

Computational neuroscience



What is the neural code?

- 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

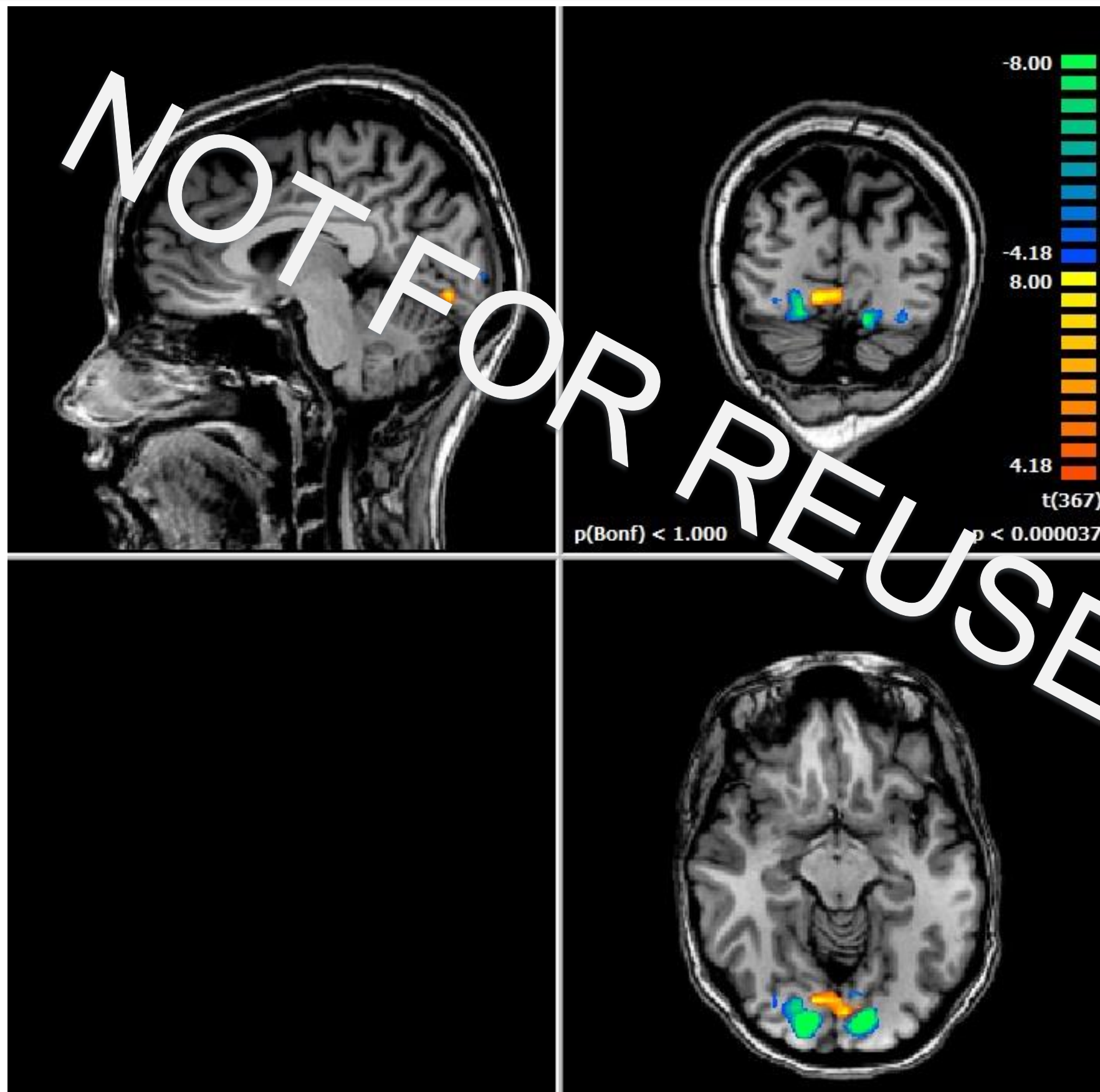
NOT FOR REUSE

Recording from the brain: fMRI



Scott Murray

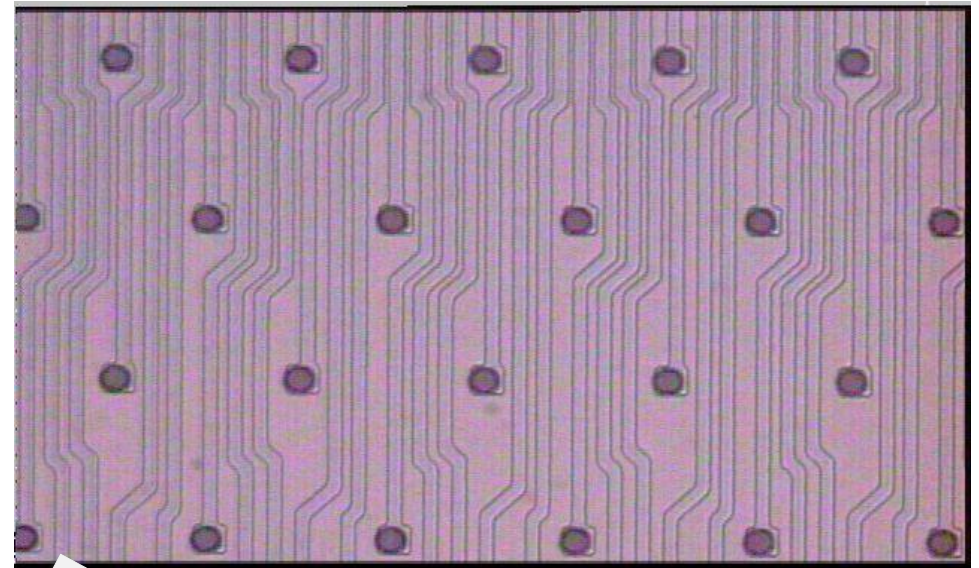
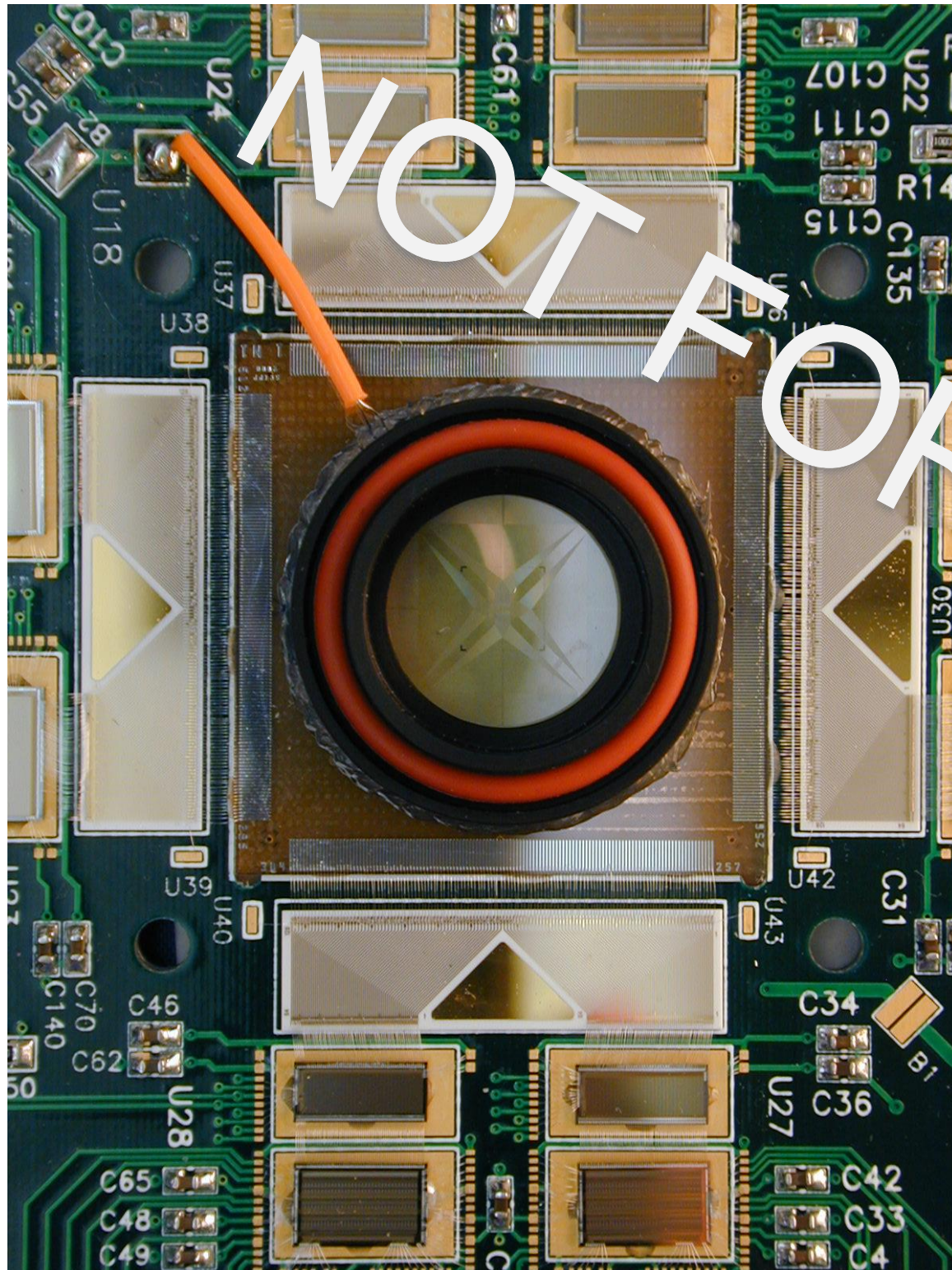
Recording from the brain: fMRI



