

Lecture I

Introduction to Olfaction

Dima Rinberg
rinberg@nyu.edu



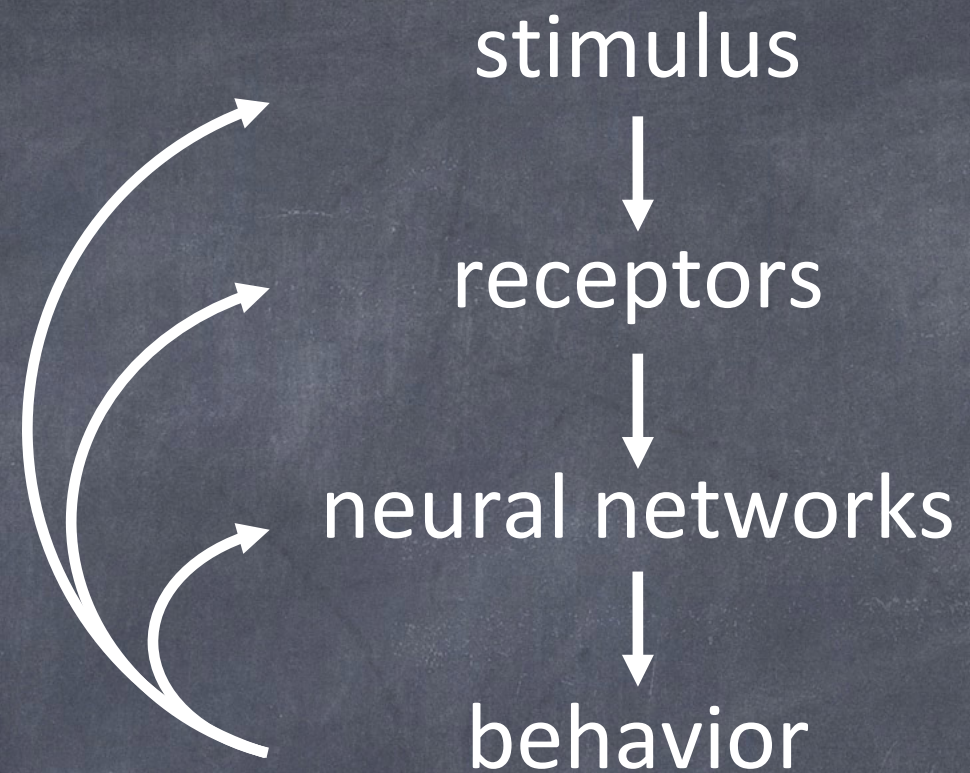
Chemical senses:

olfaction
gustation
nociception

Levels of understanding:

computational theory
algorithms and representation
hardware implementation

how it works
how it is built
how it evolved



bacteria
c-elegans
fly, larvae
mouse
human

Chemical senses: olfaction

One of human senses

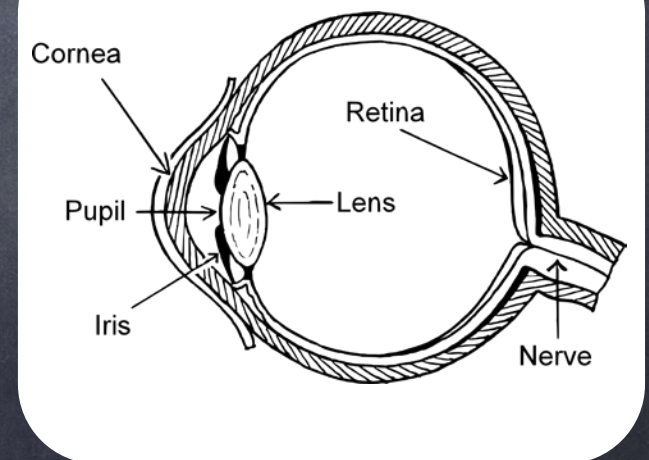
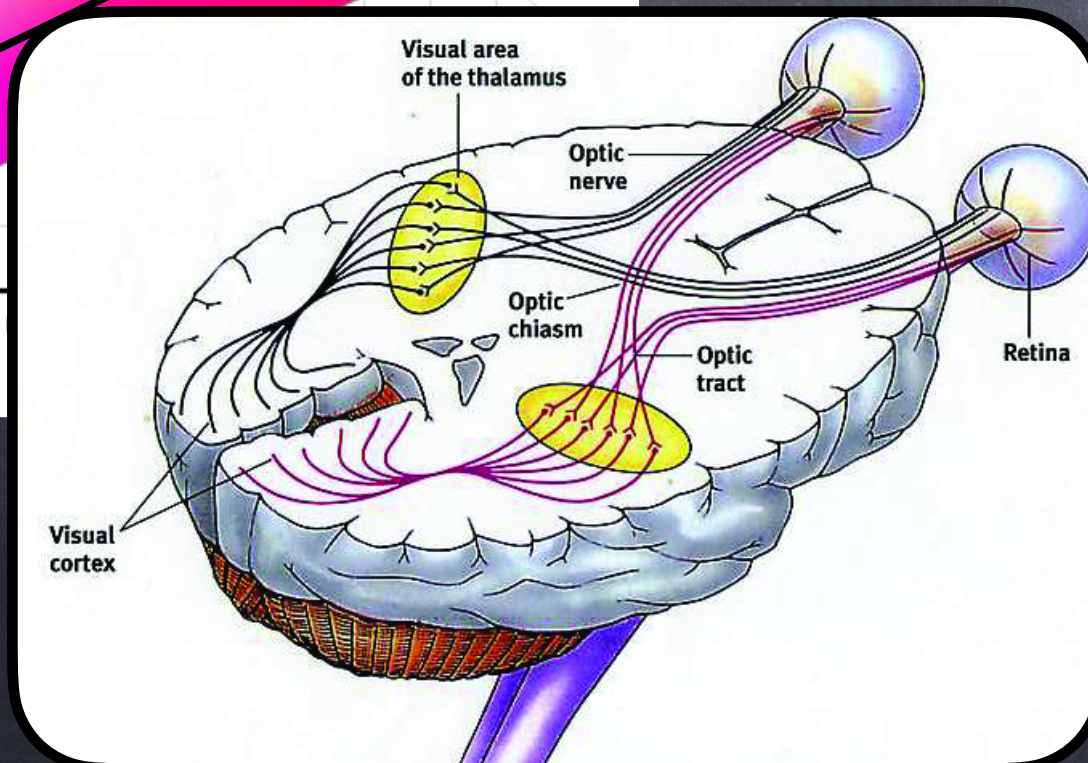
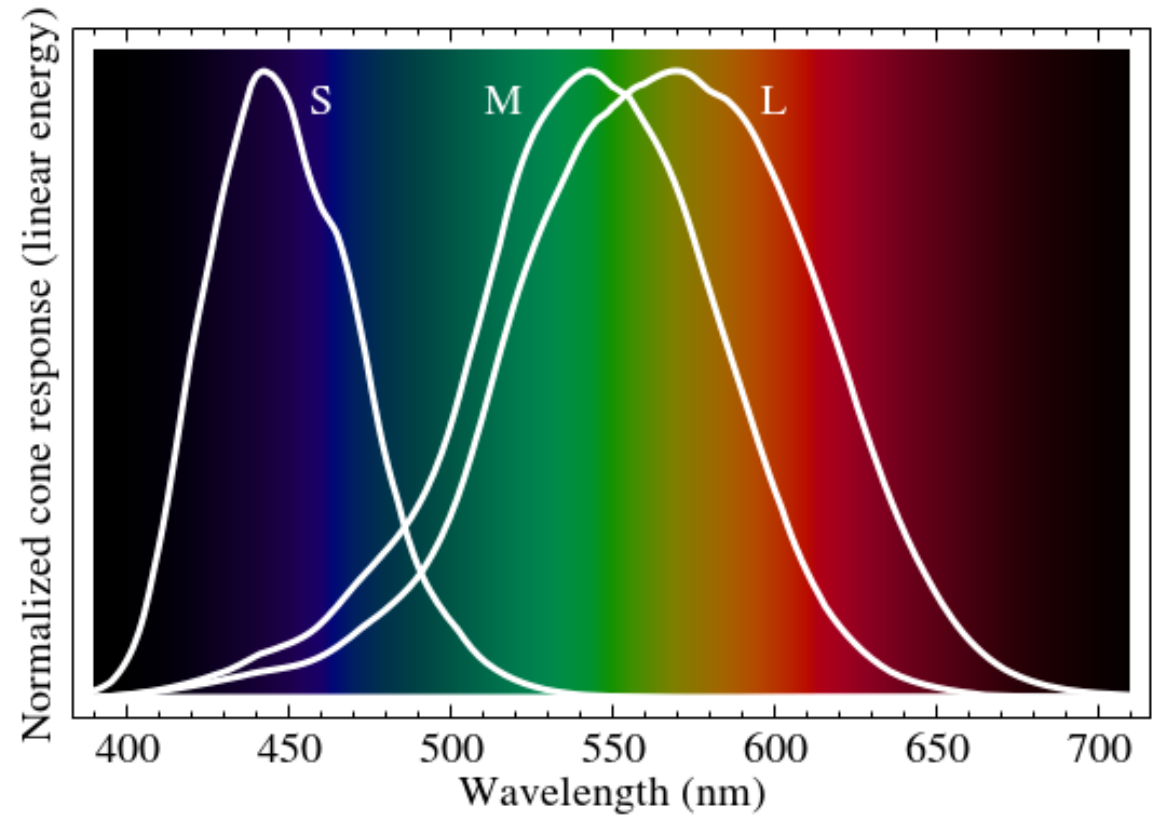
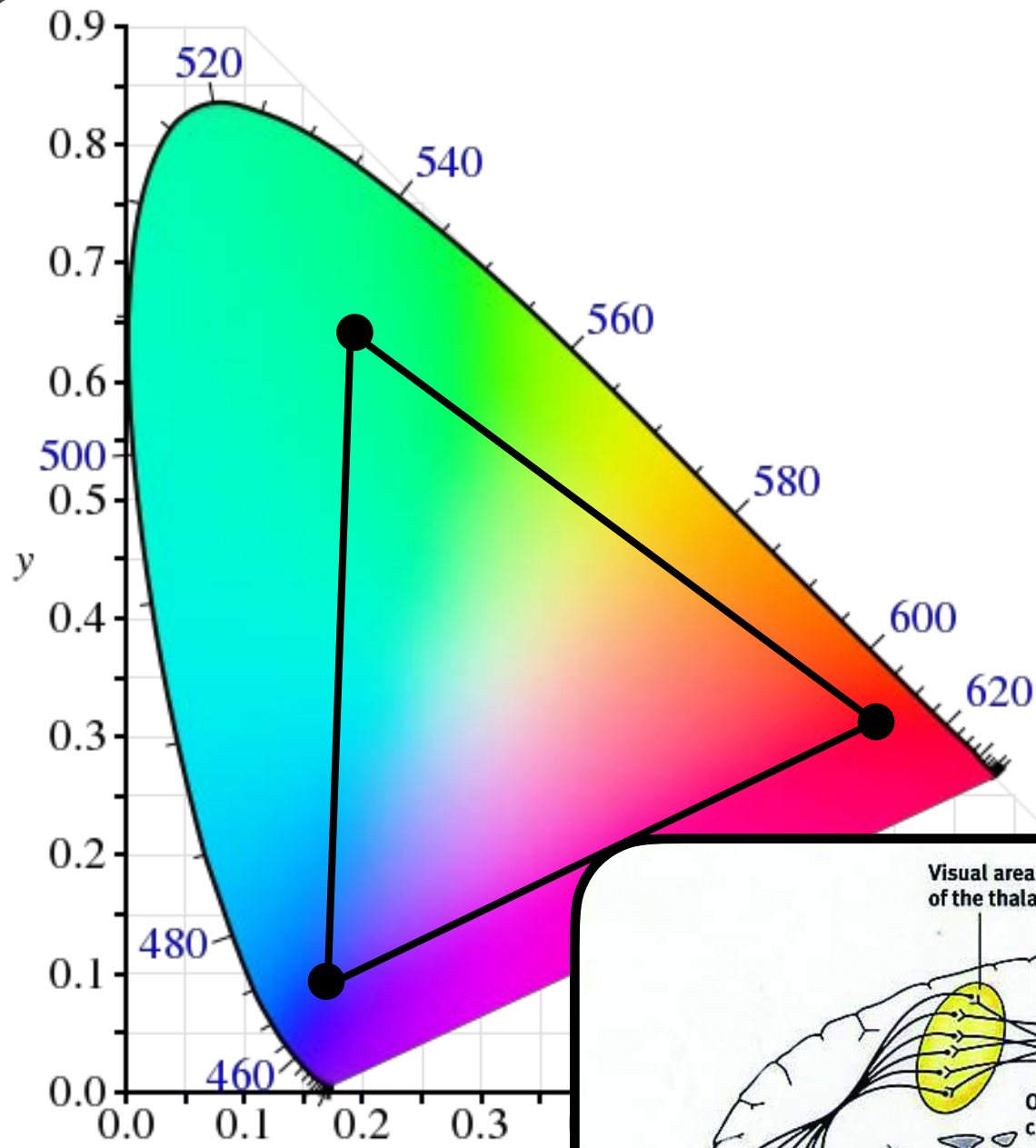
A window to the brain

