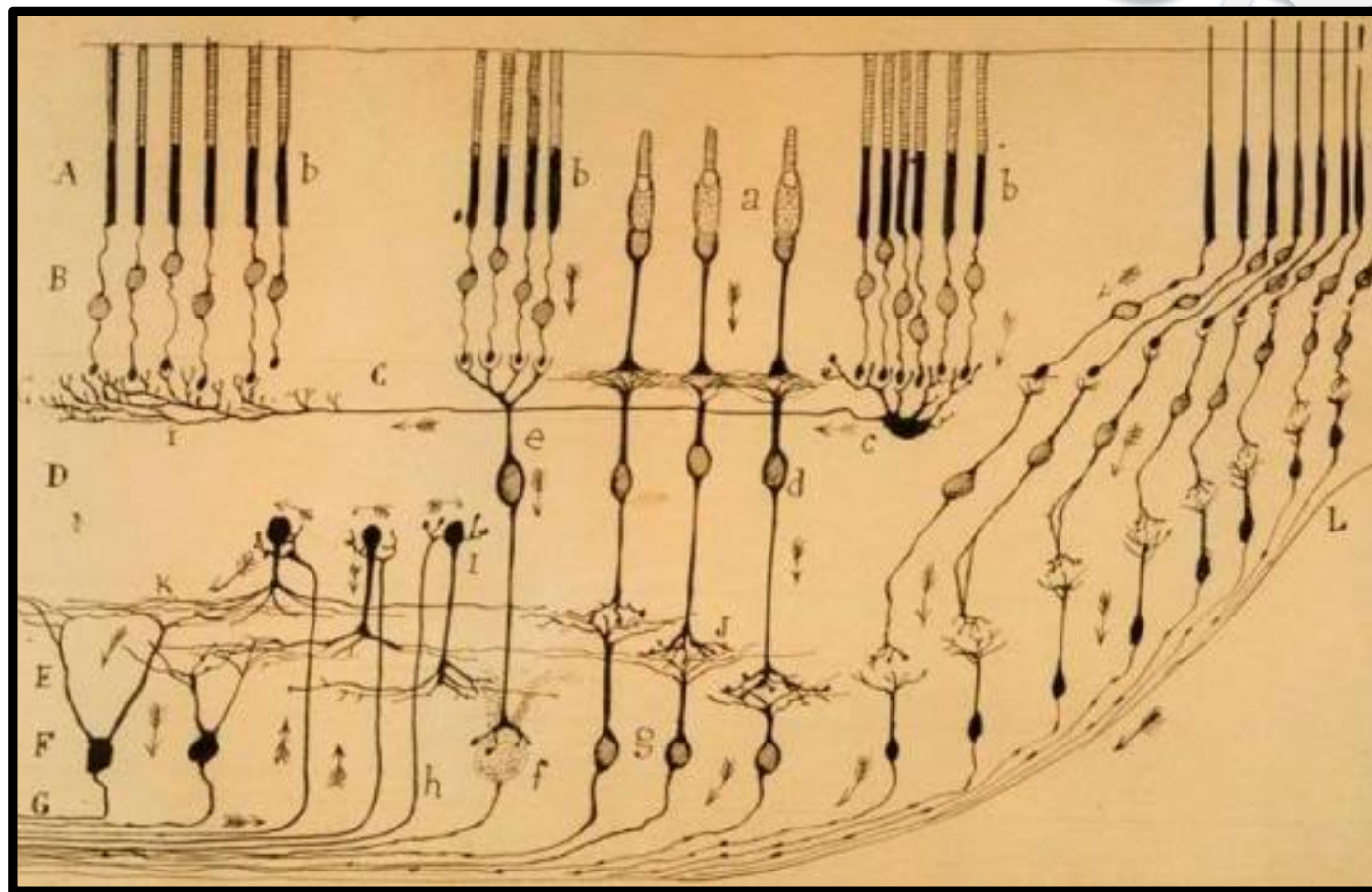
# What is the neural code?

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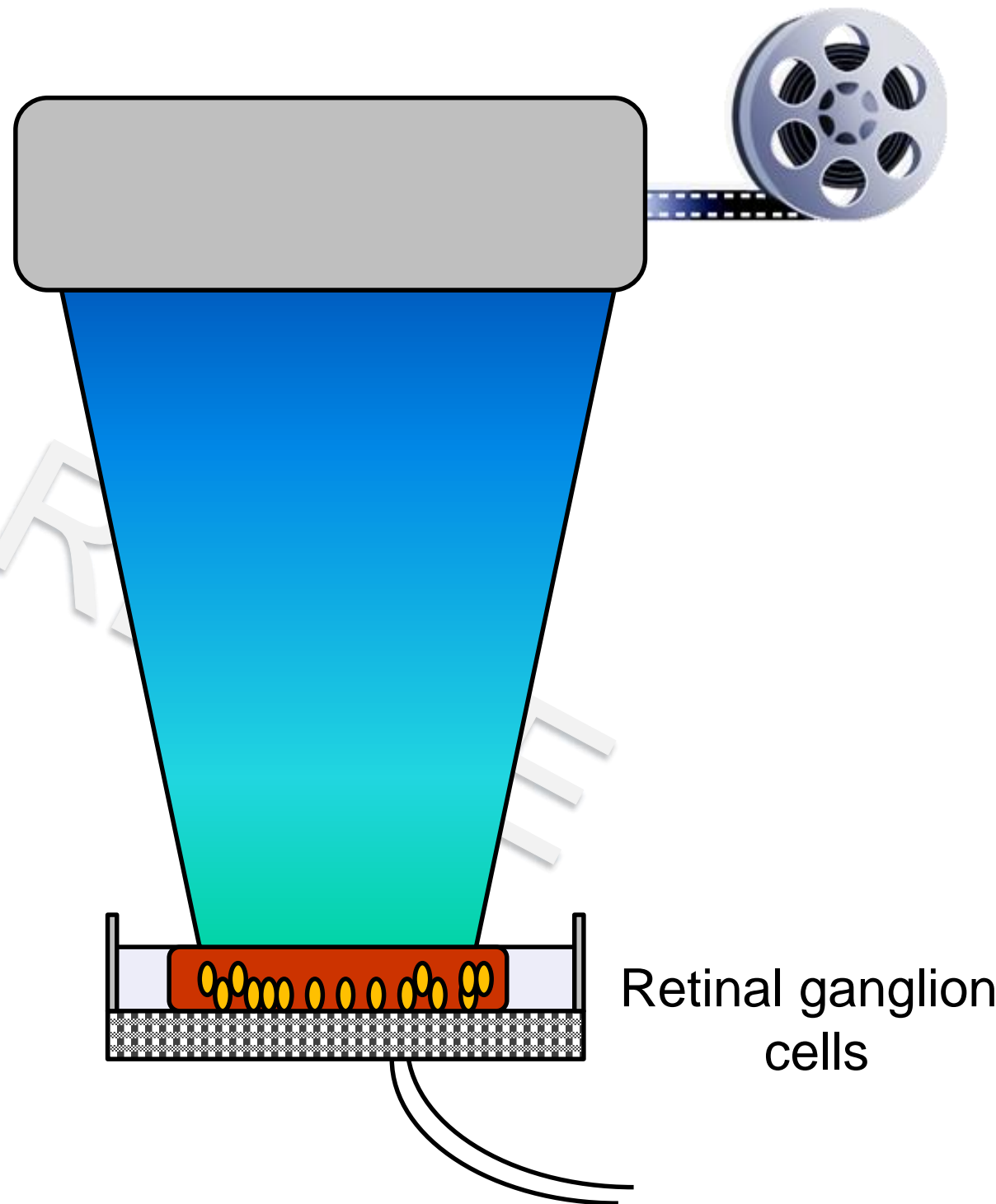