Recording from the brain: EEG



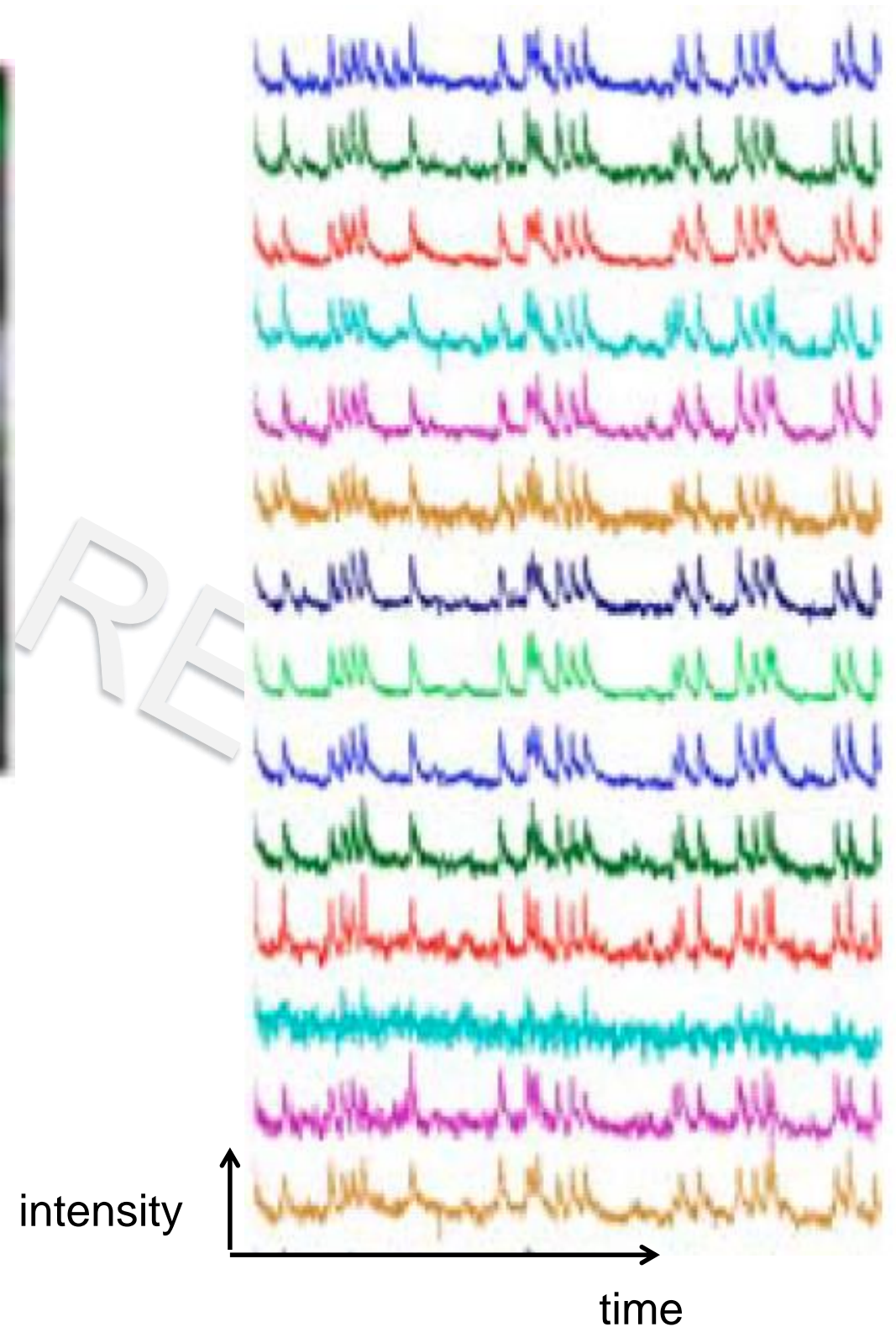
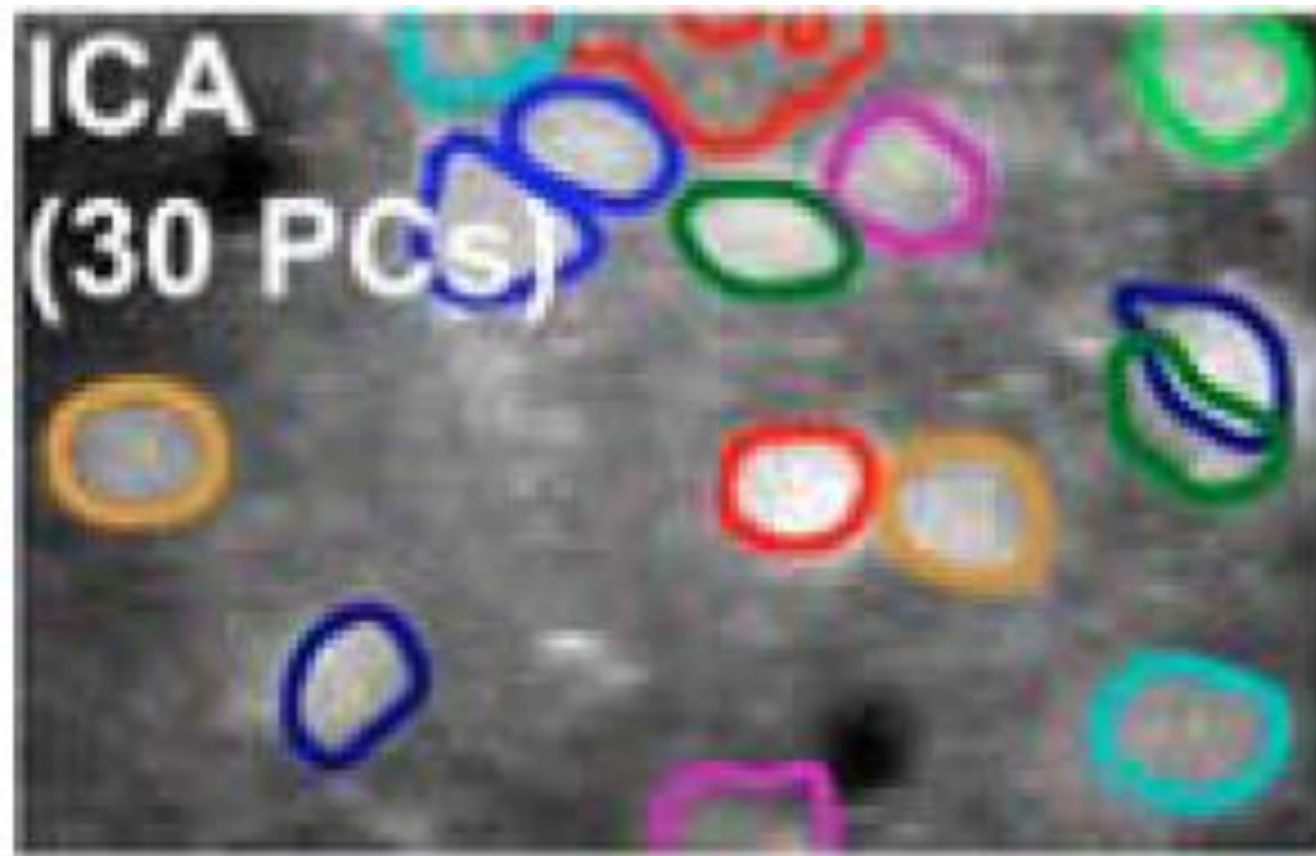
Reading out the neural code: electrode arrays



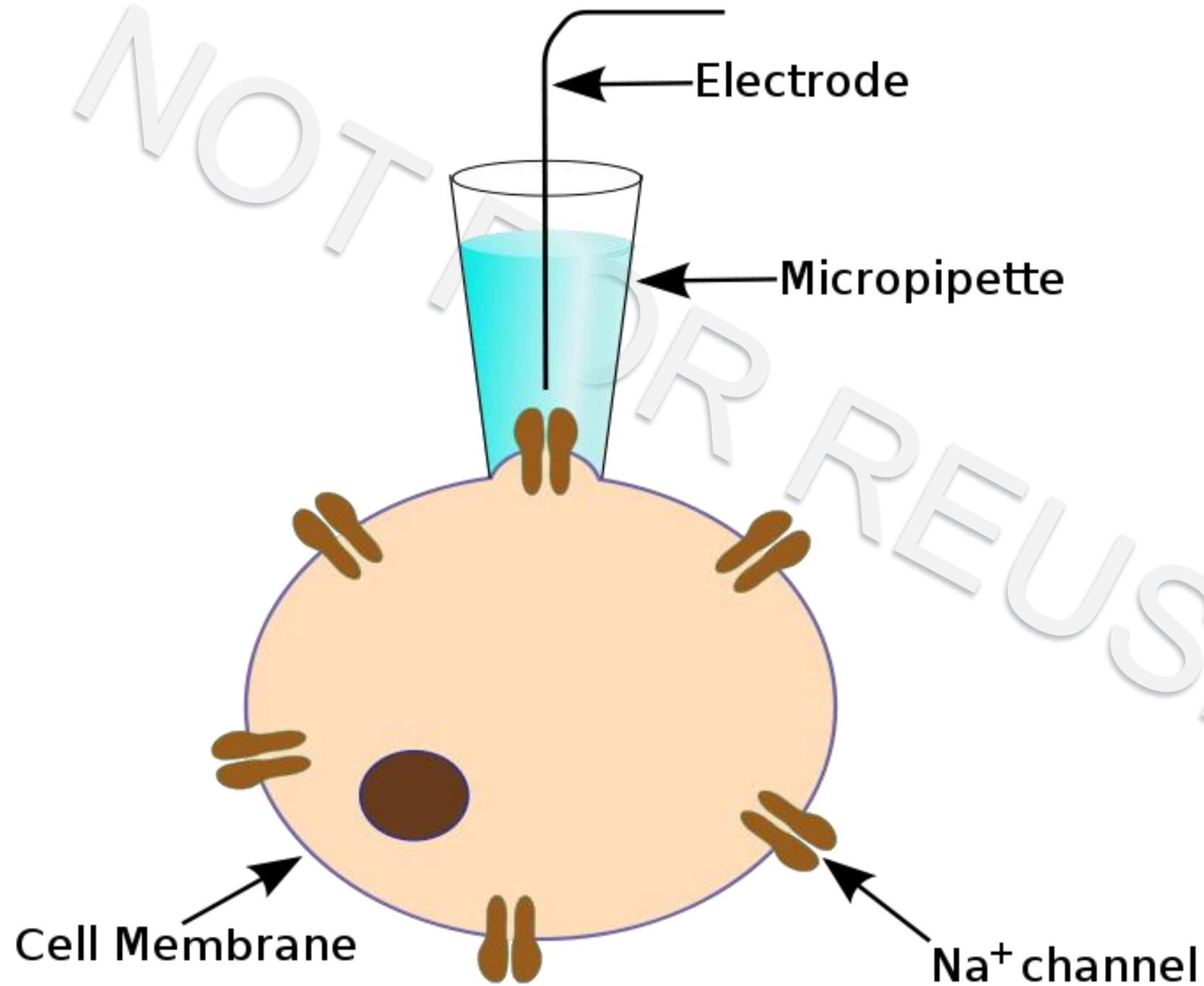
Reading out the neural code: electrode arrays