An interface with a poorly understood world of chemicals

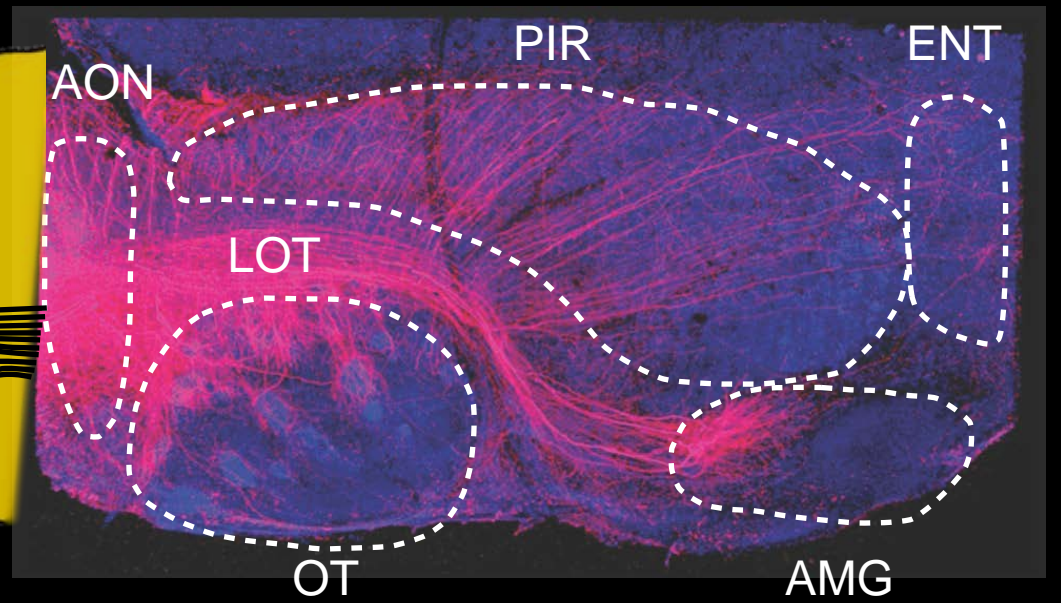
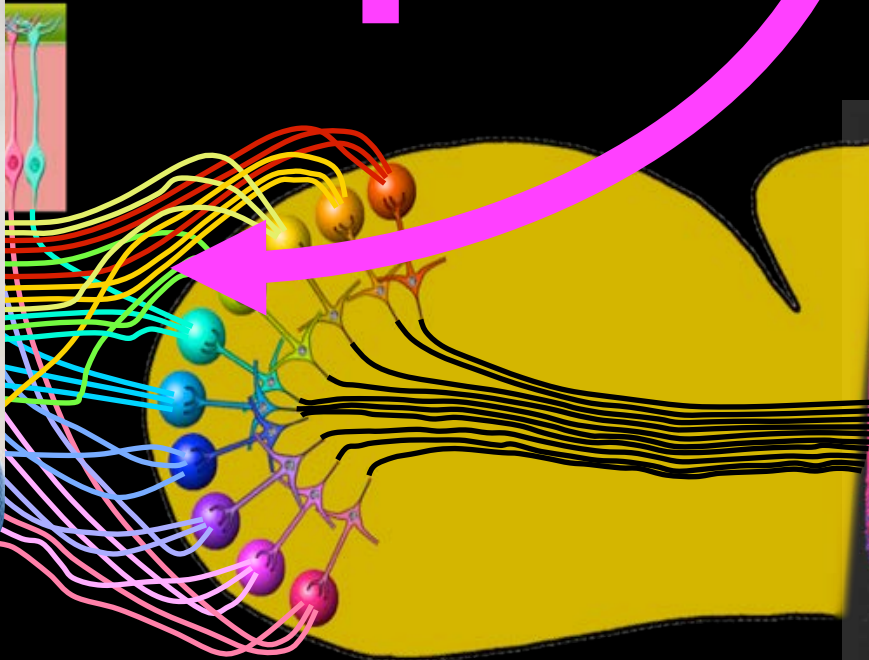
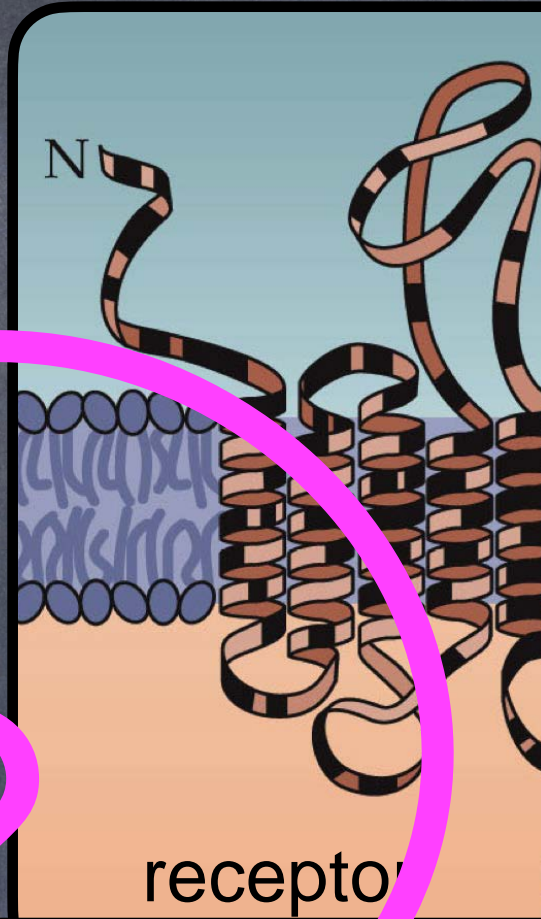
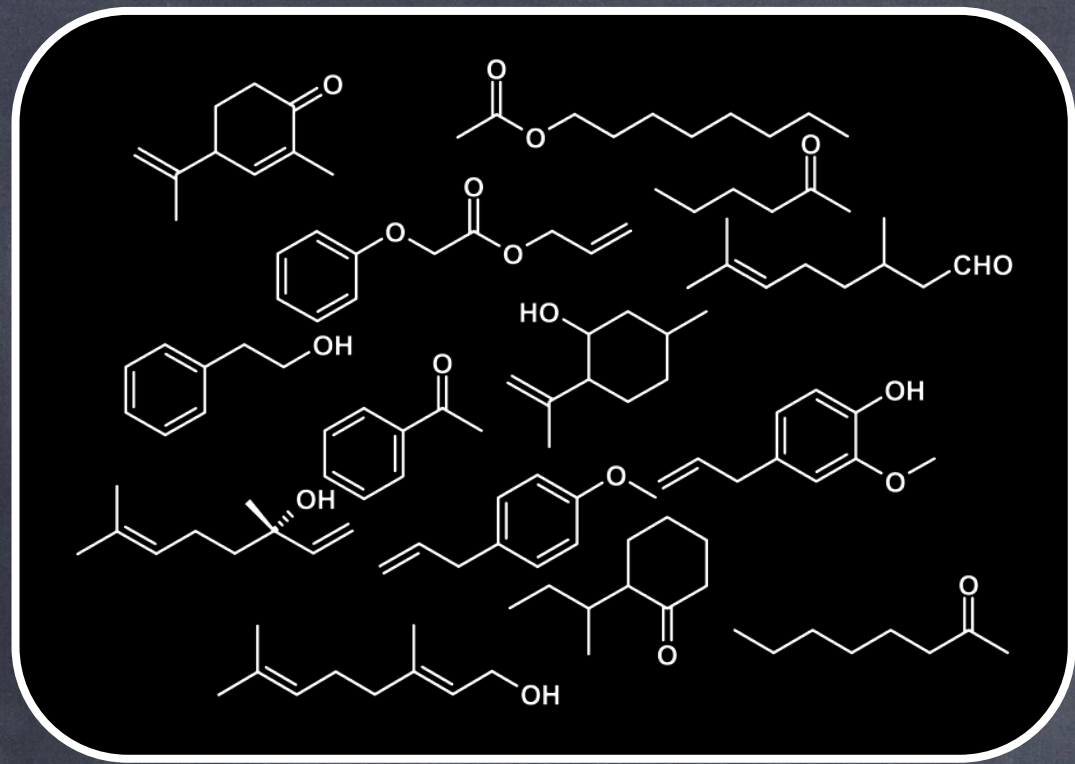
“Did you ever try to measure a smell? Can you tell whether one smell is just twice as strong as another. Can you measure the difference between one kind of smell and another. It is very obvious that we have very many different kinds of smells, all the way from the odor of violets and roses up to asafetida. But until you can measure their likenesses and differences you can have no science of odor. If you are ambitious to found a new science, measure a smell.” **If you are ambitious to found a new science, measure a smell.”**