# What is the neural code?

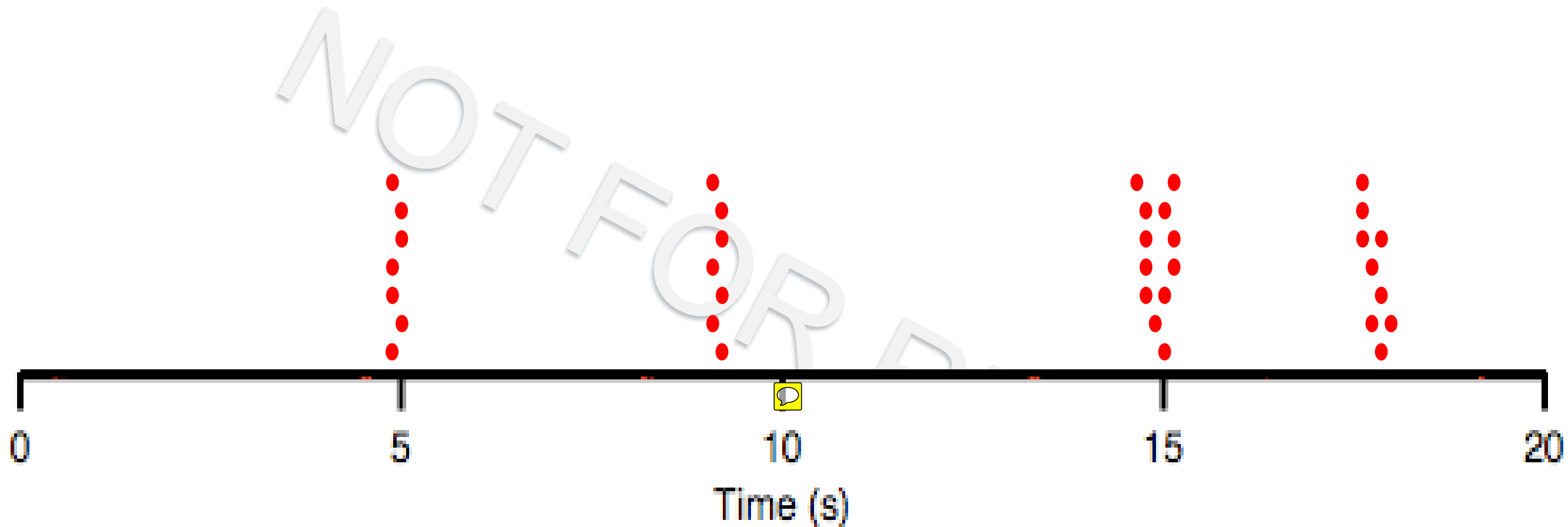


Ramon y Cajal, 1901

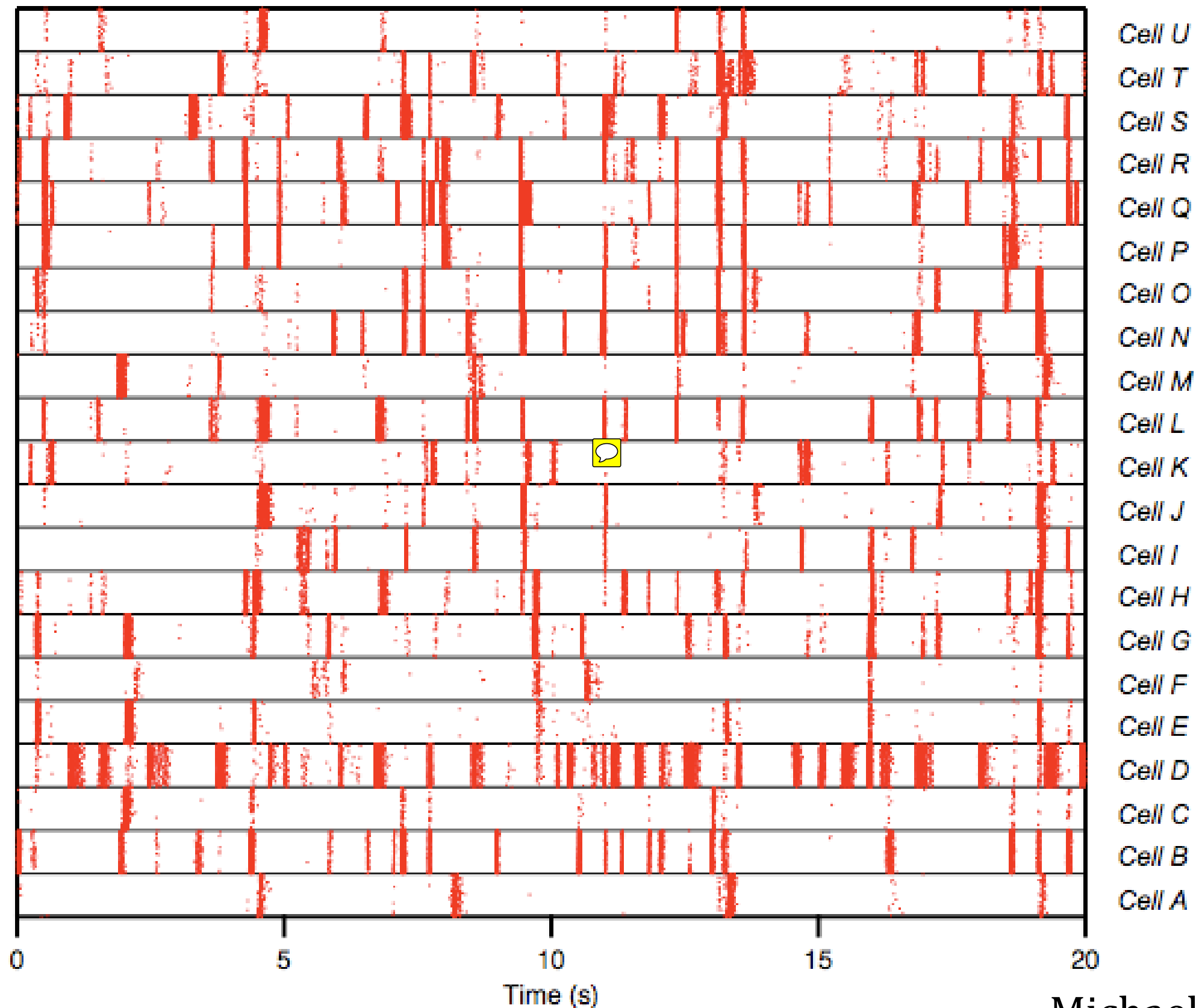


# What is the neural code?

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# What is the neural code?