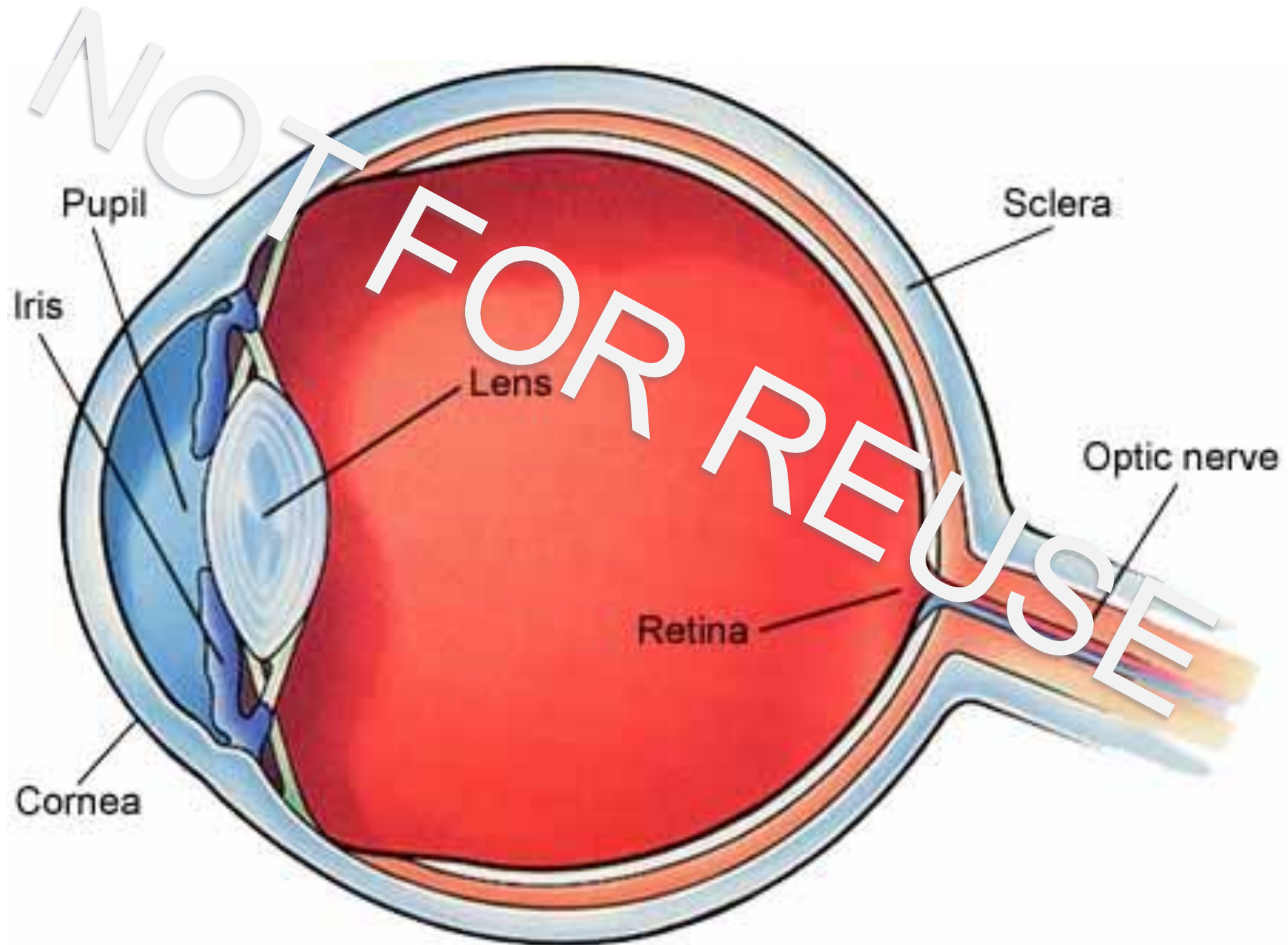
Reading out the neural code: calcium imaging



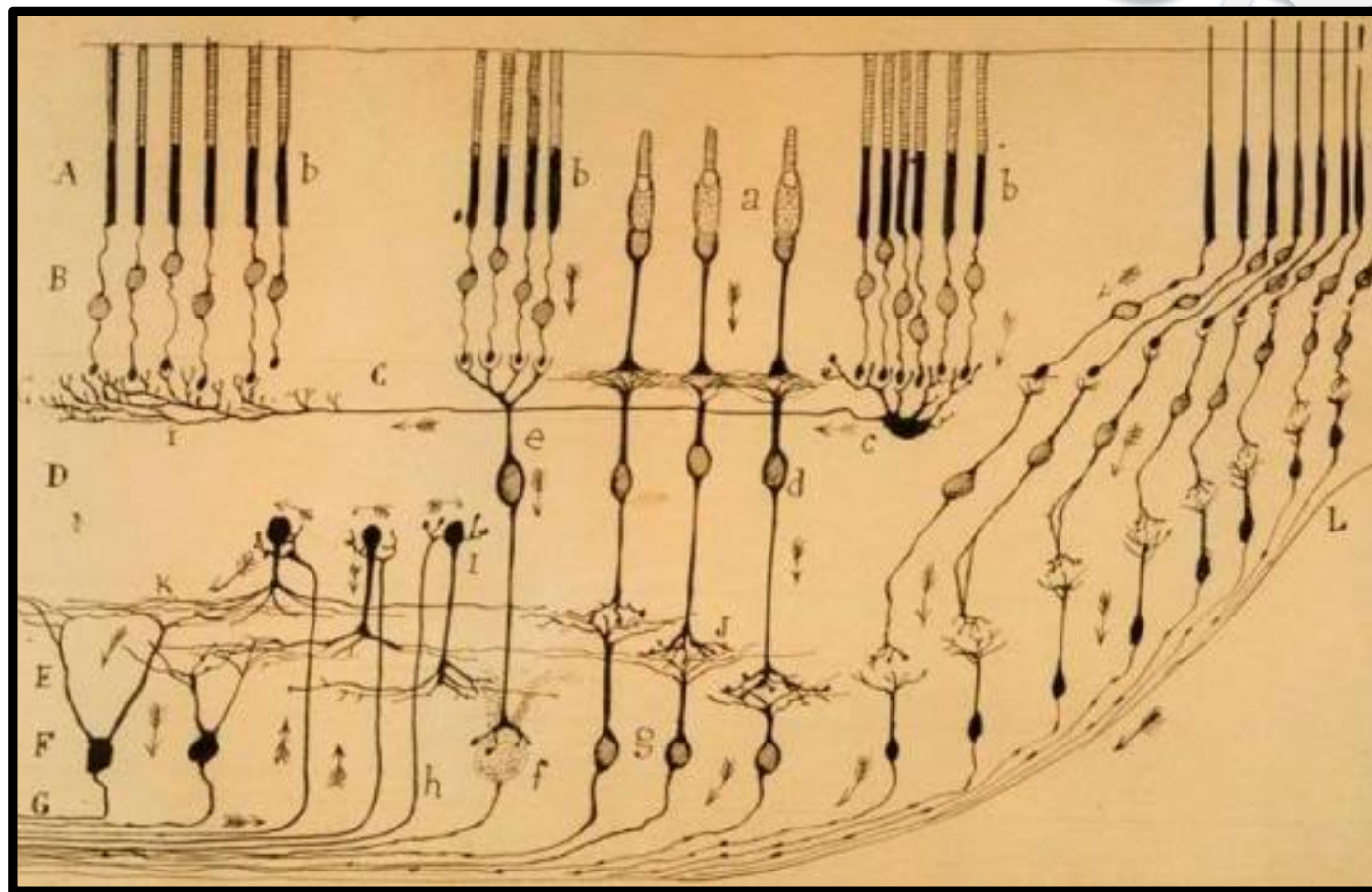
Looking inside single cells



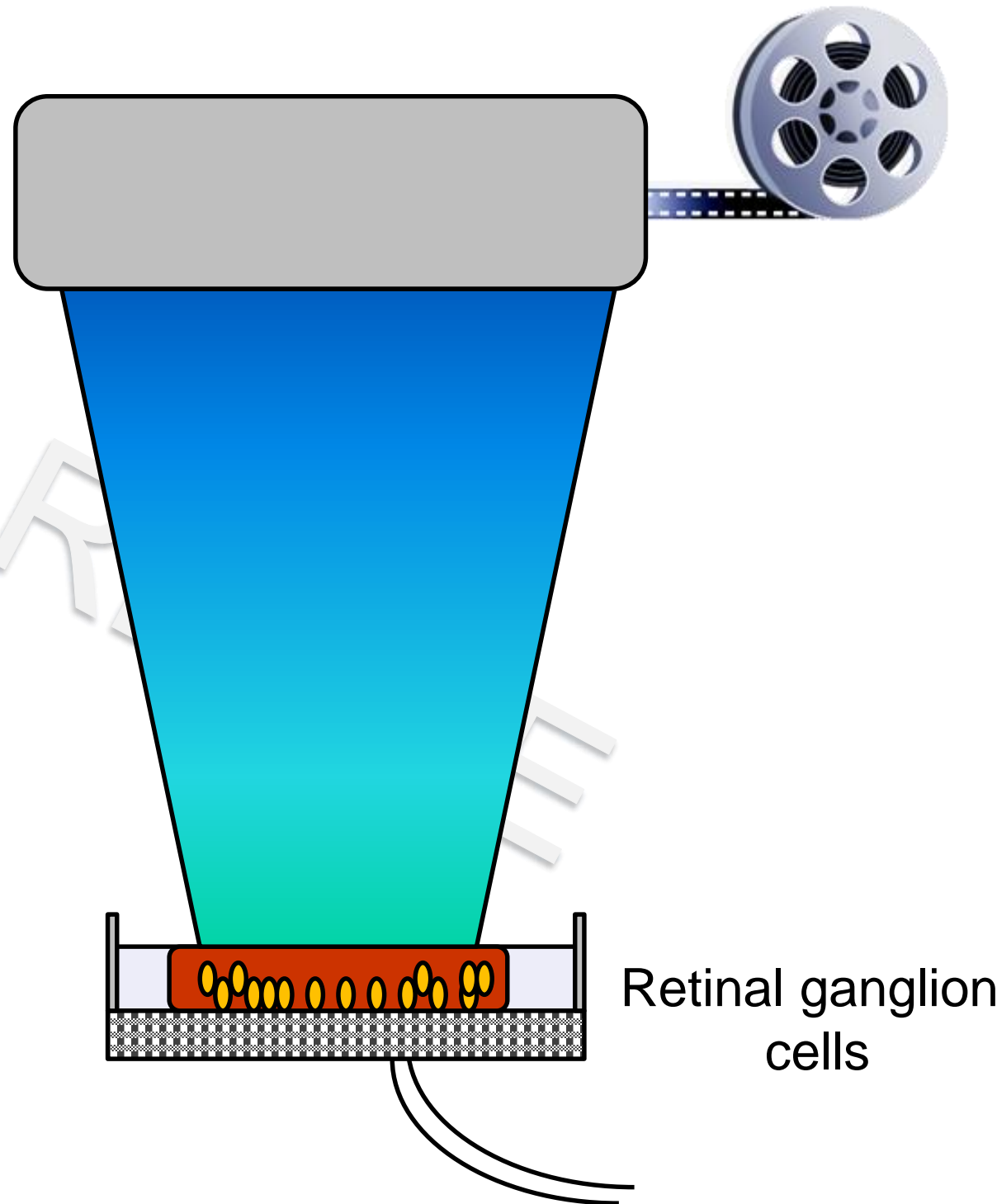
What is the neural code?