- Alexander Graham Bell (1914)

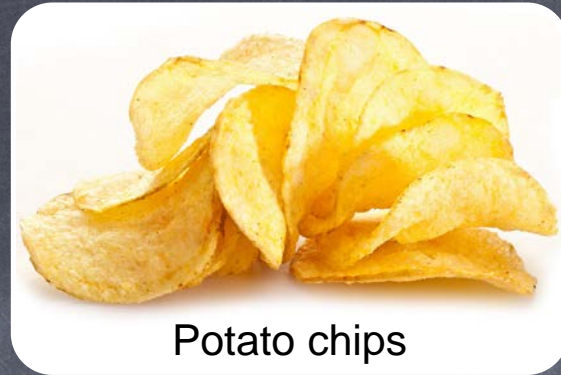
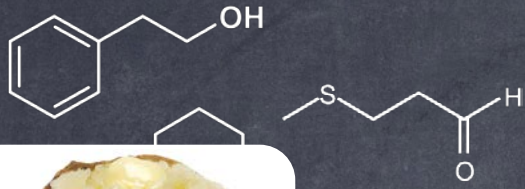
Human color vision



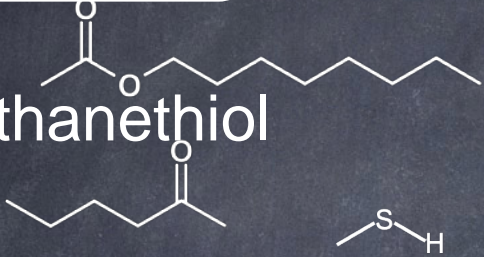
olfaction



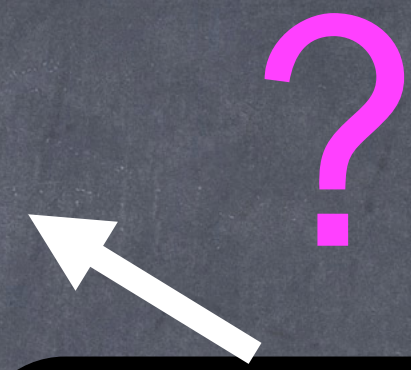
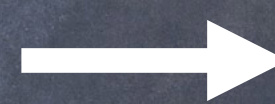
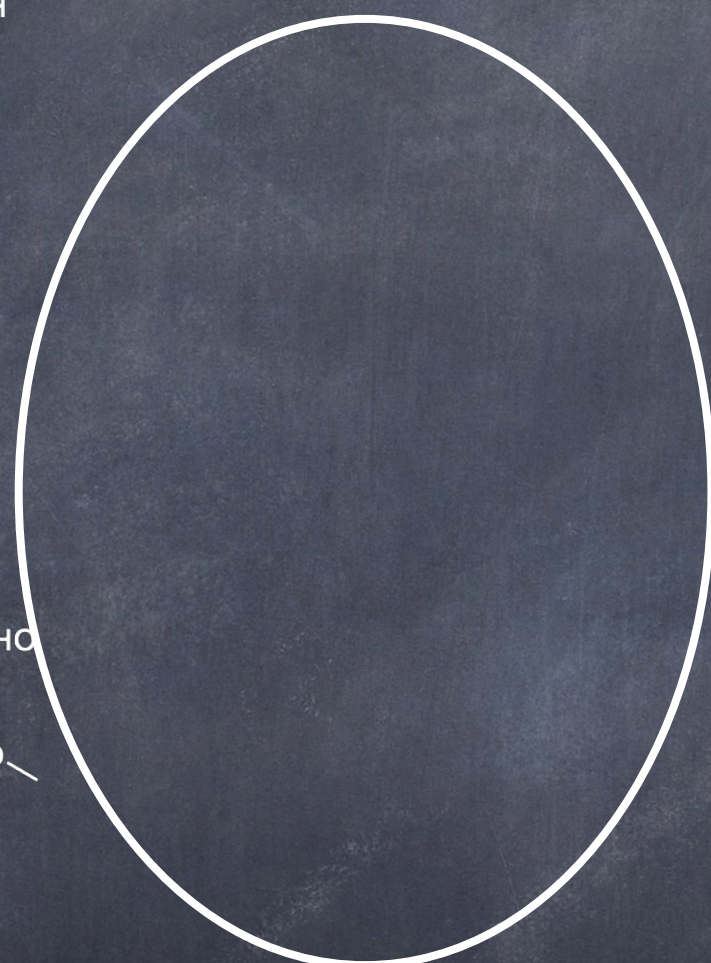
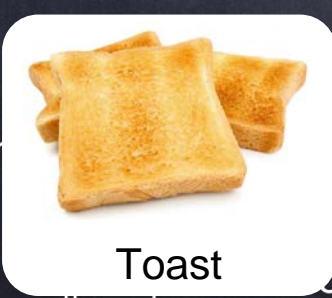
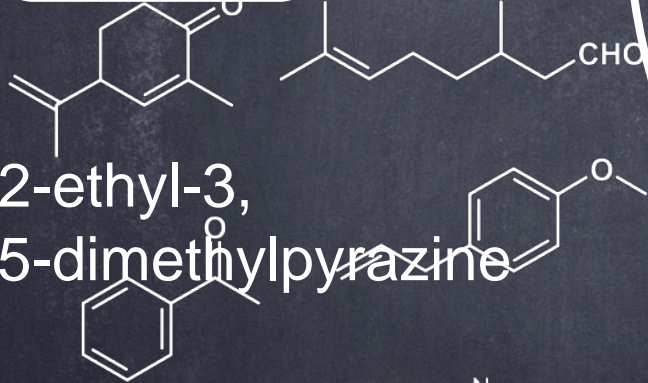
methional