# Encoding and decoding

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*Encoding*: how does a stimulus cause a pattern of responses?

- building quasi-mechanistic models

*Decoding*: what do these responses tell us about the stimulus?

- how can we reconstruct what the brain is doing?

$P(\text{response} \mid \text{stimulus})$

*encoding*

$P(\text{stimulus} \mid \text{response})$

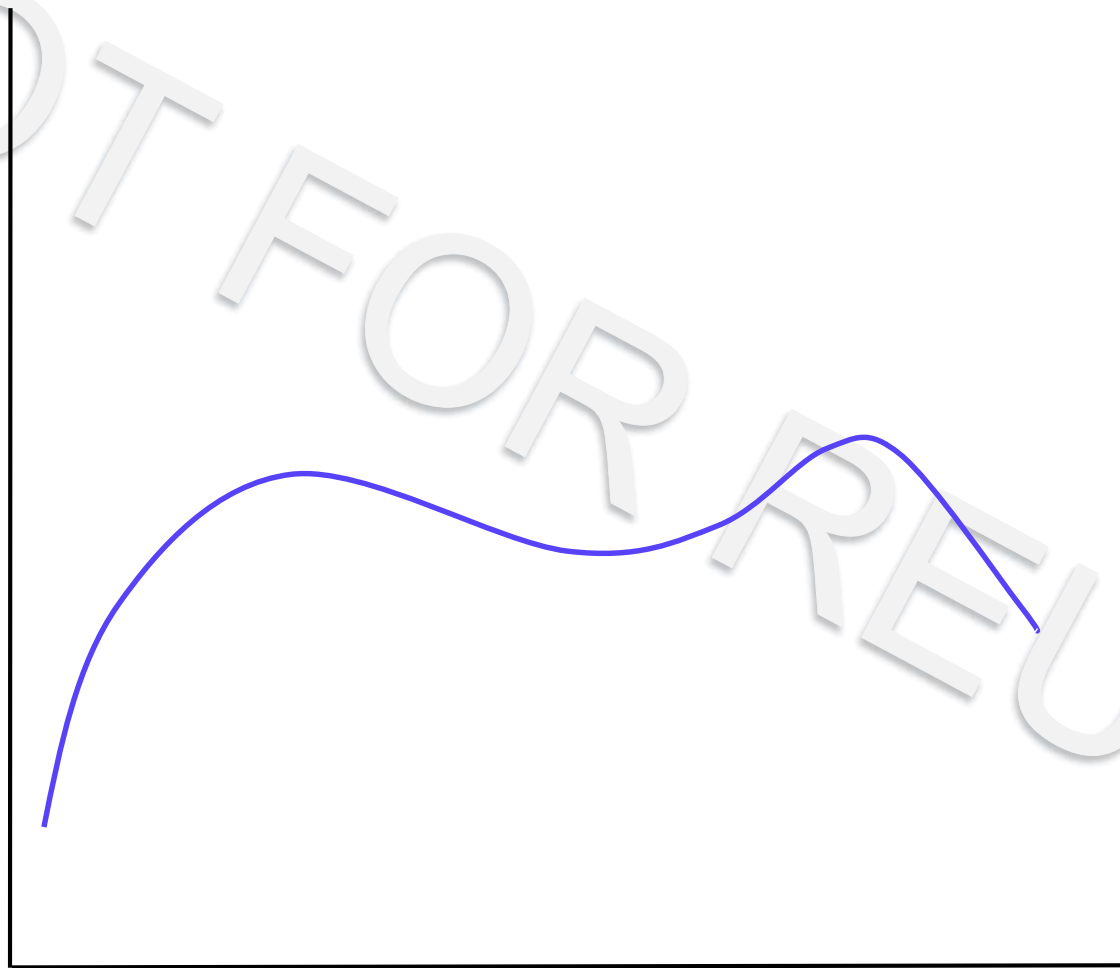
*decoding*

What is the response? What is the stimulus?

What is the relationship between them?