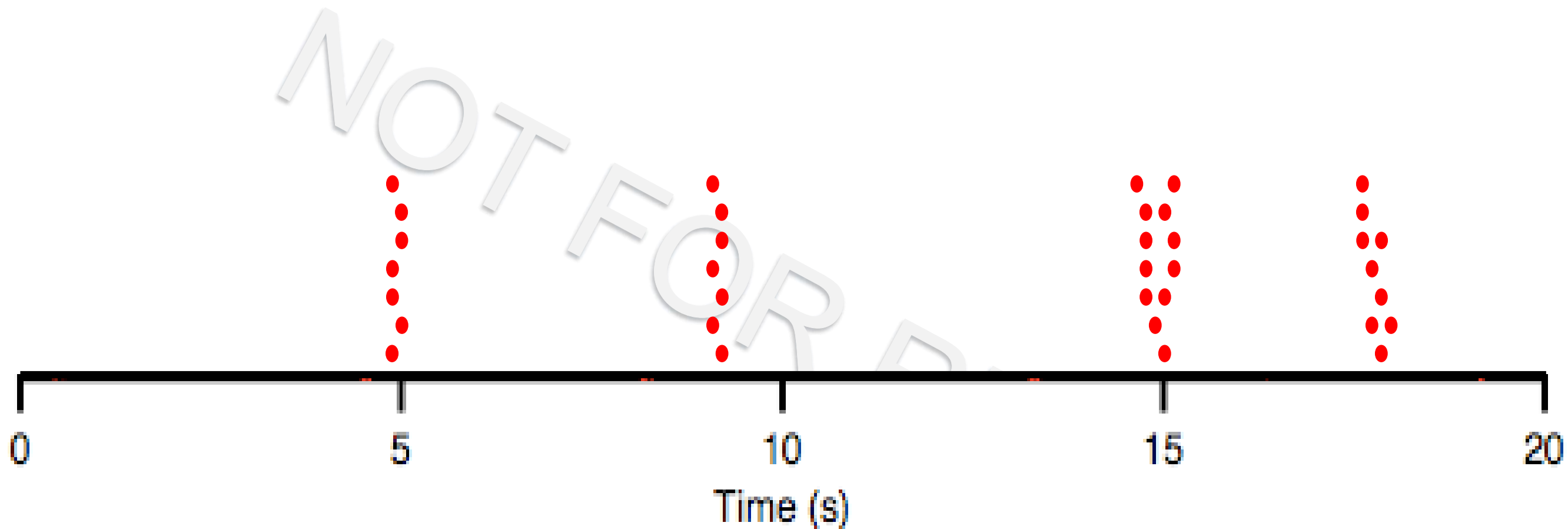
What is the neural code?



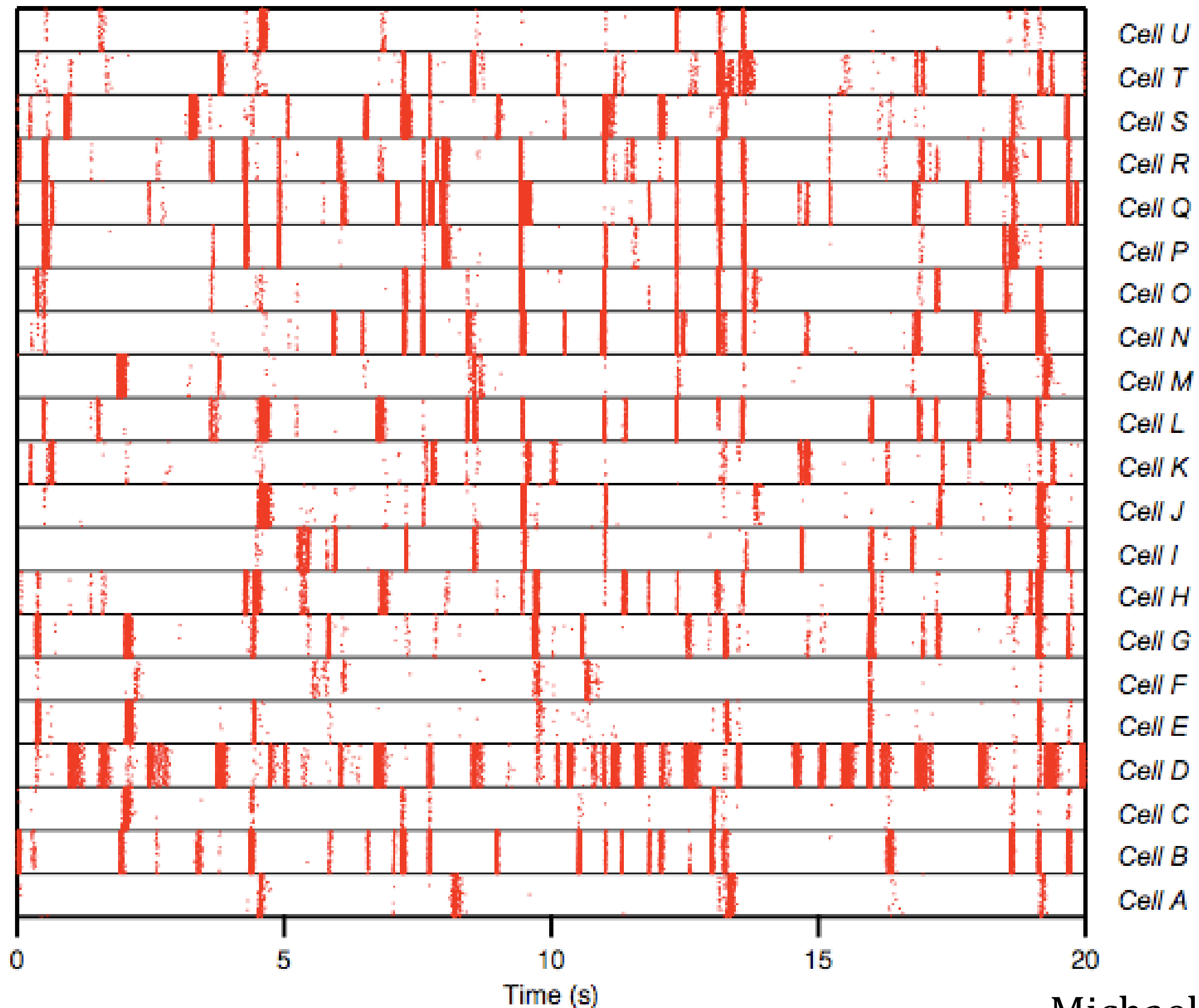
Ramon y Cajal, 1901



What is the neural code?



What is the neural code?