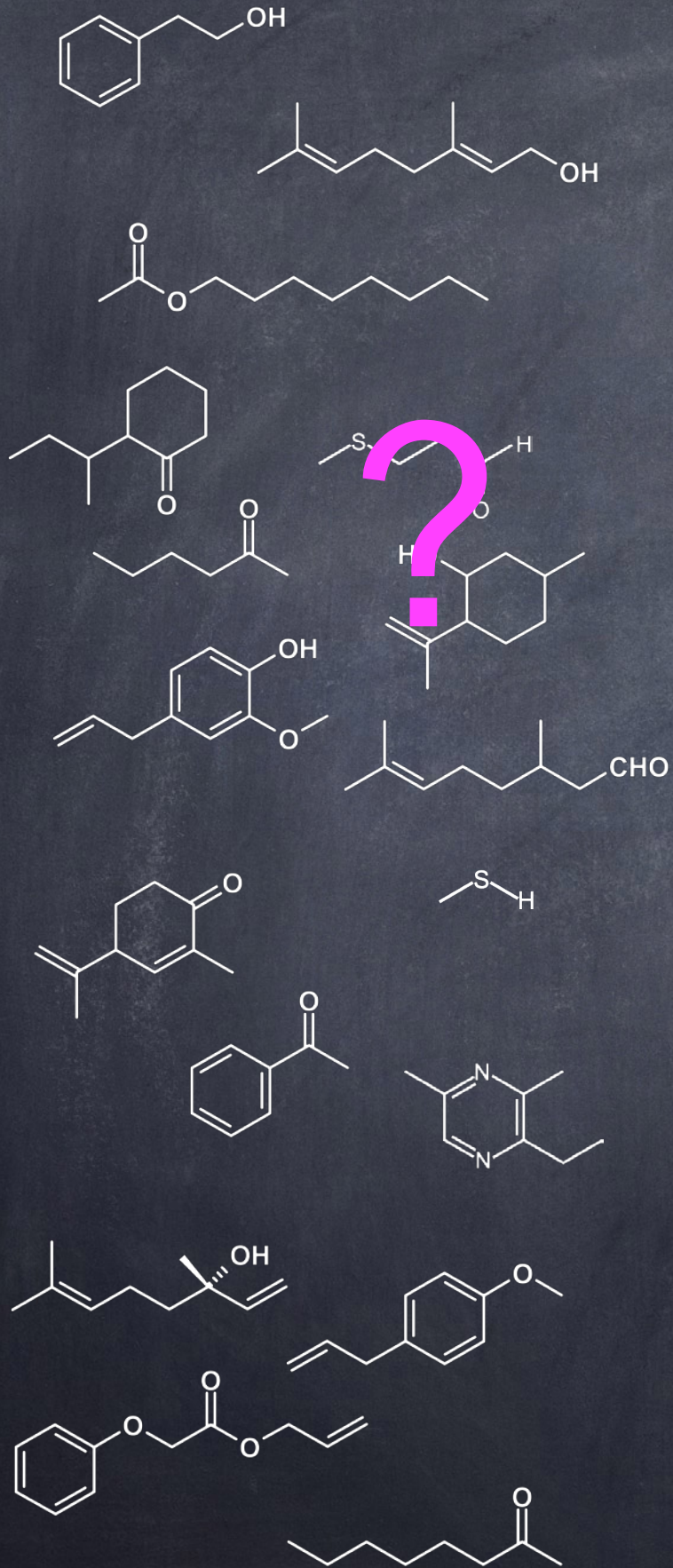
methanethiol

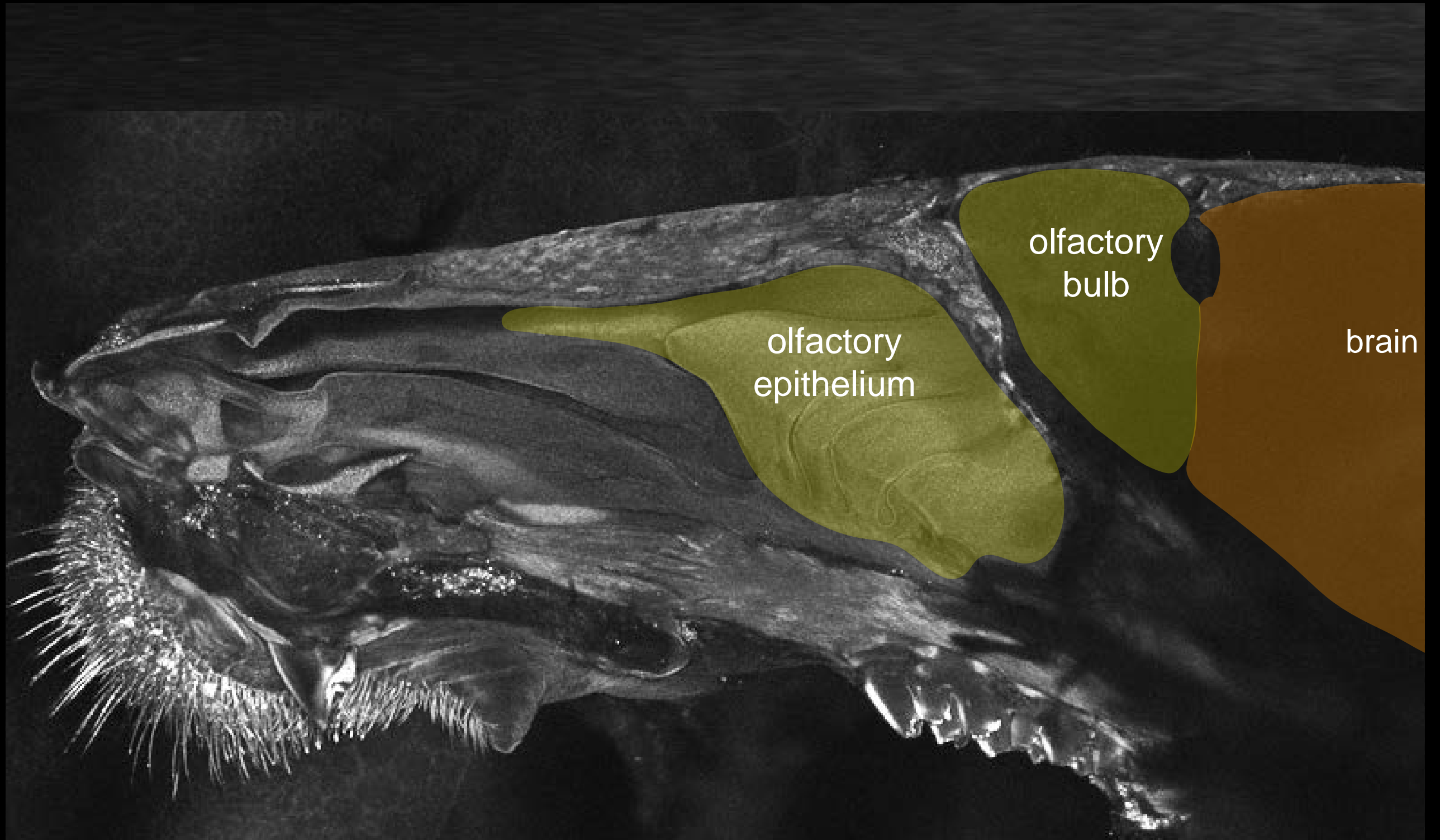


2-ethyl-3,5-dimethylpyrazine



Chemical detection

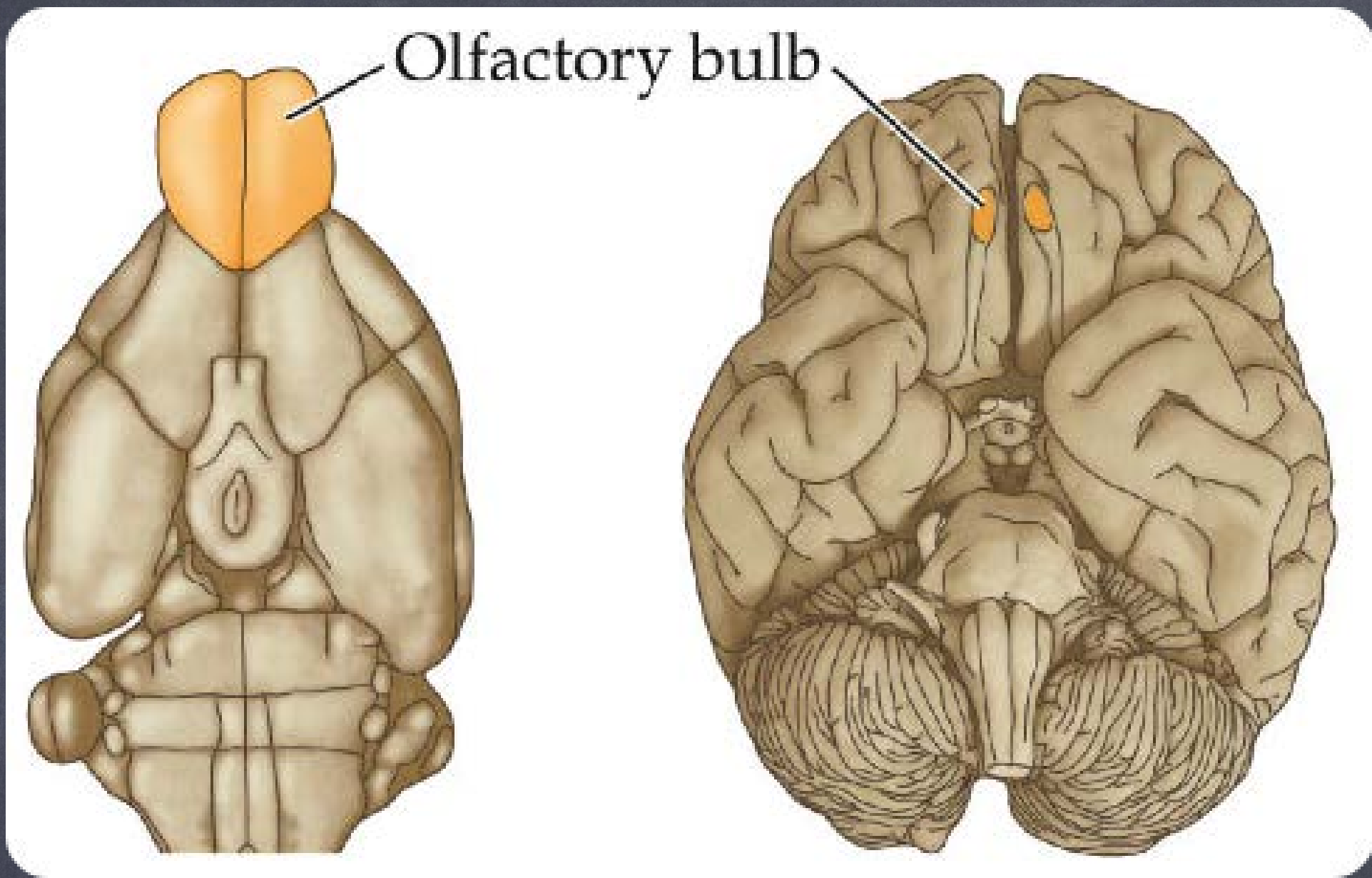




olfactory
epithelium

olfactory
bulb

brain



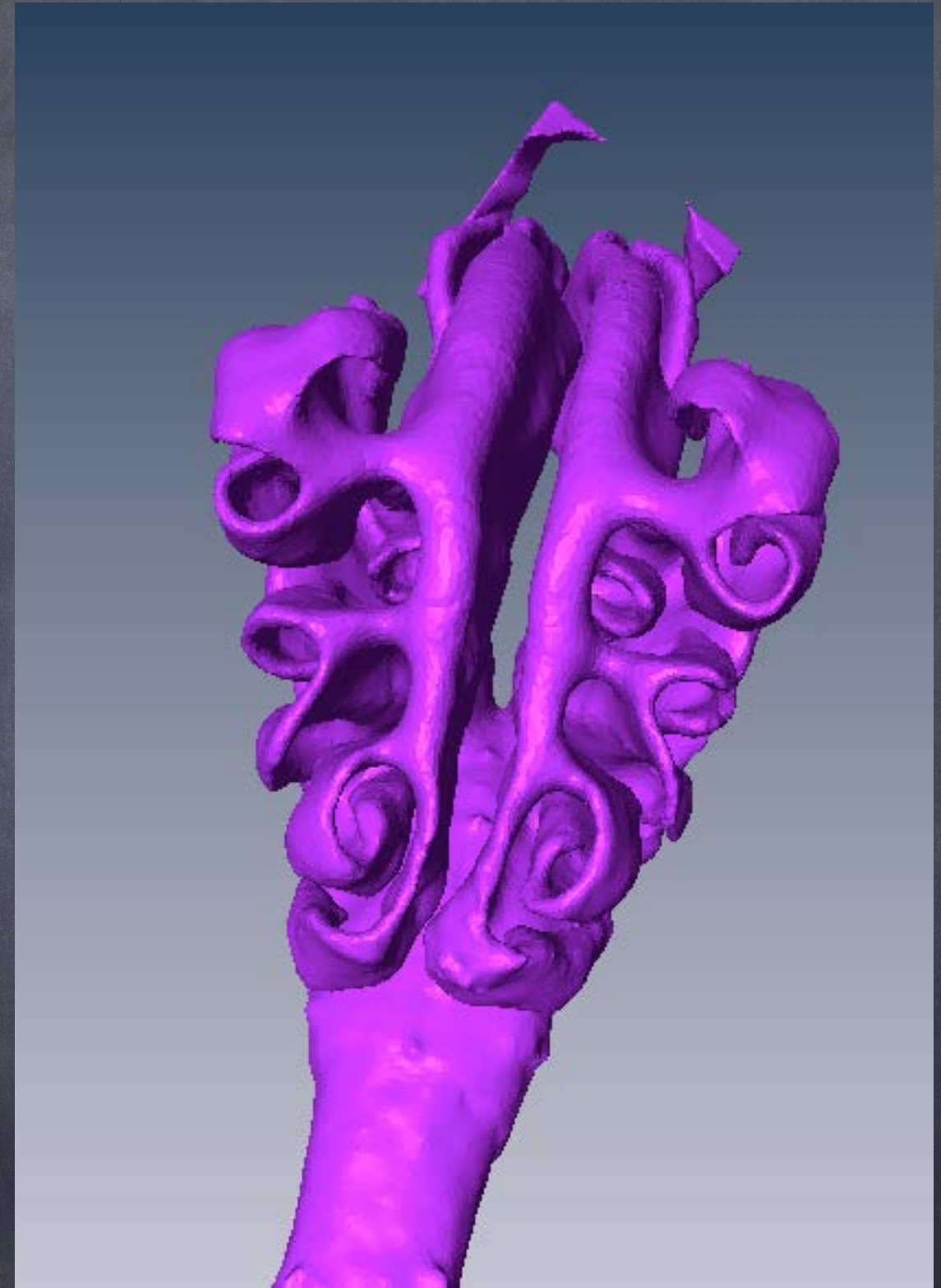
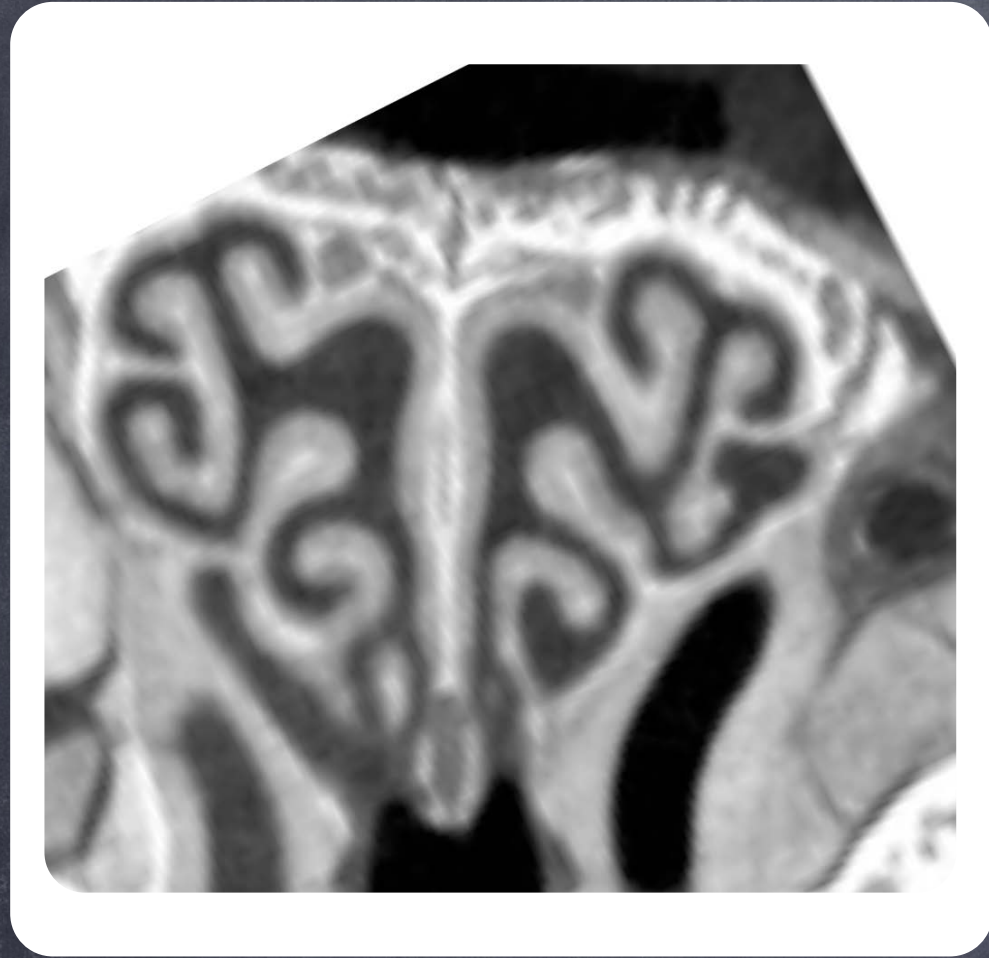
rat/mouse