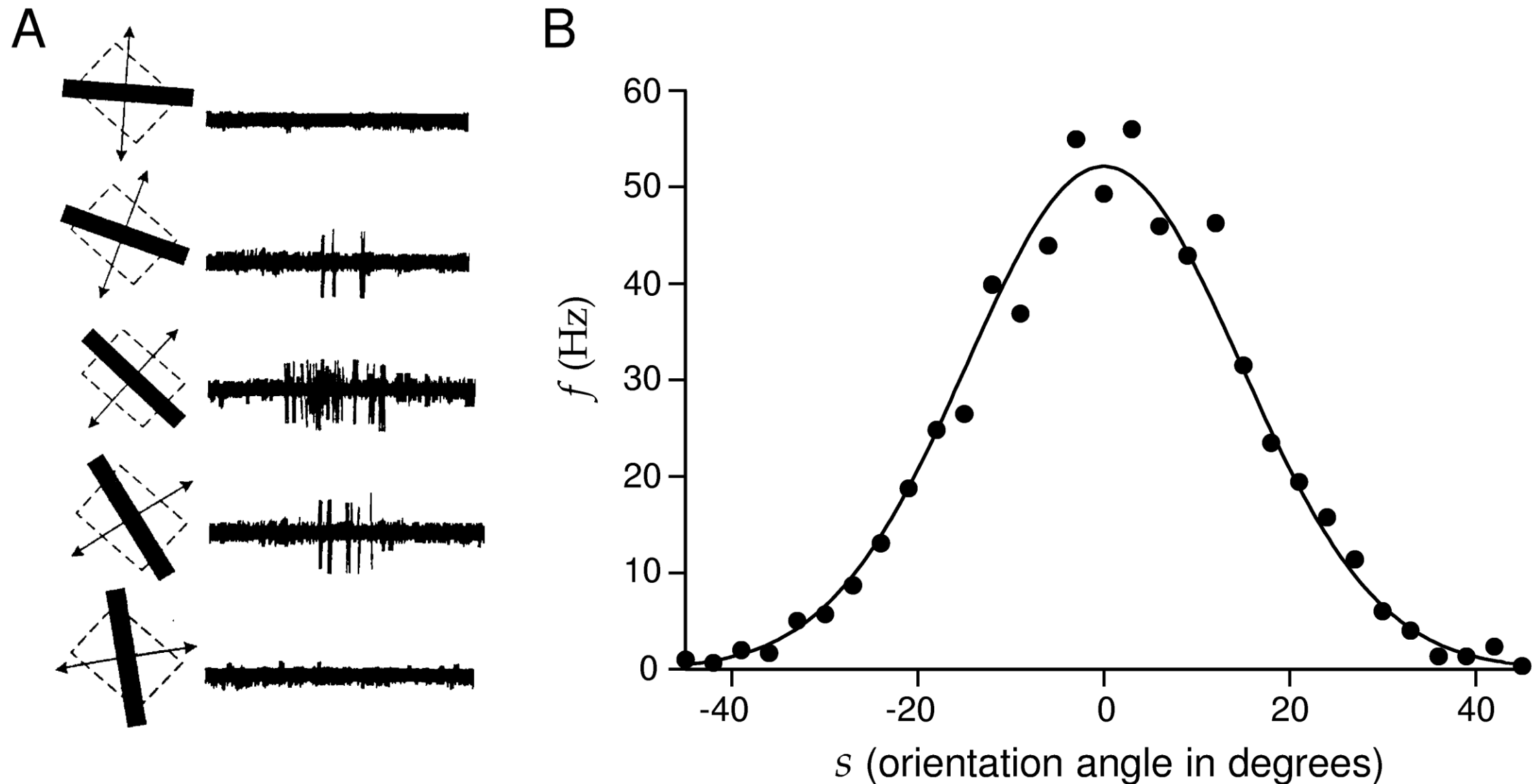
# Neural representation of information

Neural response



Stimulus parameter

# Tuning curves

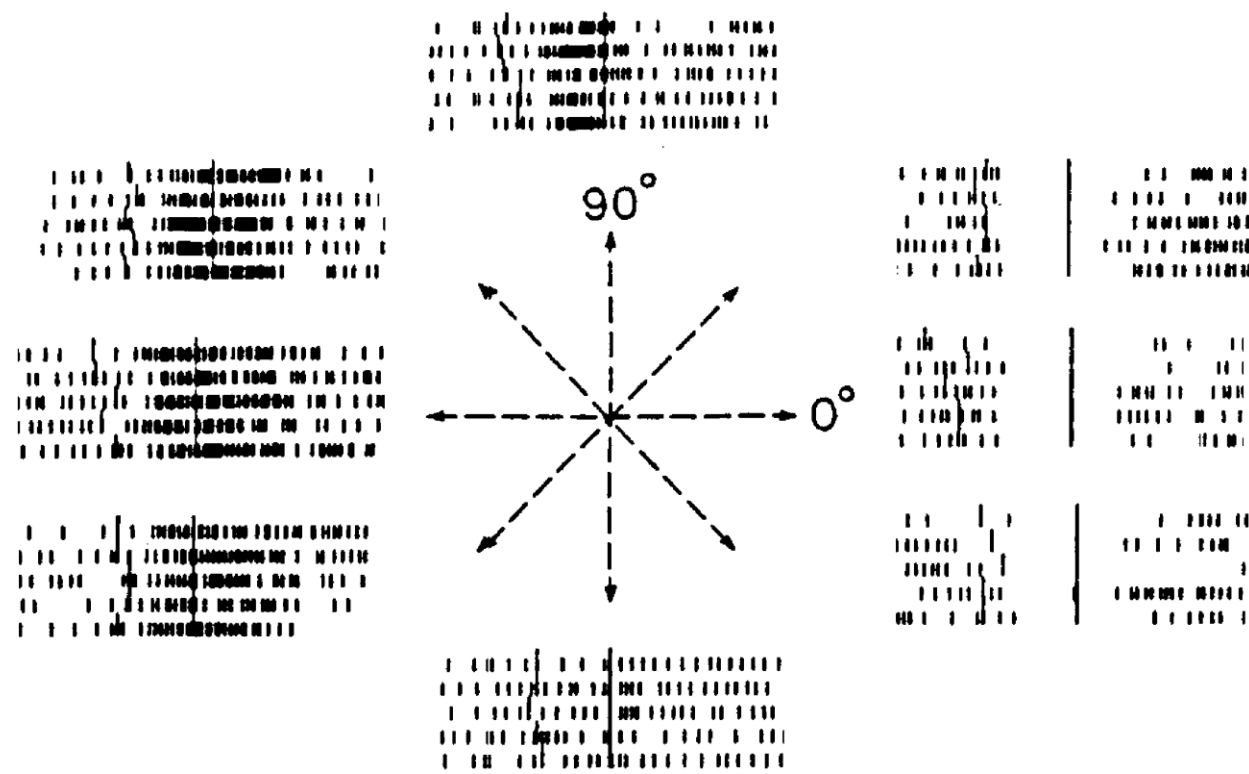


Gaussian tuning curve of a cortical (V1) neuron

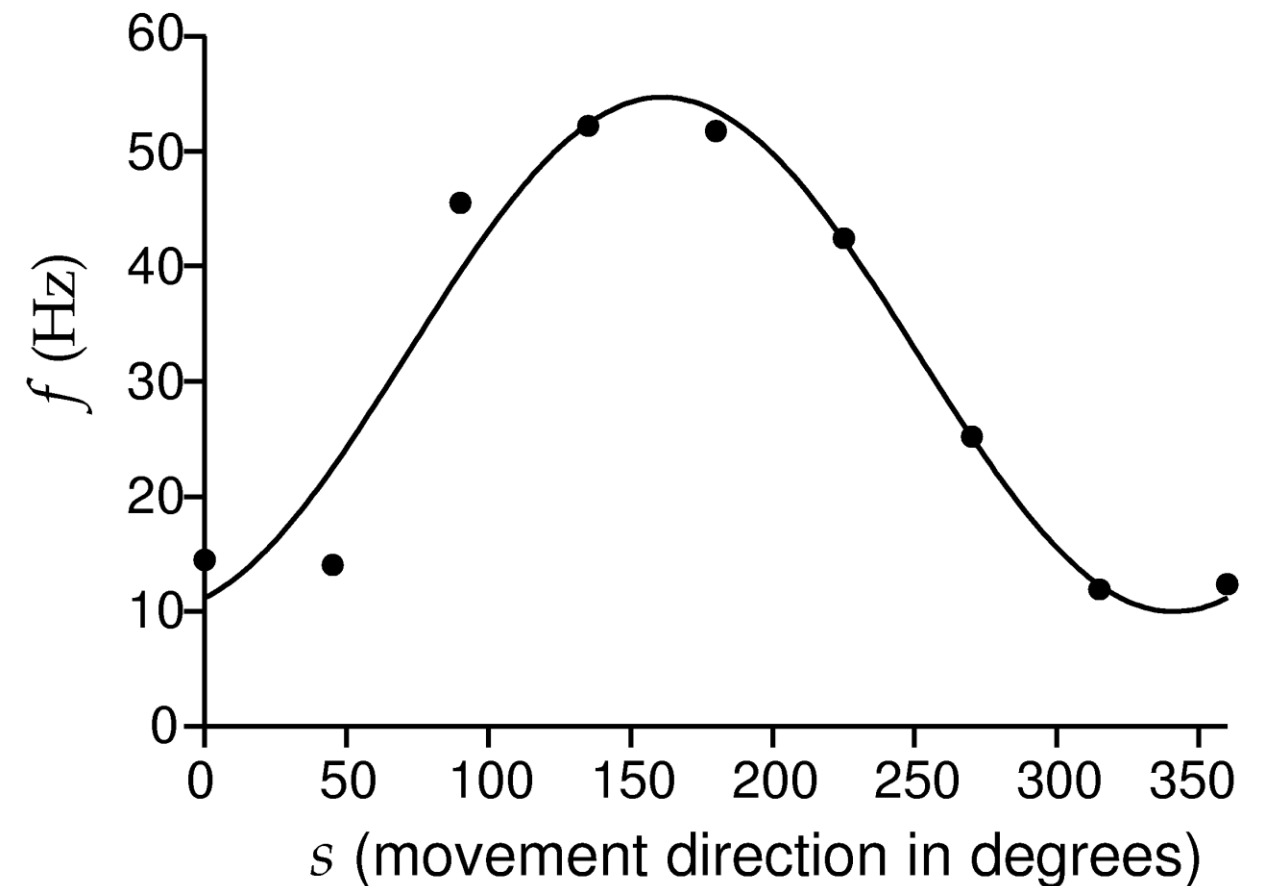
from Dayan and Abbott, *Theoretical Neuroscience*:  
adapted from Wandell '95, Hubel and Wiesel '68; data from Henry et al., '74