Encoding and decoding

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

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

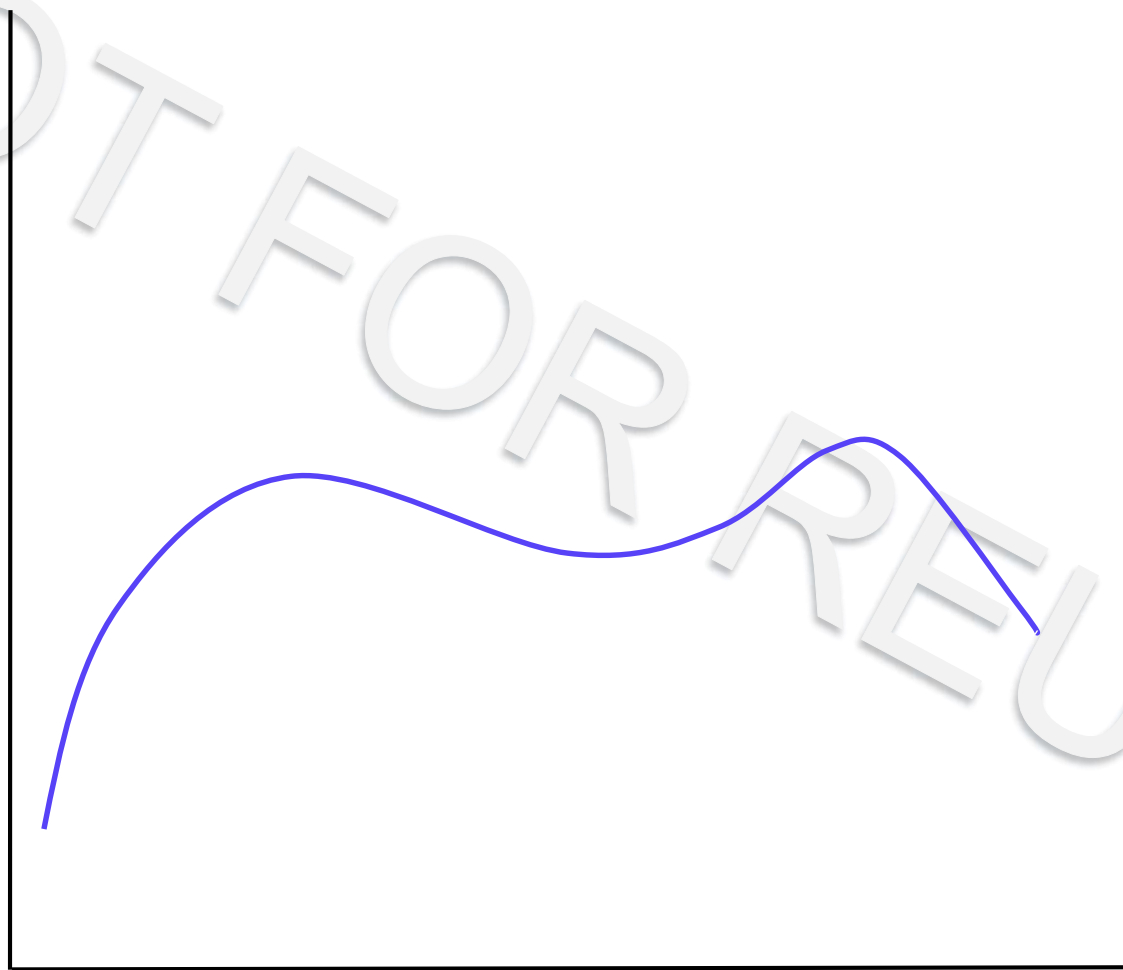
decoding

What is the response? What is the stimulus?

What is the relationship between them?