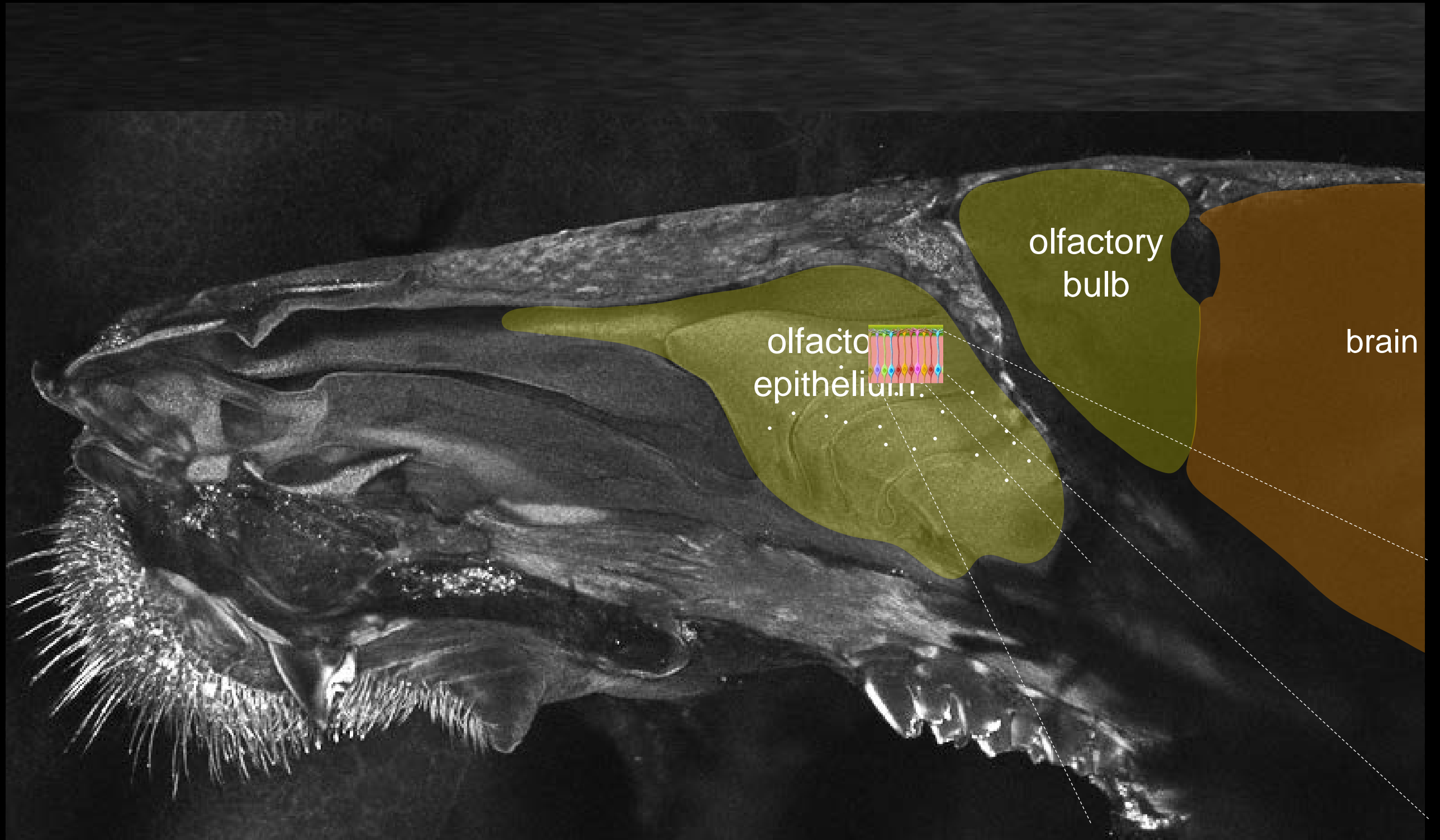
5%

human

0.2%

mouse nose





olfacto
epithelium.

olfactory
bulb

brain

odorant molecules



Human

Mouse

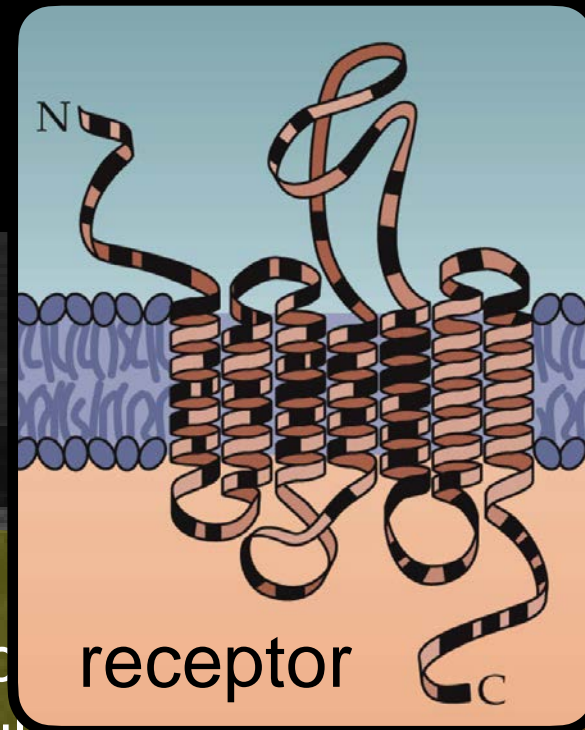
olfactory receptors



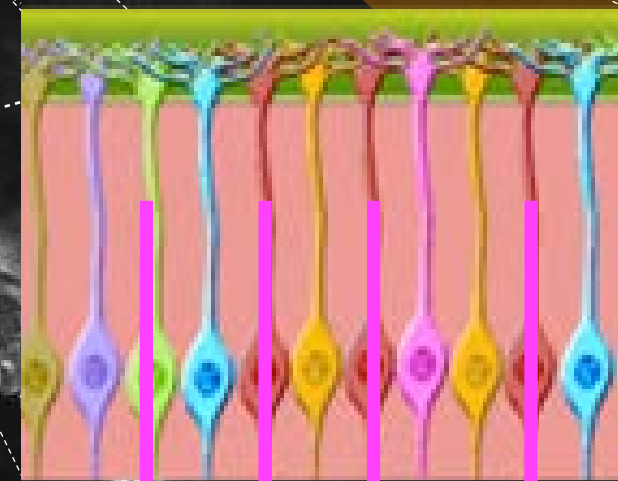
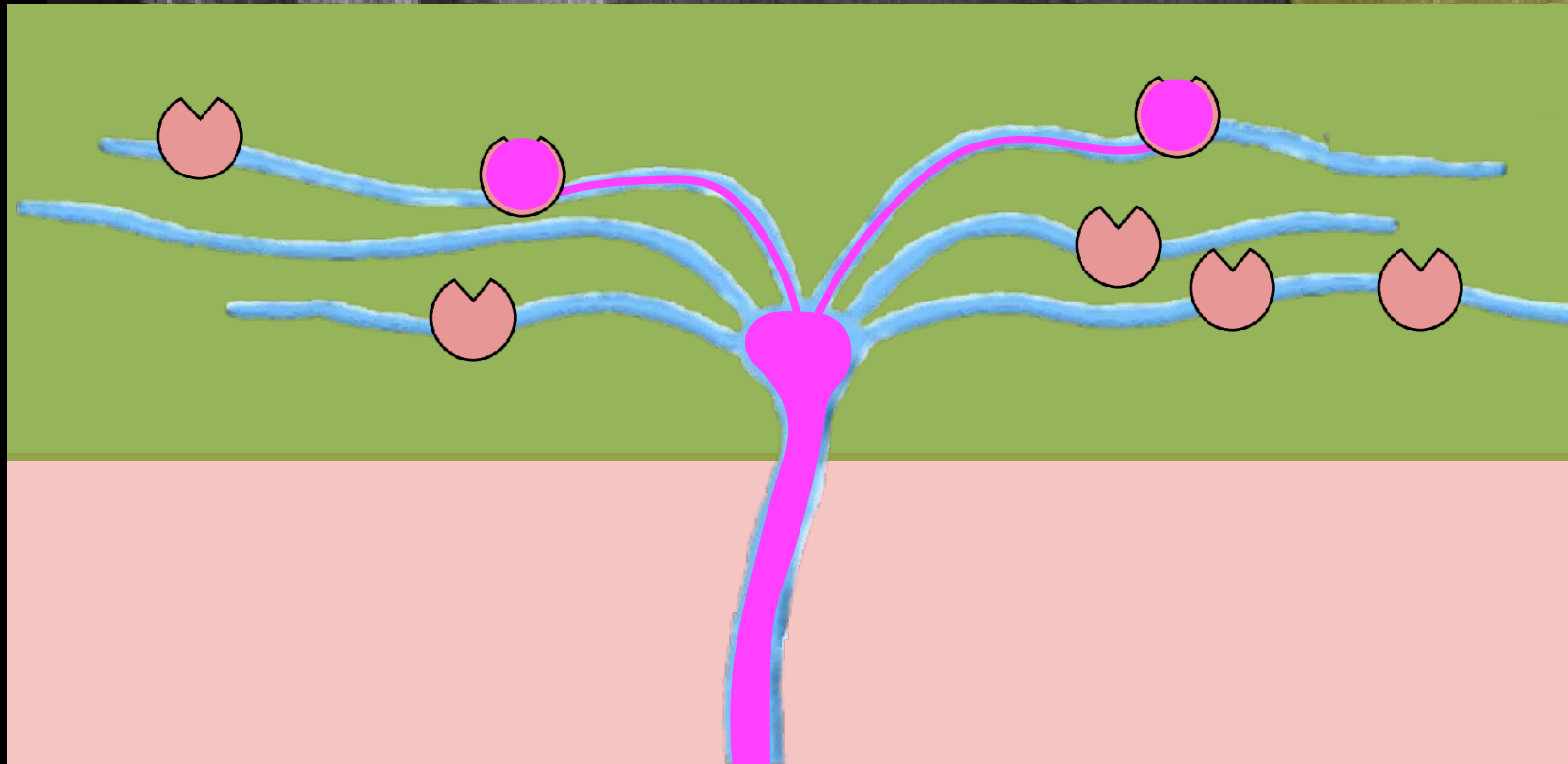
olfactory bulb