# Tuning curves



Hand reaching direction



Cosine tuning curve of a motor cortical neuron

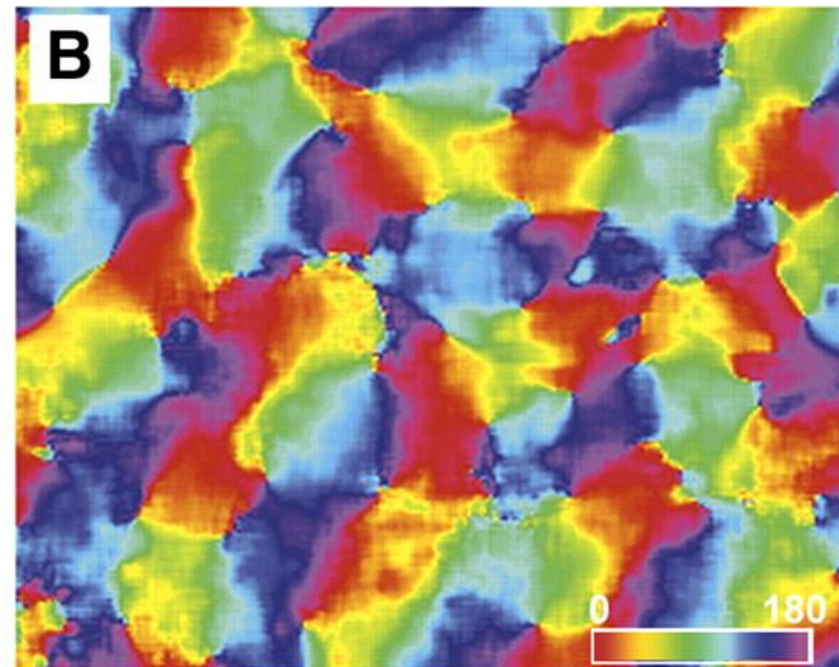
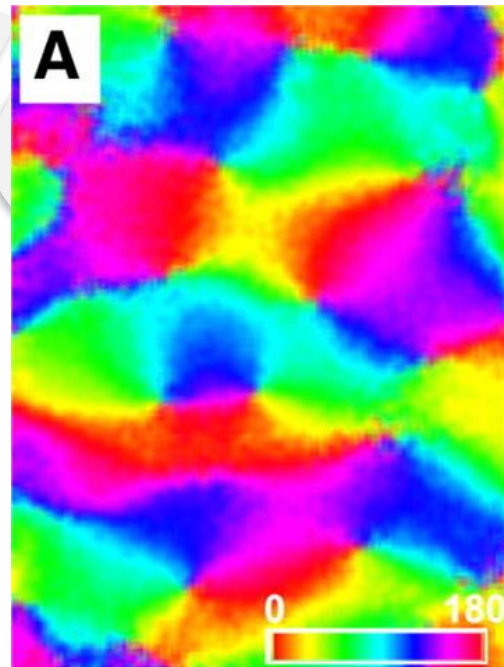
from Dayan and Abbott, *Theoretical Neuroscience*:  
adapted from Georgopoulos et al. '92

# Map of feature selectivity in primary visual cortex

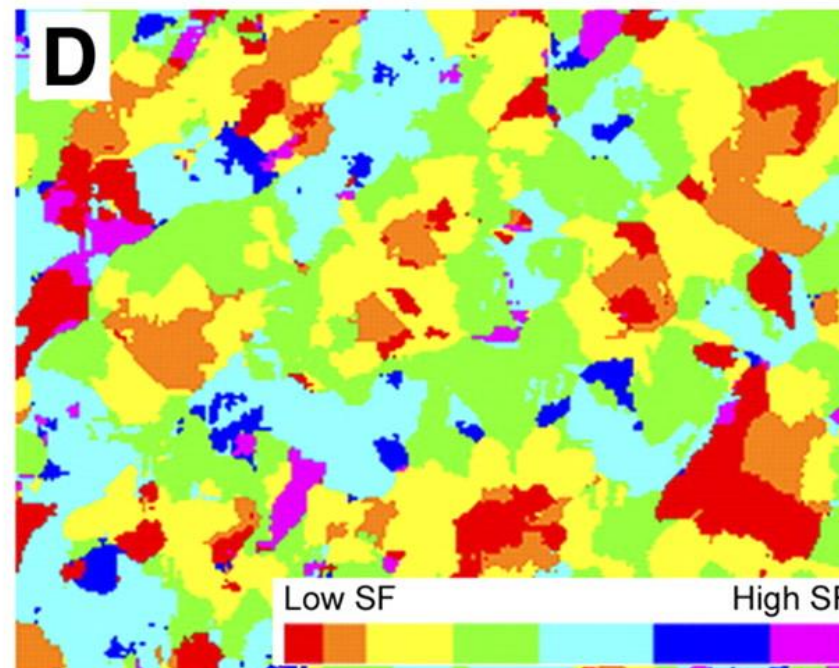
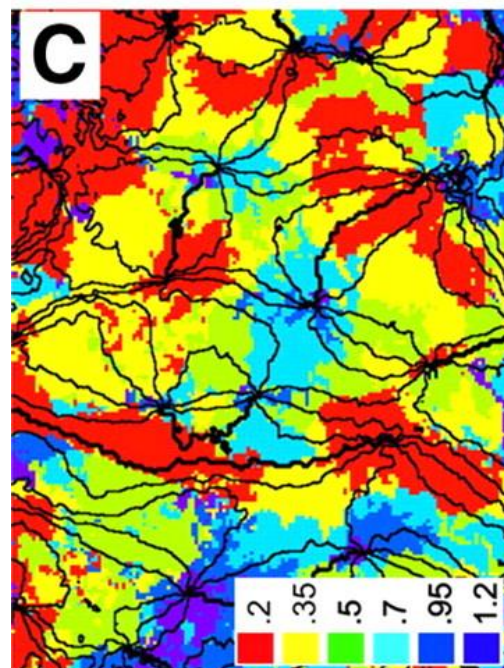
Cat