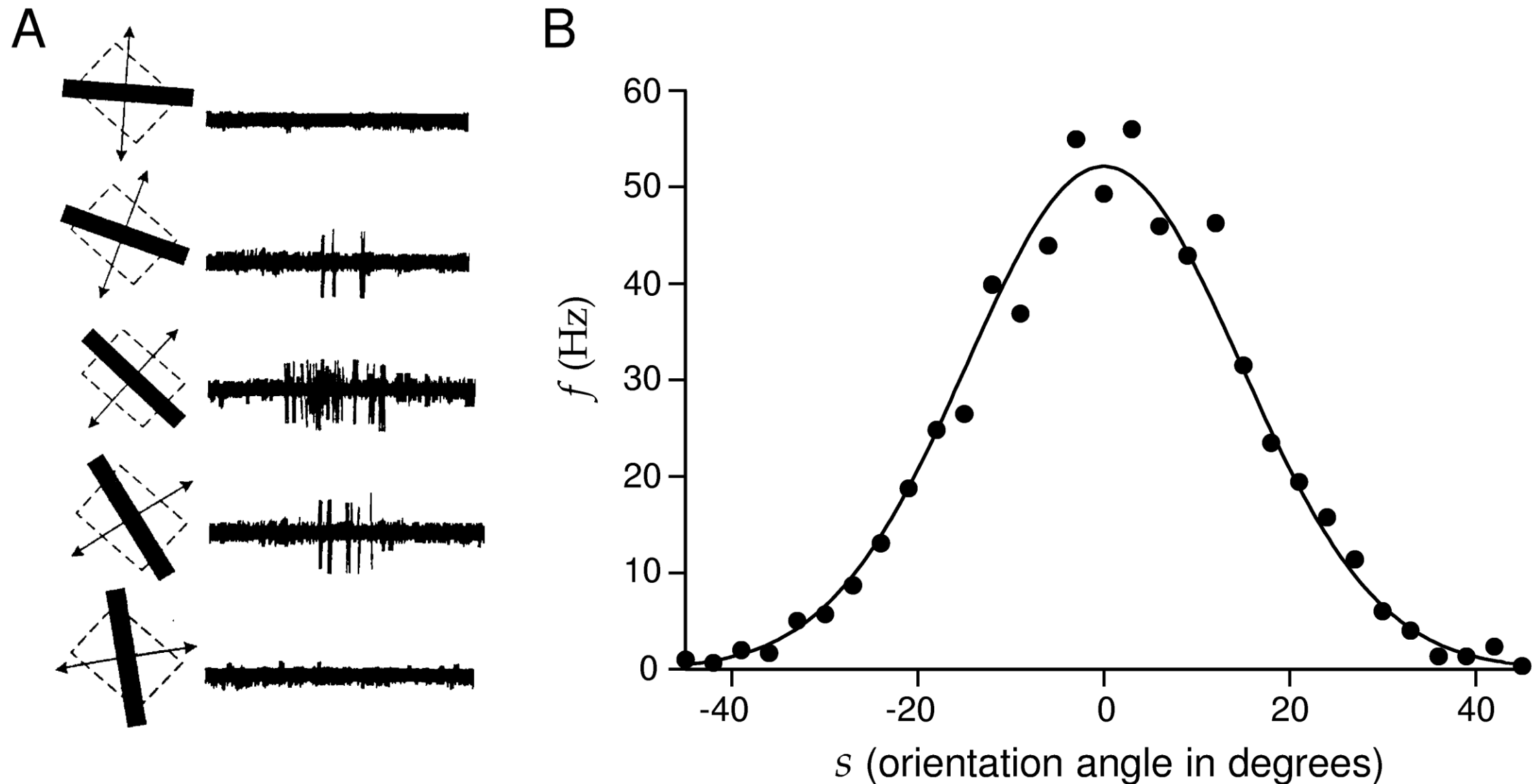
Neural representation of information

Neural response



Stimulus parameter

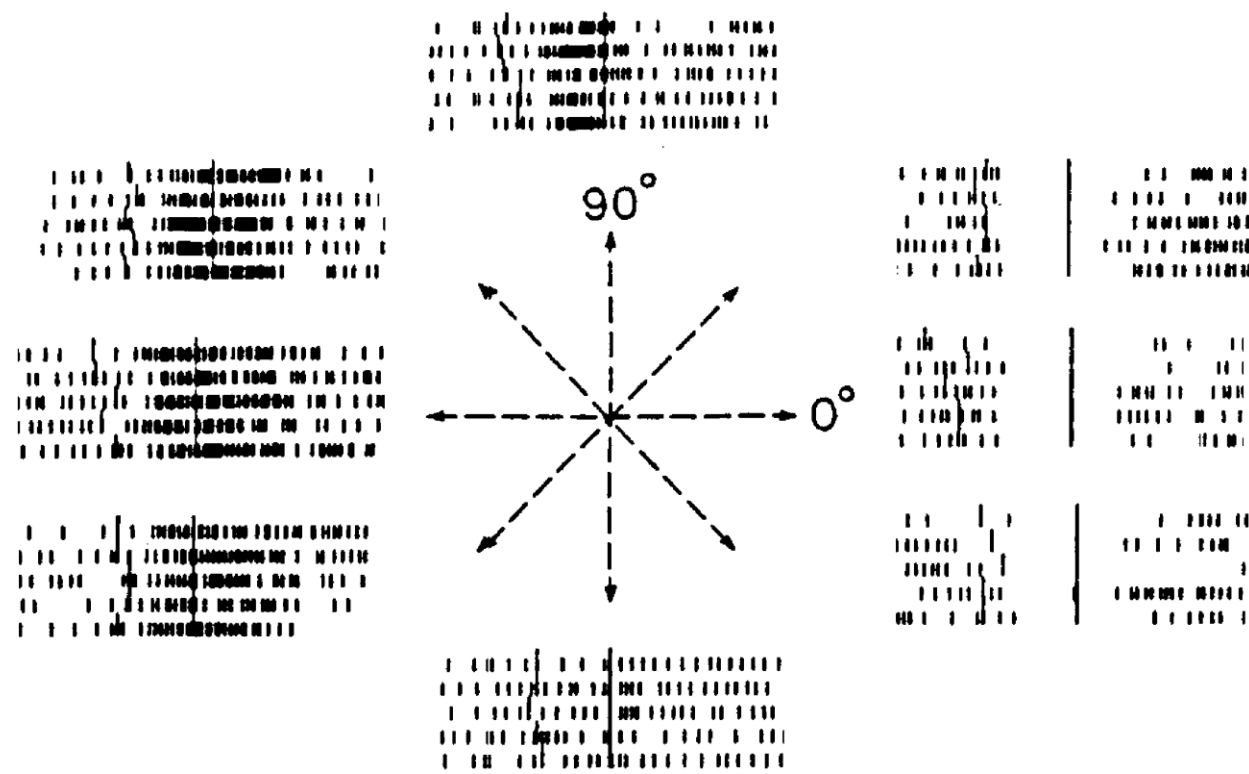
Tuning curves



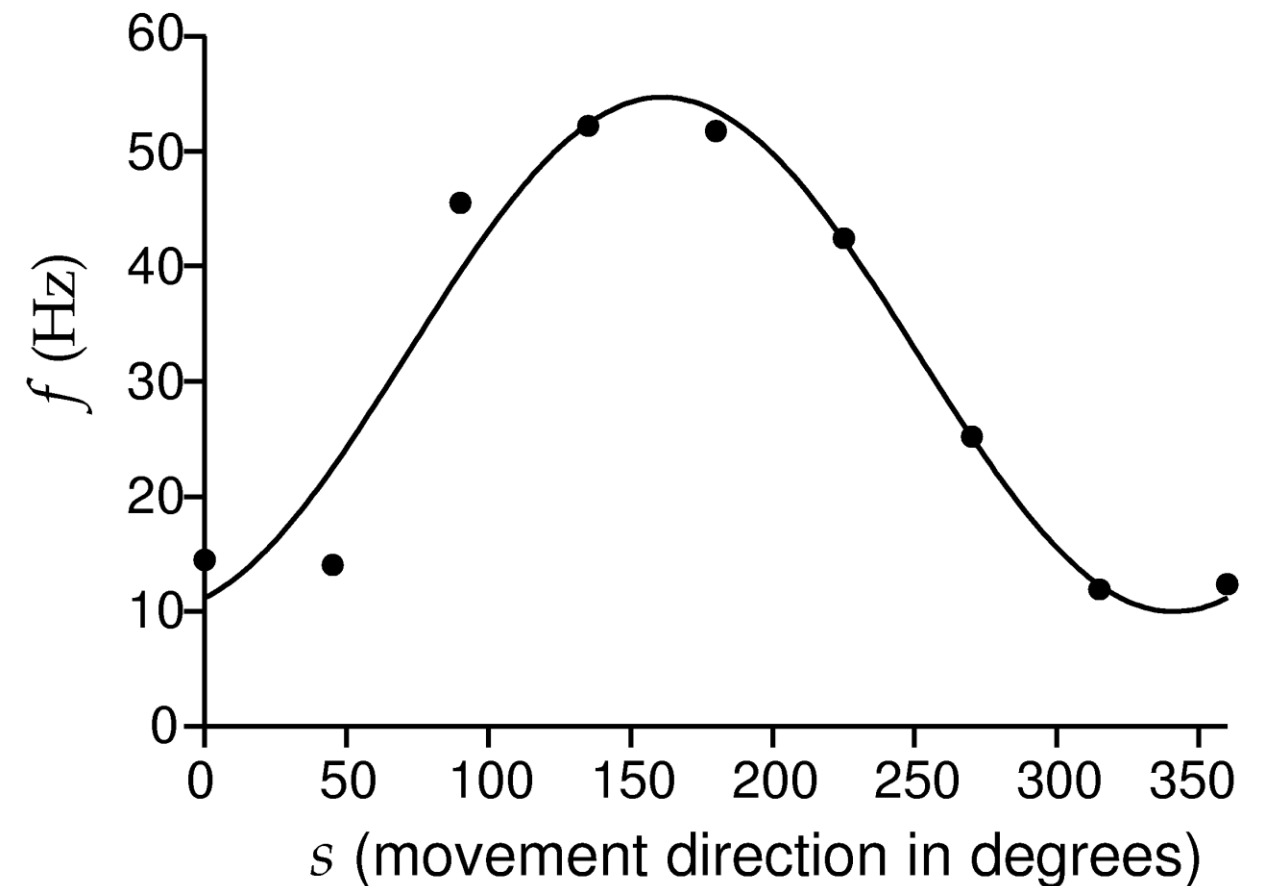
Gaussian tuning curve of a cortical (V1) neuron

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

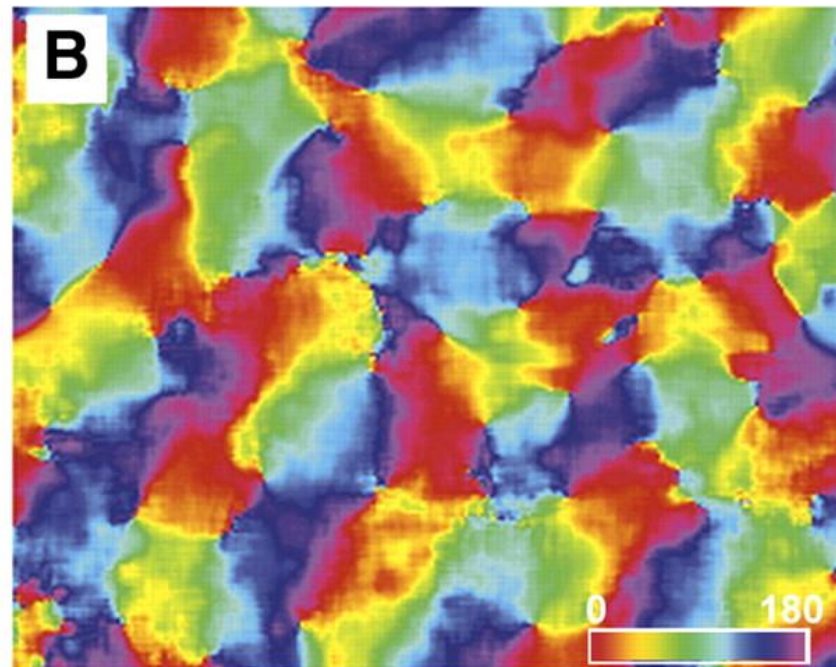
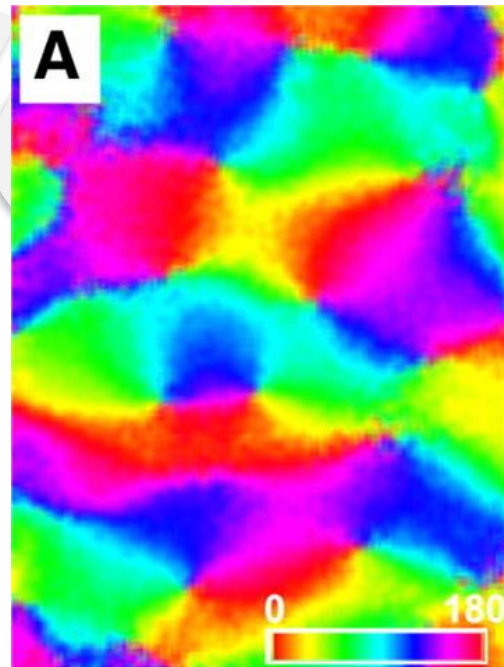
from Dayan and Abbott, *Theoretical Neuroscience*:
adapted from Georgopoulos et al. '92

Map of feature selectivity in primary visual cortex

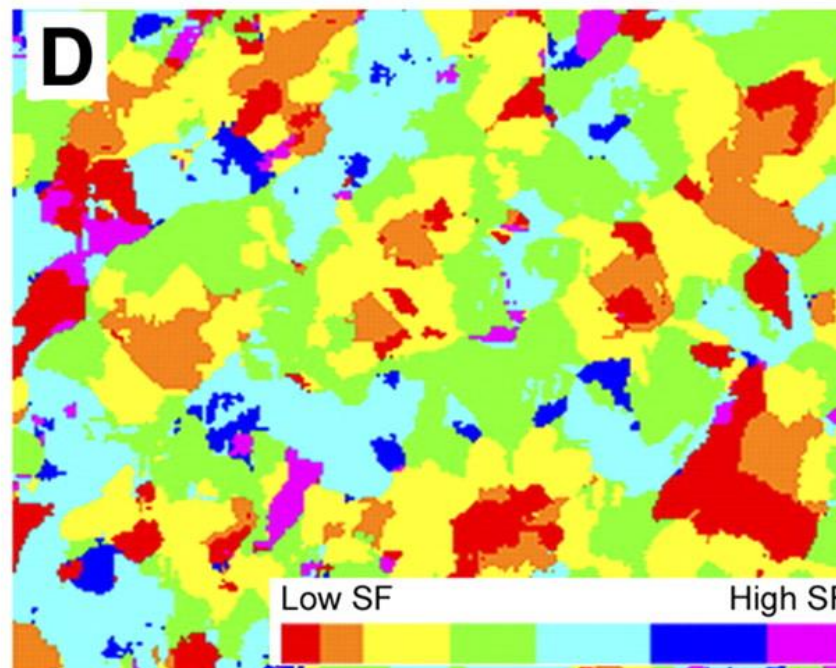
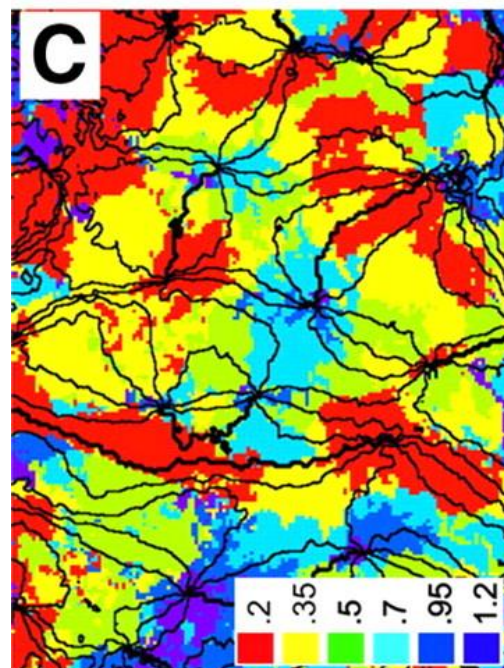
Cat