brain

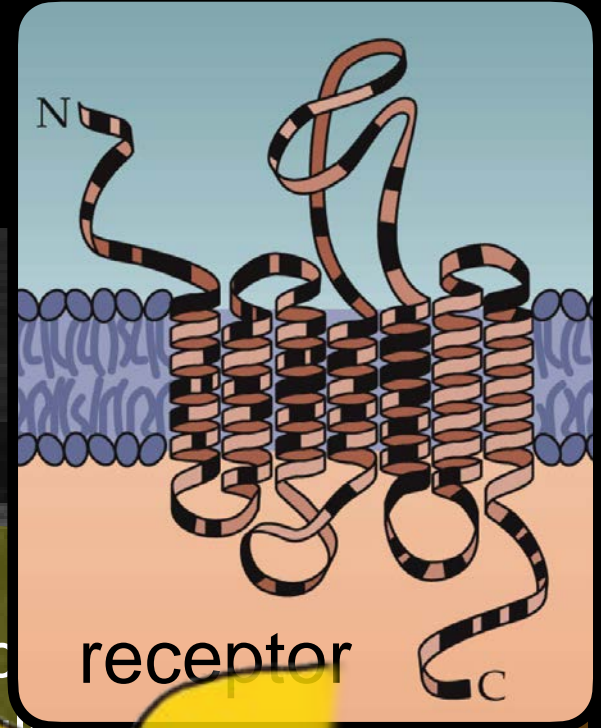
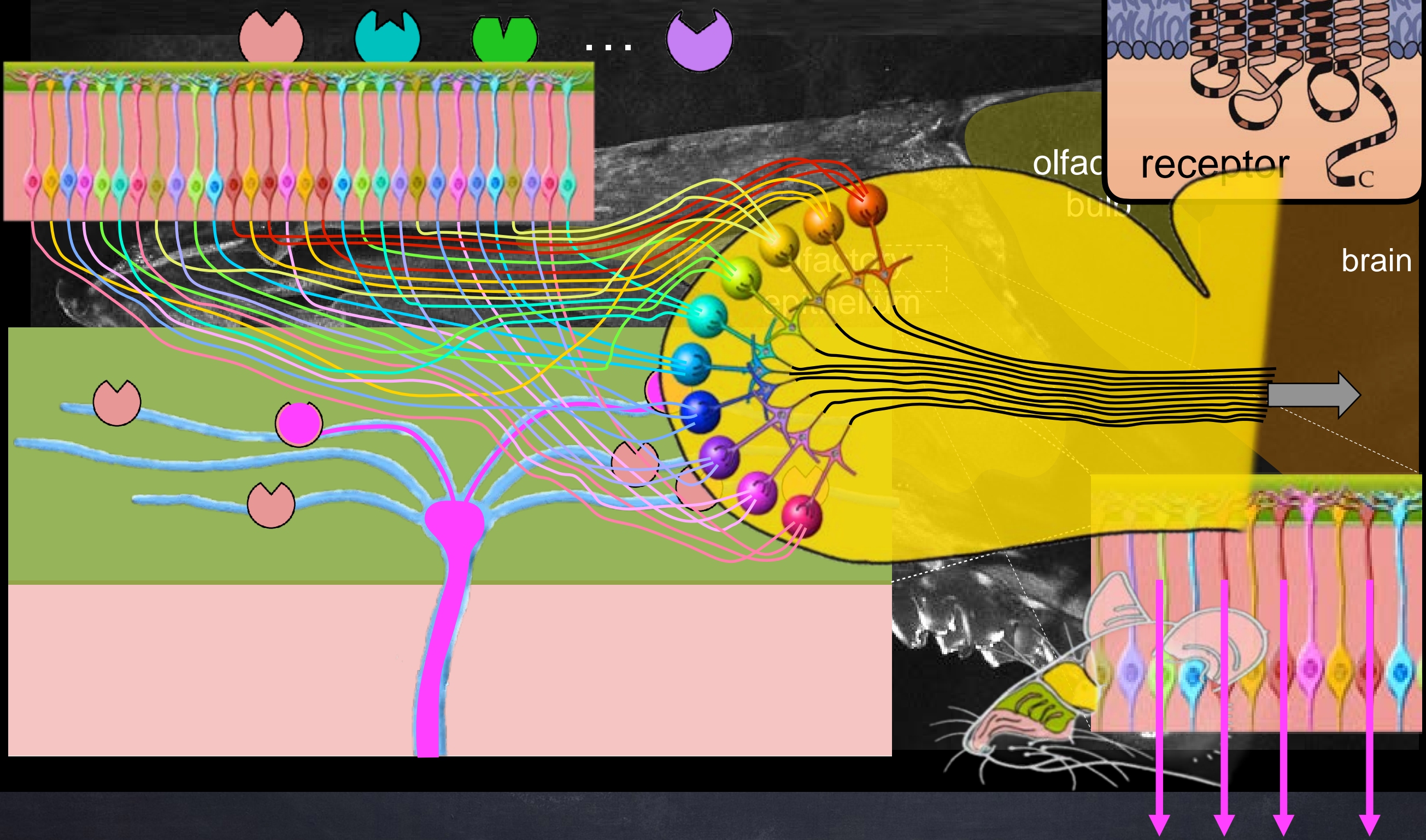
olfactory epithelium



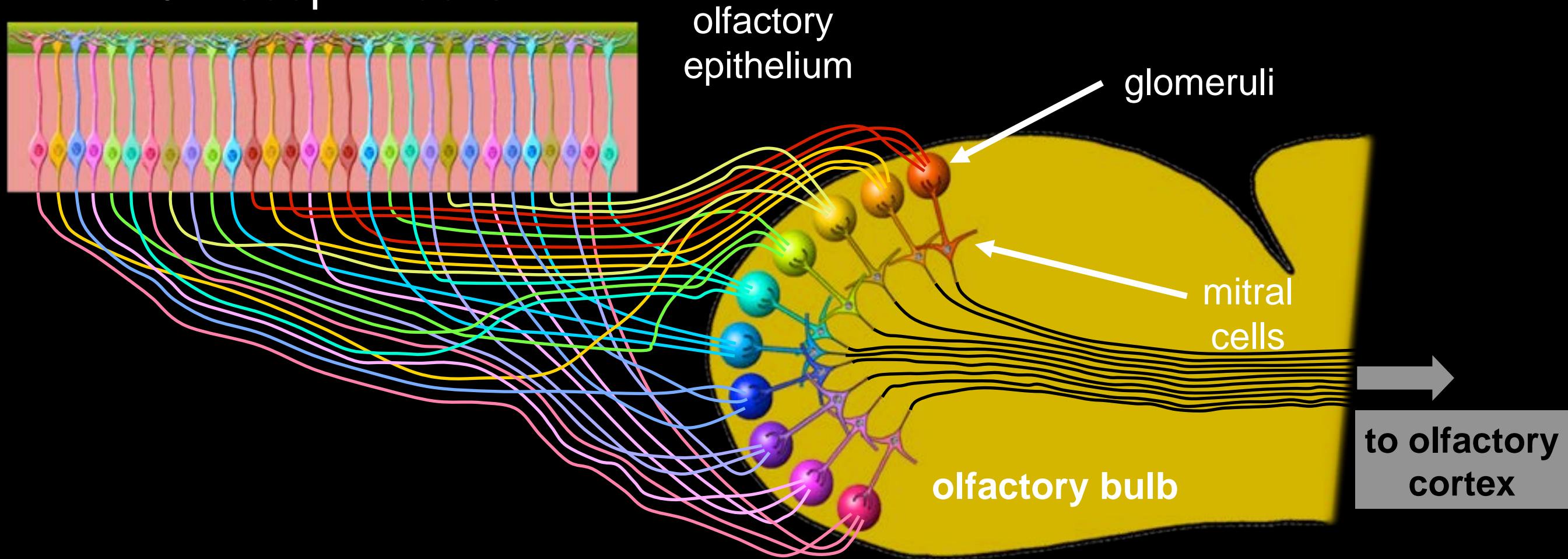
receptor



1 ← → ~360 Human
1 ← → ~1200 Mouse



10^7 receptor cells



Olfactory receptors:

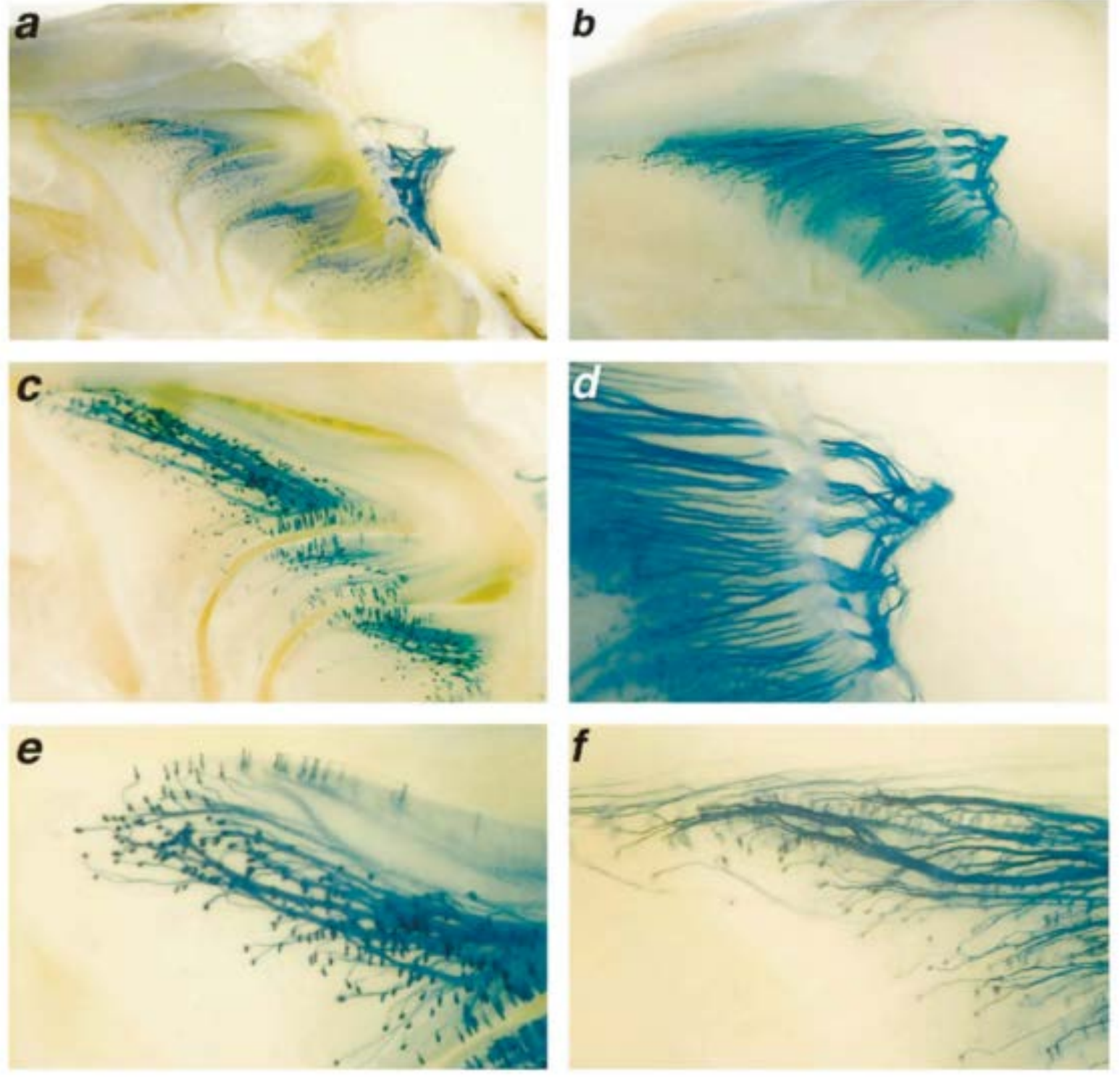
Human: ~ 350

Mouse: ~ 1200

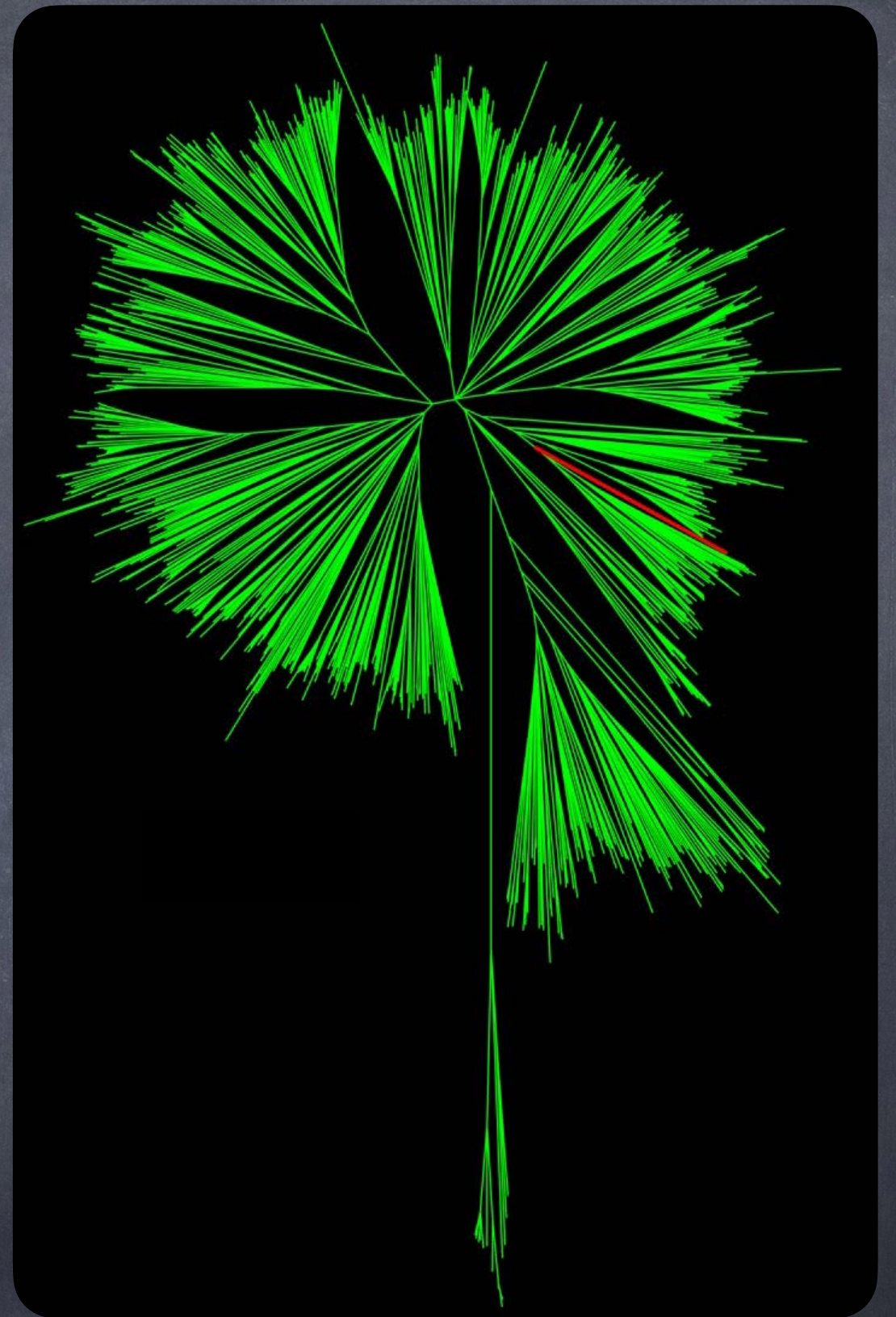
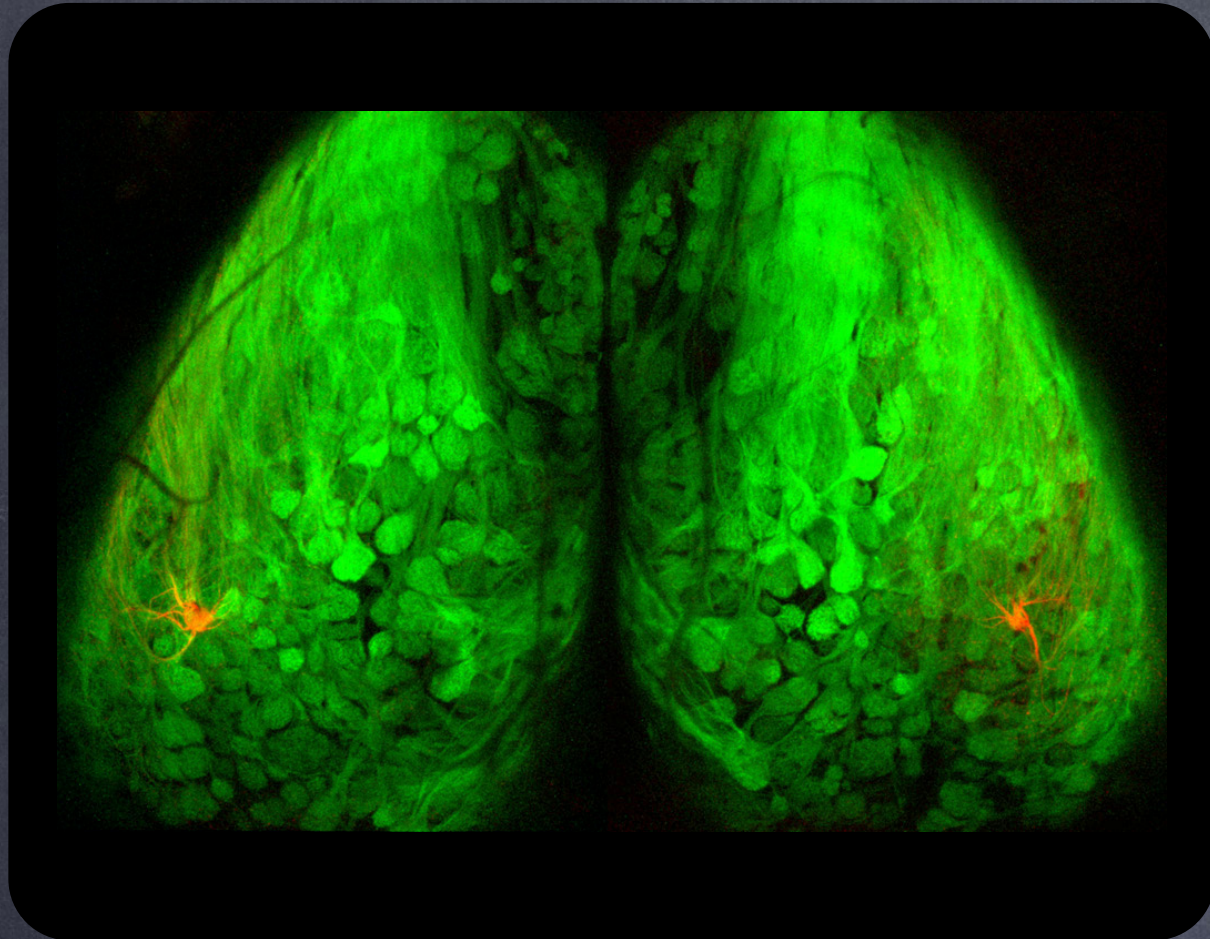