Bush baby

Orientation

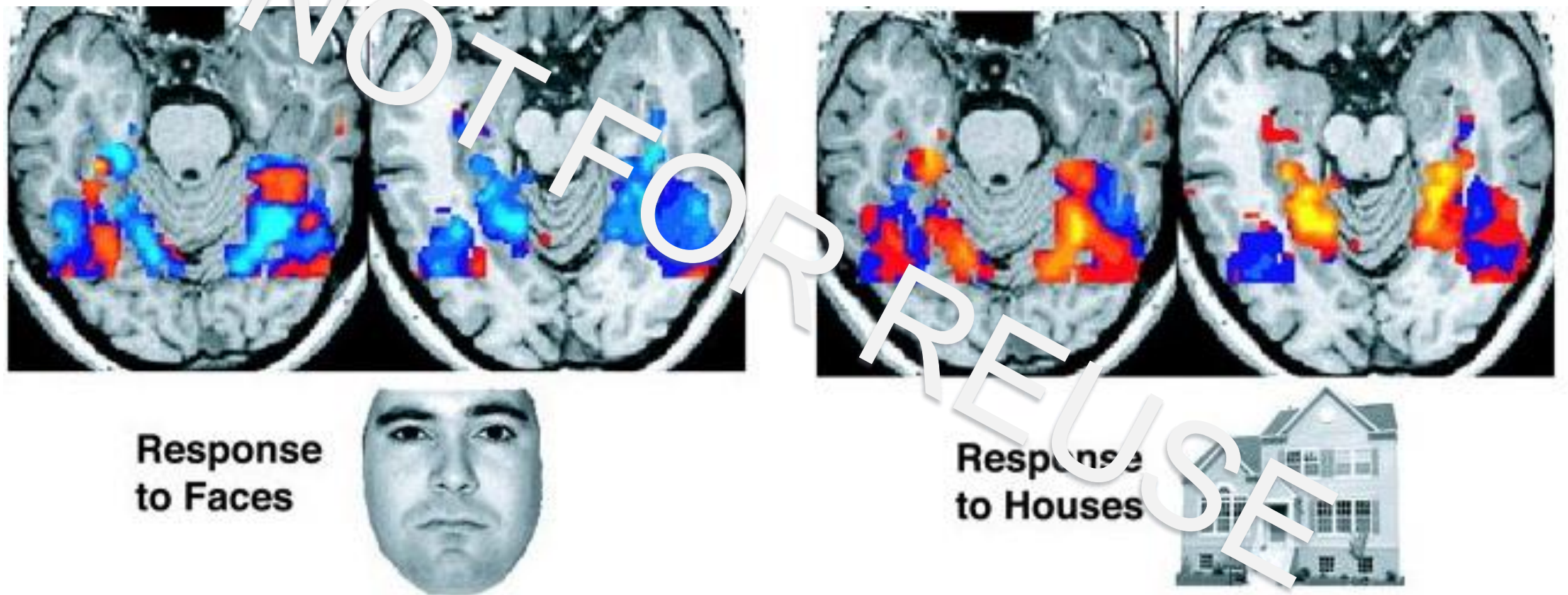


Spatial  
frequency





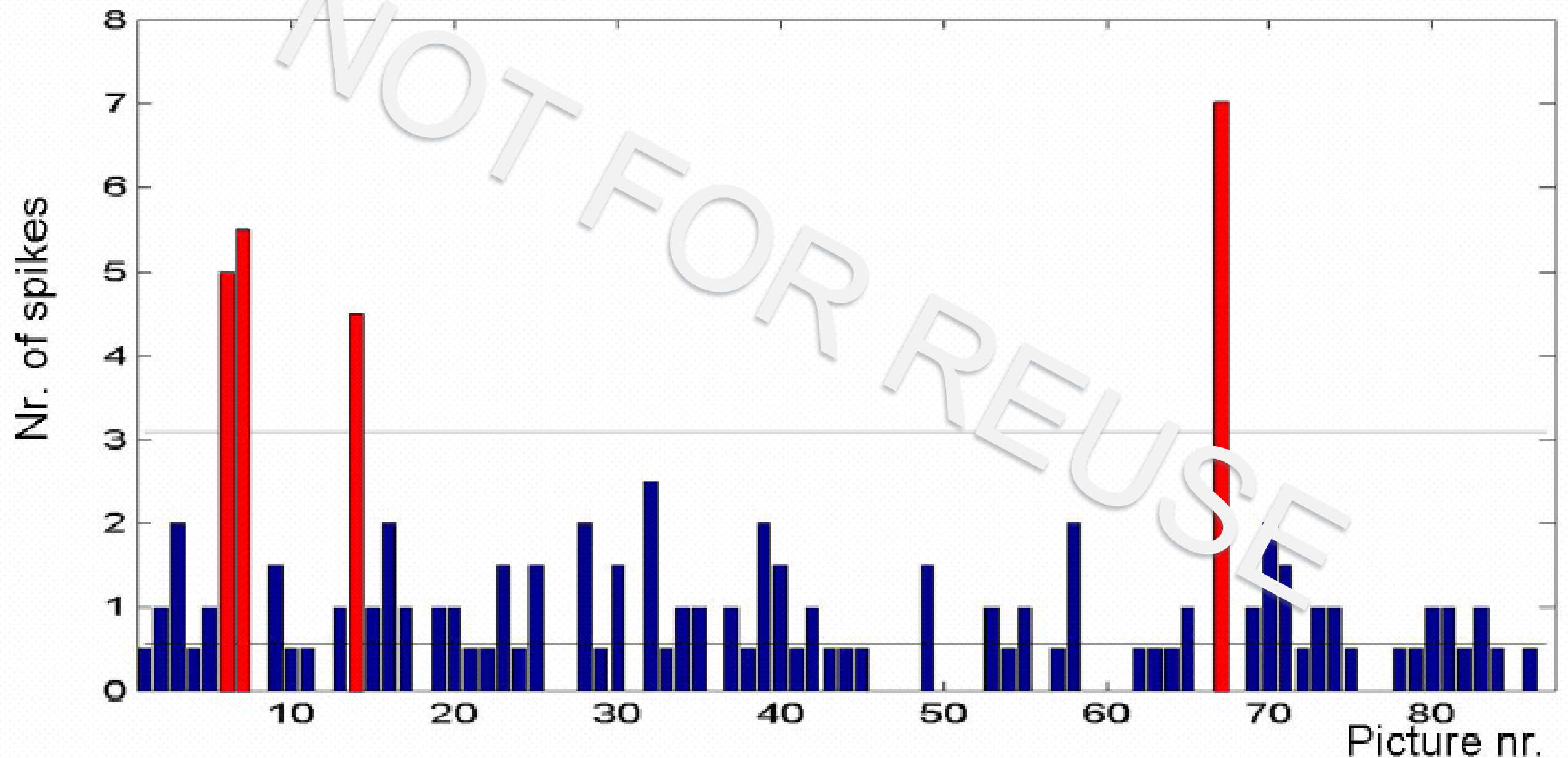
# Higher order feature selectivity



Haxby et al., *Science* (2001)