Bush baby

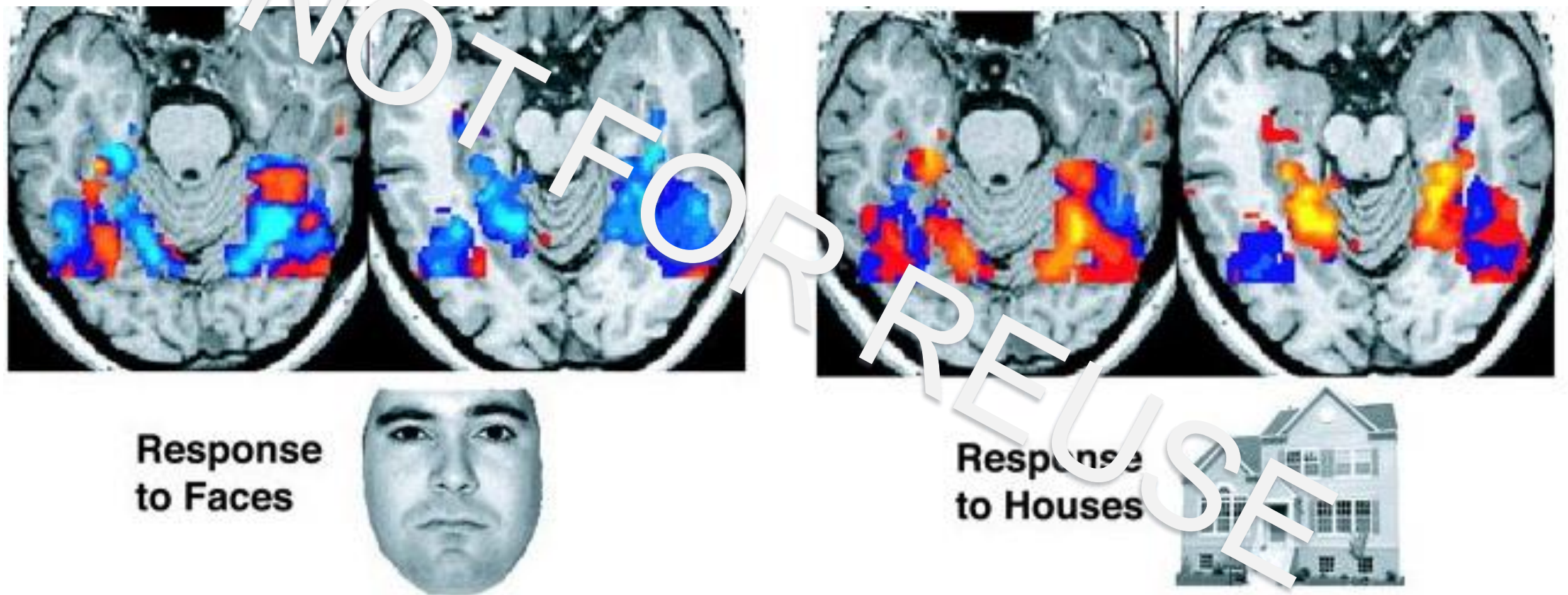
Orientation



Spatial
frequency

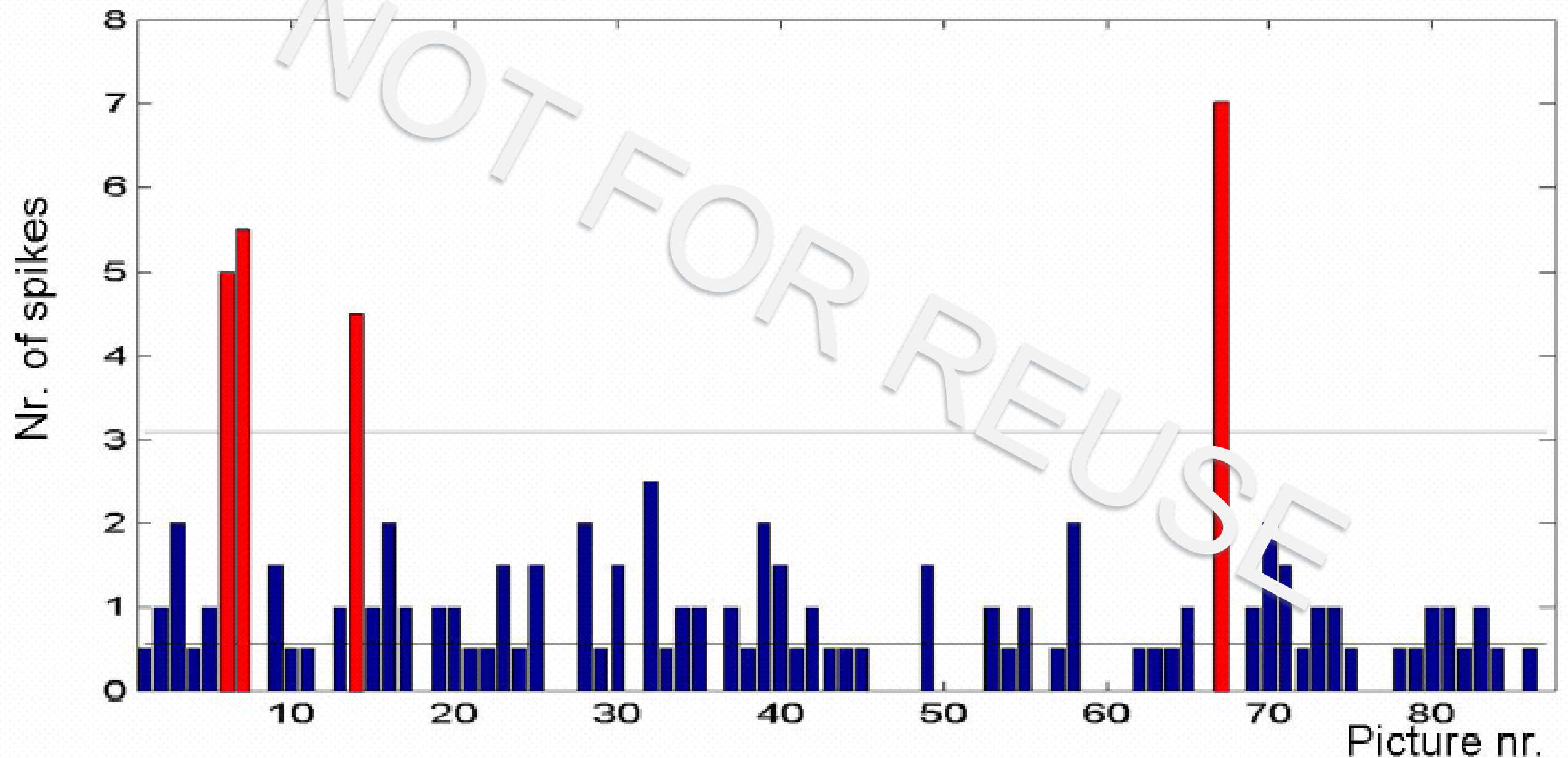


Higher order feature selectivity



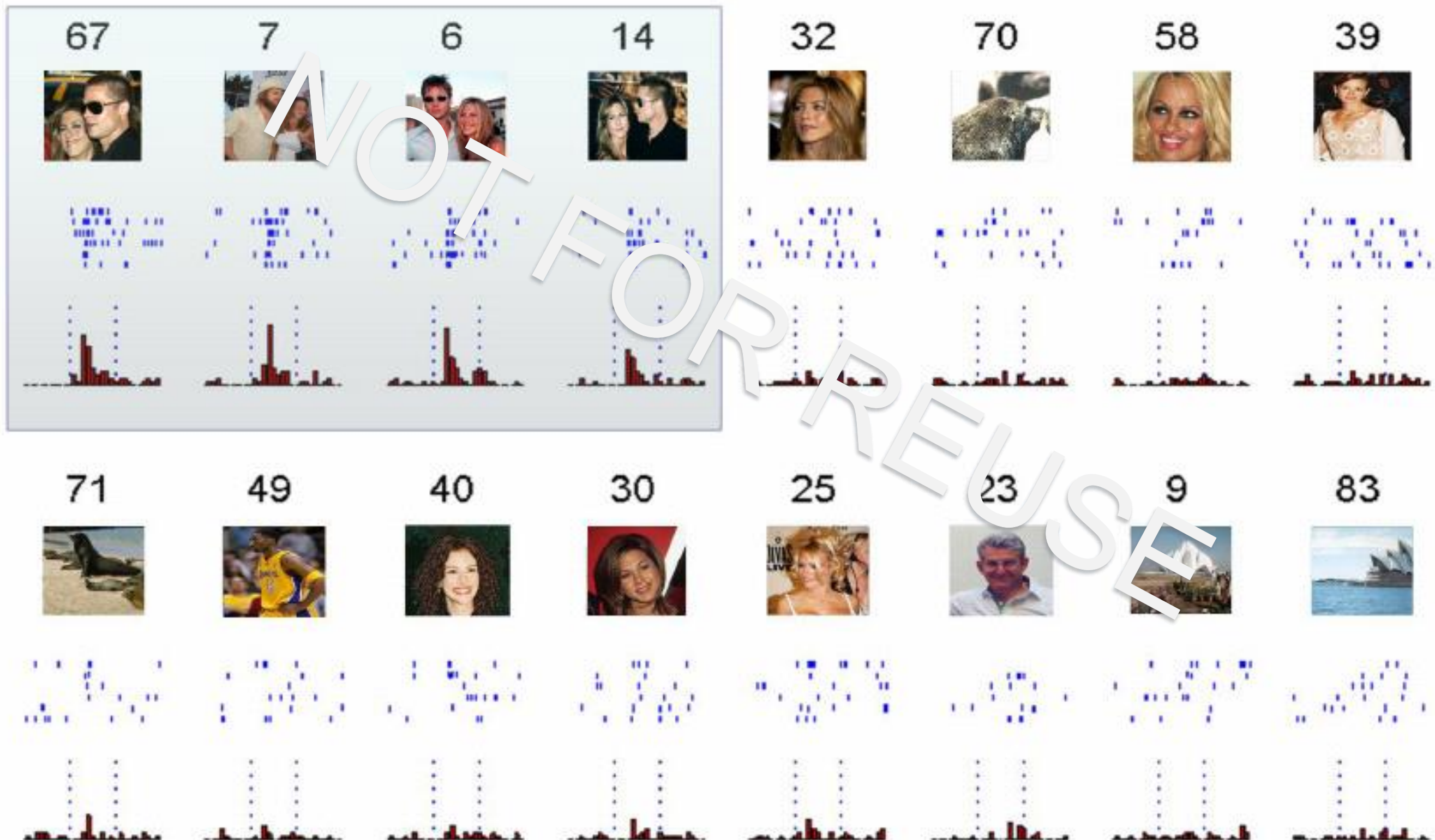
Haxby et al., *Science* (2001)

“Tuning curves”