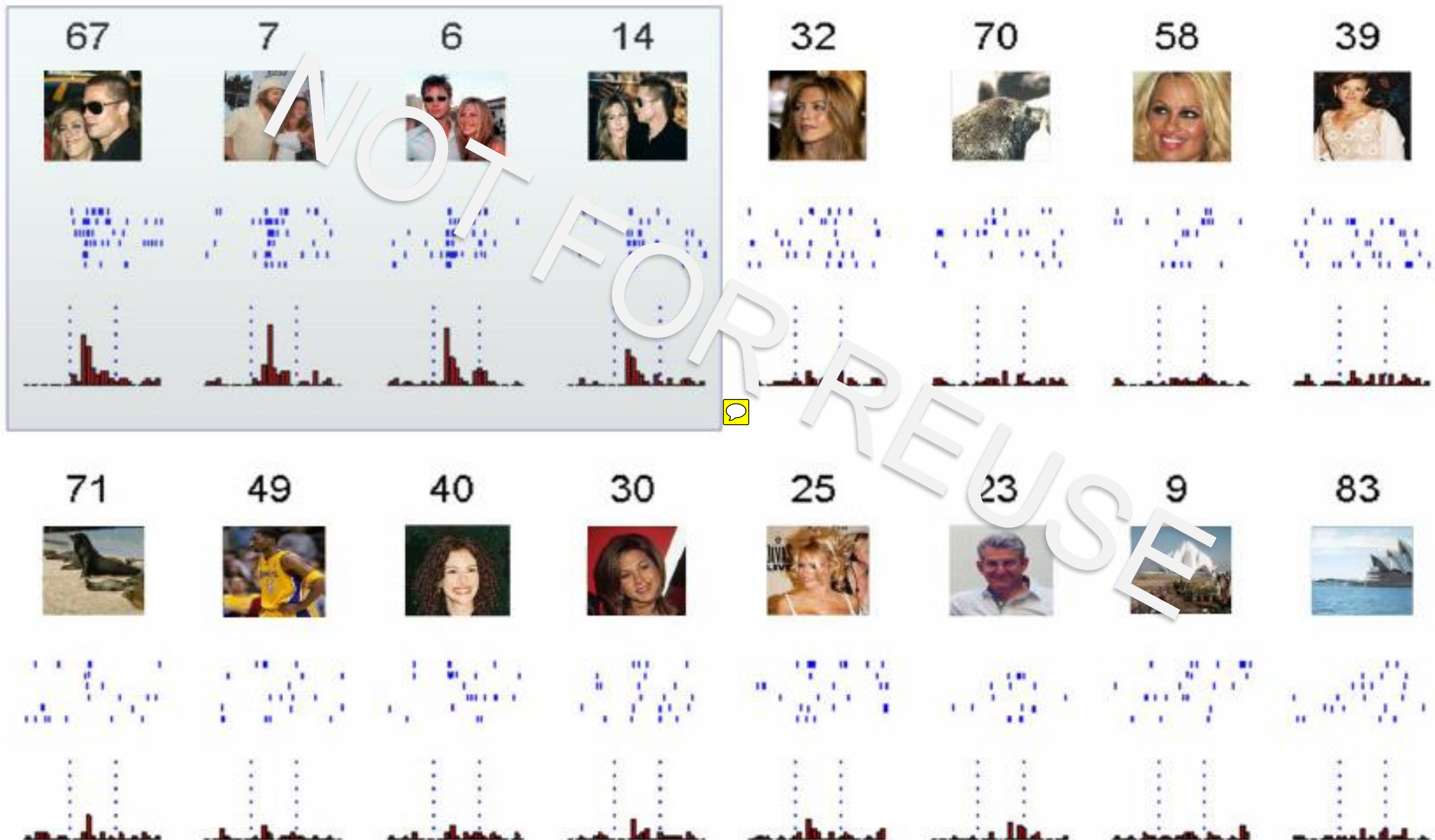


# “Tuning curves”



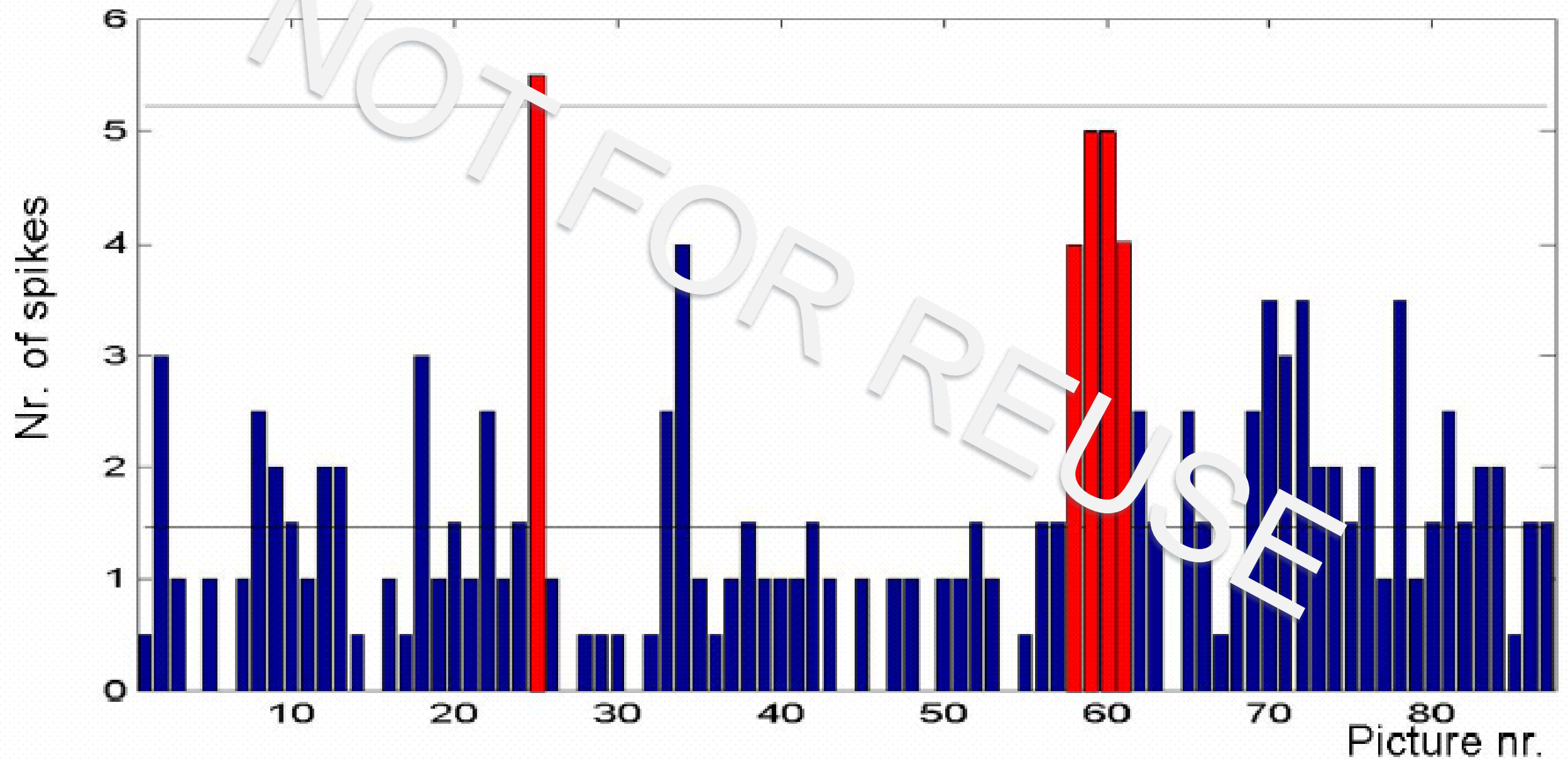
Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)

# What is the stimulus $s$ ?



Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)

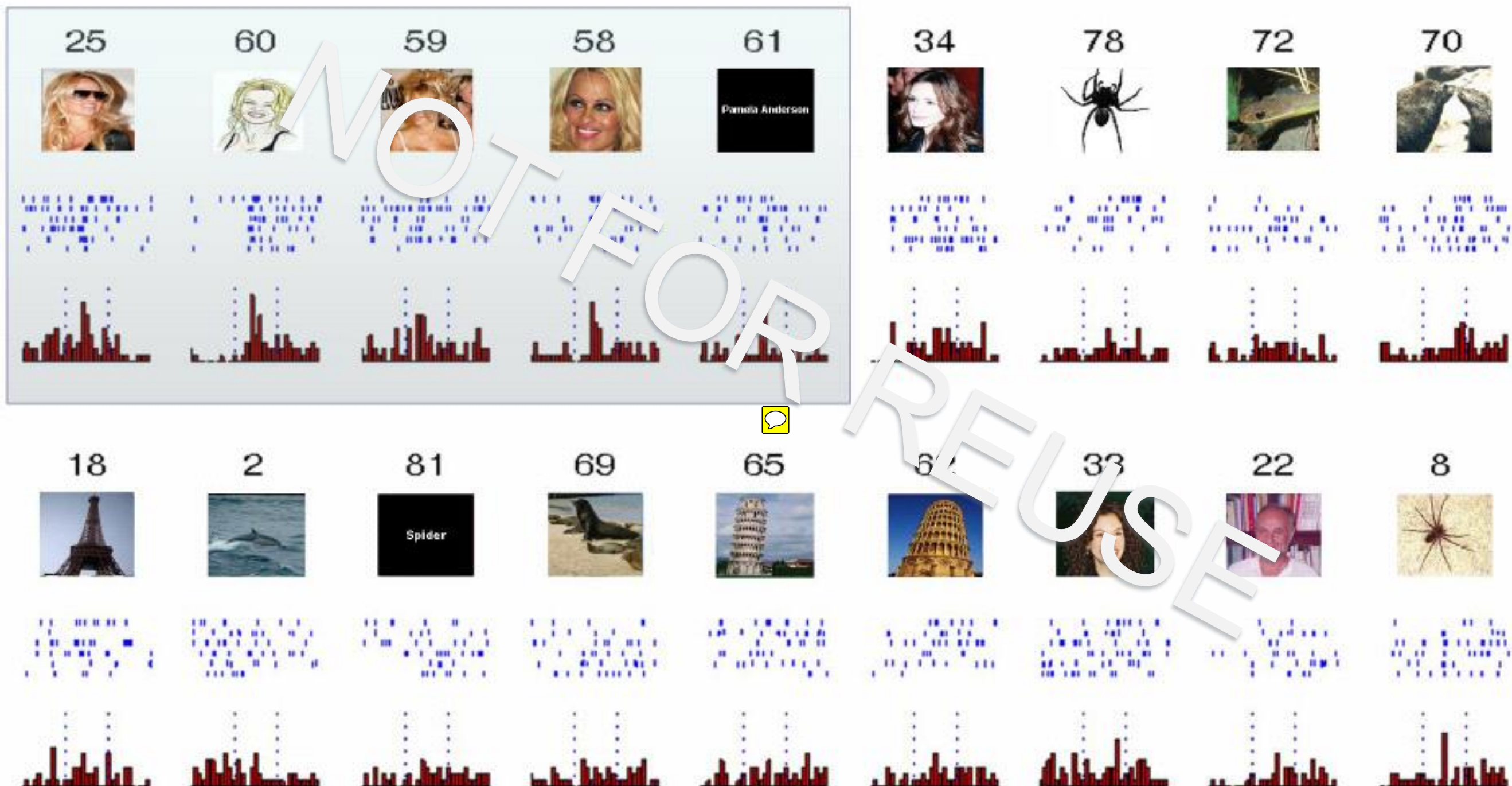
# Tuning curves



Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)



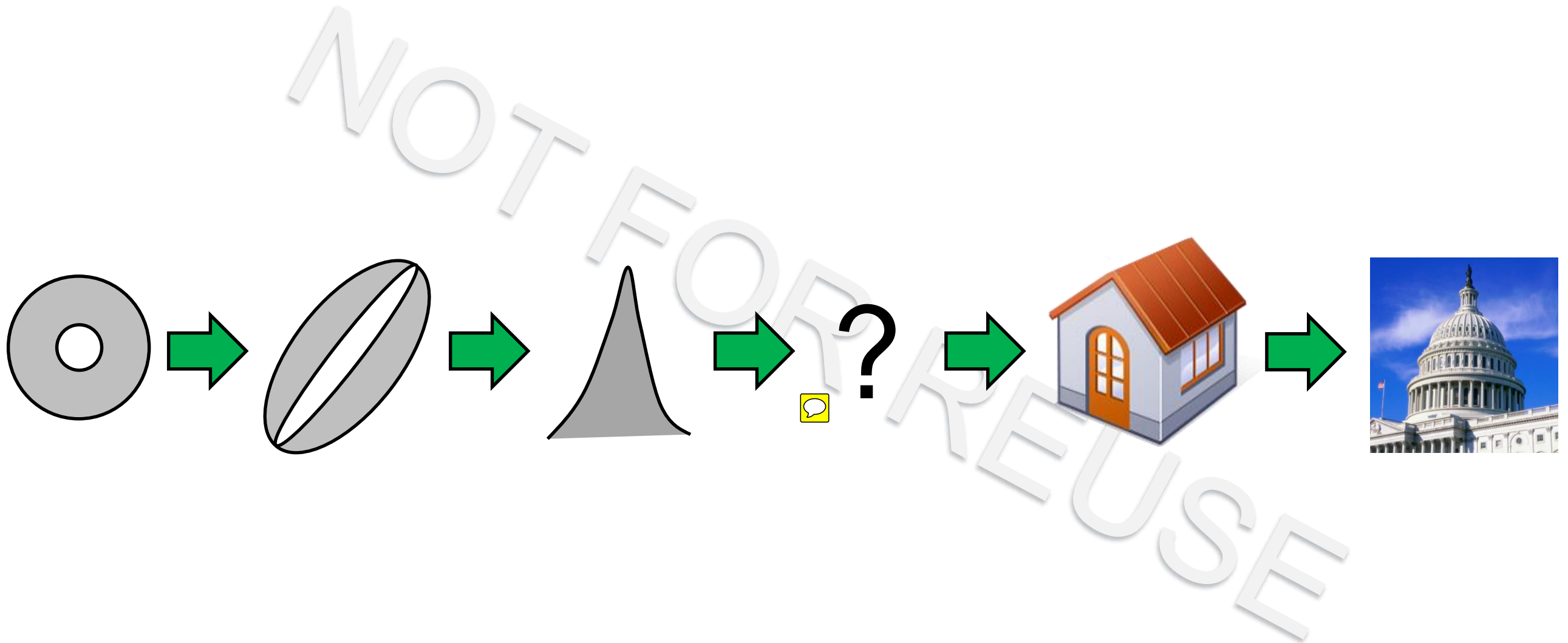
# What is $s$ ?



Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)

# Building up complex selectivity

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# Top-down effects

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## Next up: constructing response models

$P(\text{response} \mid \text{stimulus})$