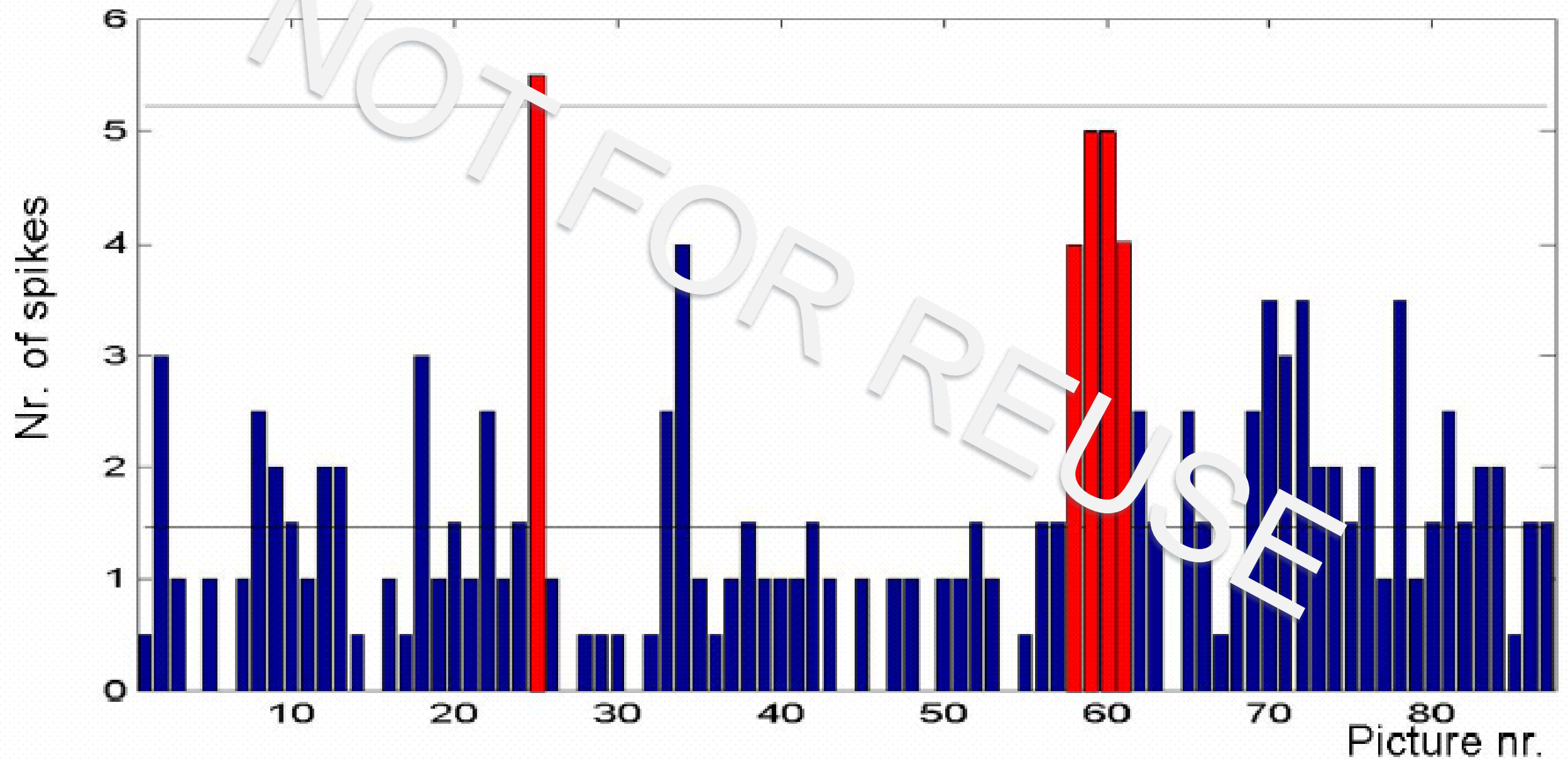
Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)

What is the stimulus s ?



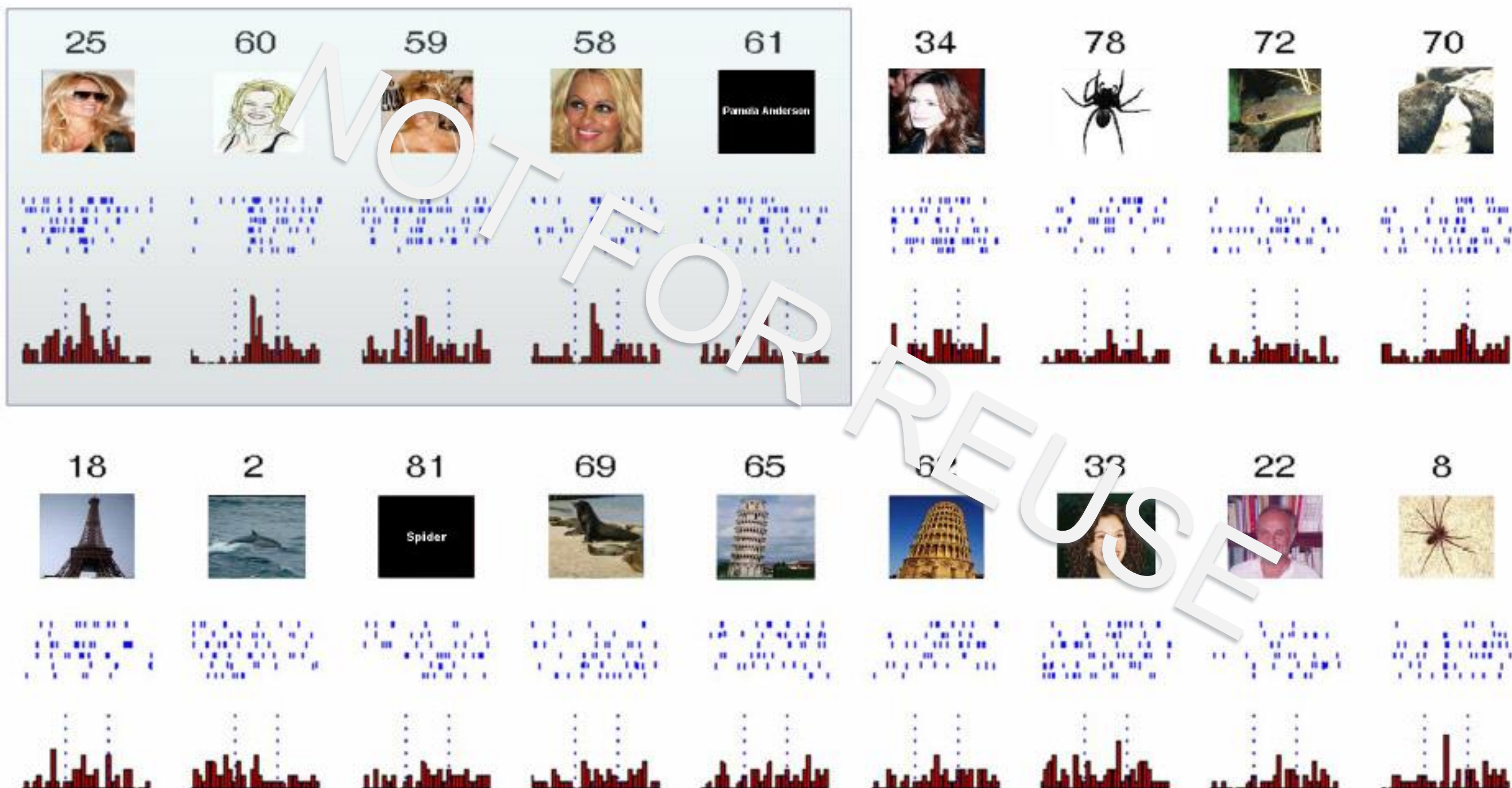
Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)

Tuning curves



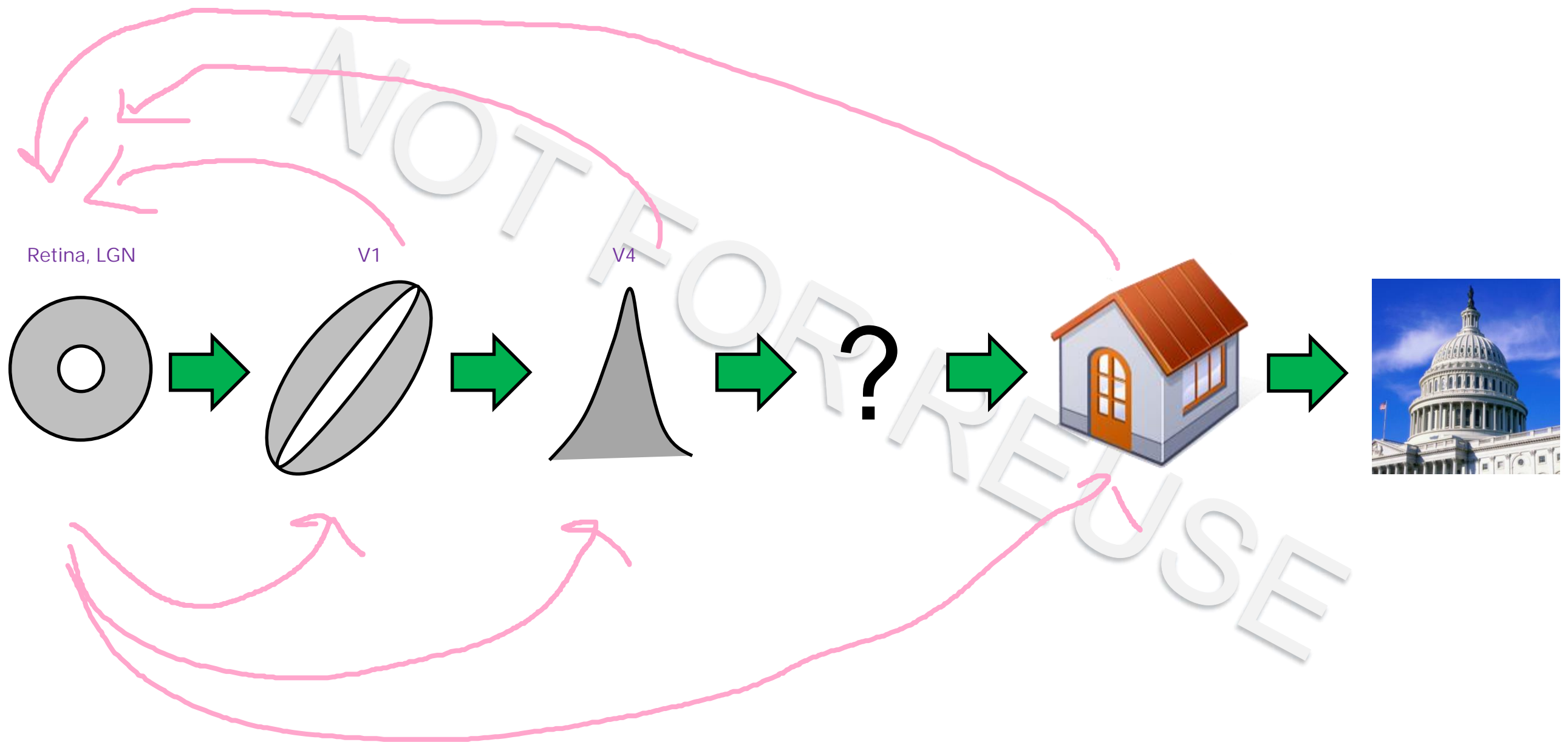
Quian Quiroga, Reddy, Kreiman, Koch and Fried, *Nature* (2005)

What is s ?



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

Building up complex selectivity



These representations also feed back to control what information is coming through in the first place. So this is how semantics, the meaning or the value of the context of an image, can end up influencing its initial representation in V1 or V4. So here where there's a role for learning and for expectation. What you think you're looking at can shape what you actually see.

Top-down effects



Next up: constructing response models

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