Visualizing an Olfactory Sensory Map

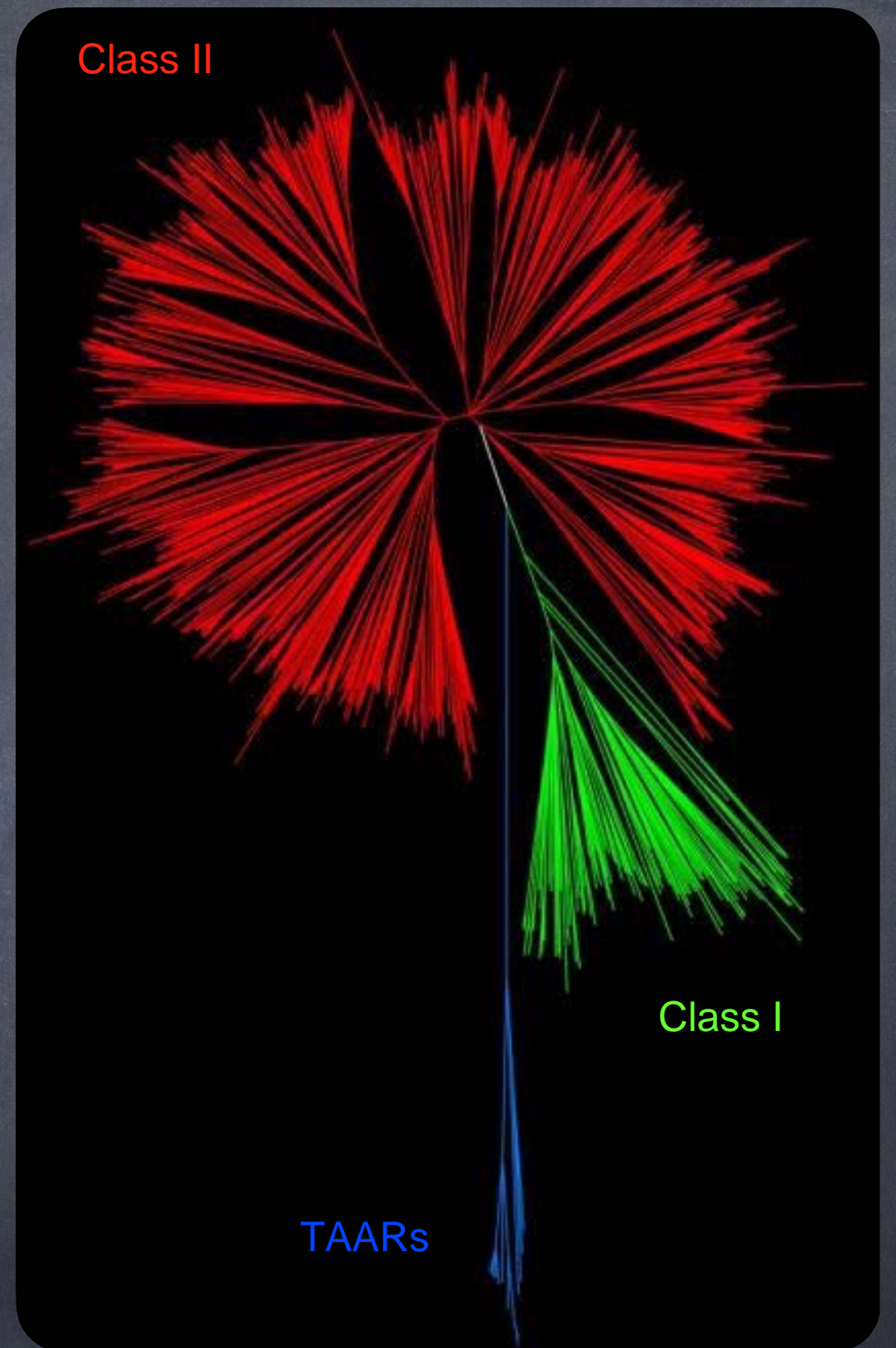
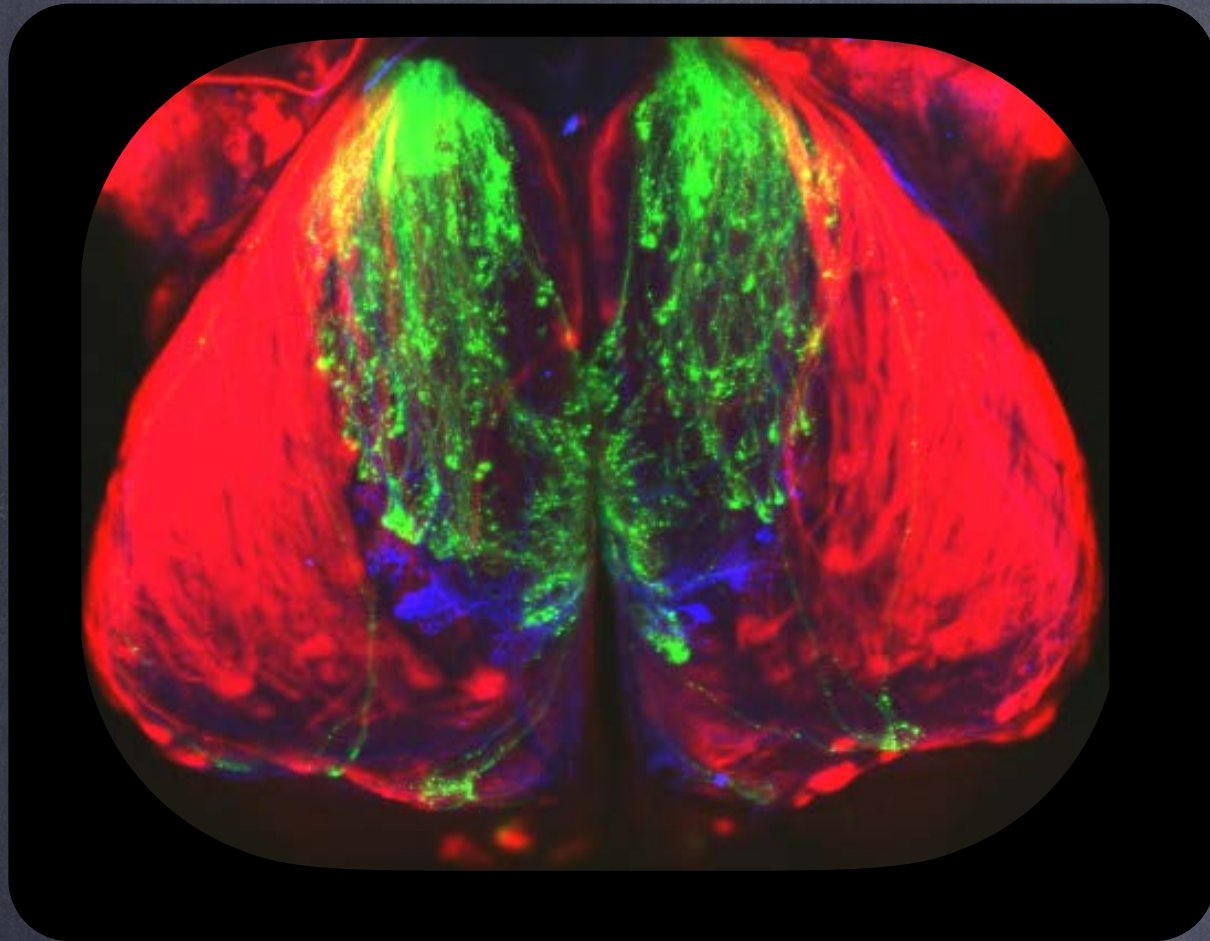
Peter Mombaerts,* Fan Wang, Catherine Dulac,
Steve K. Chao, Adriana Nemes, Monica Mendelsohn
James Edmondson, and Richard Axel
Department of Biochemistry
and Molecular Biophysics
Howard Hughes Medical Institute
and Center for Neurobiology and Behavior
College of Physicians and Surgeons
Columbia University
New York, New York 10032



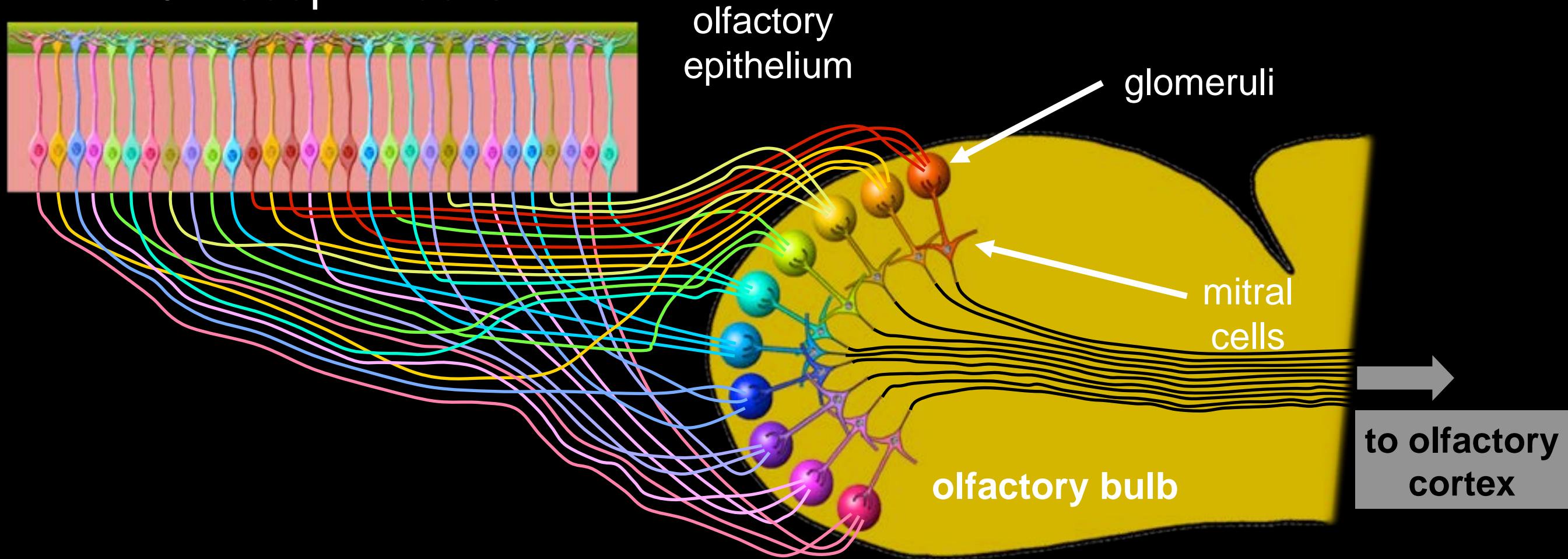
The OR repertoire is mapped onto the olfactory bulb



The OR repertoire is mapped onto the olfactory bulb



10^7 receptor cells

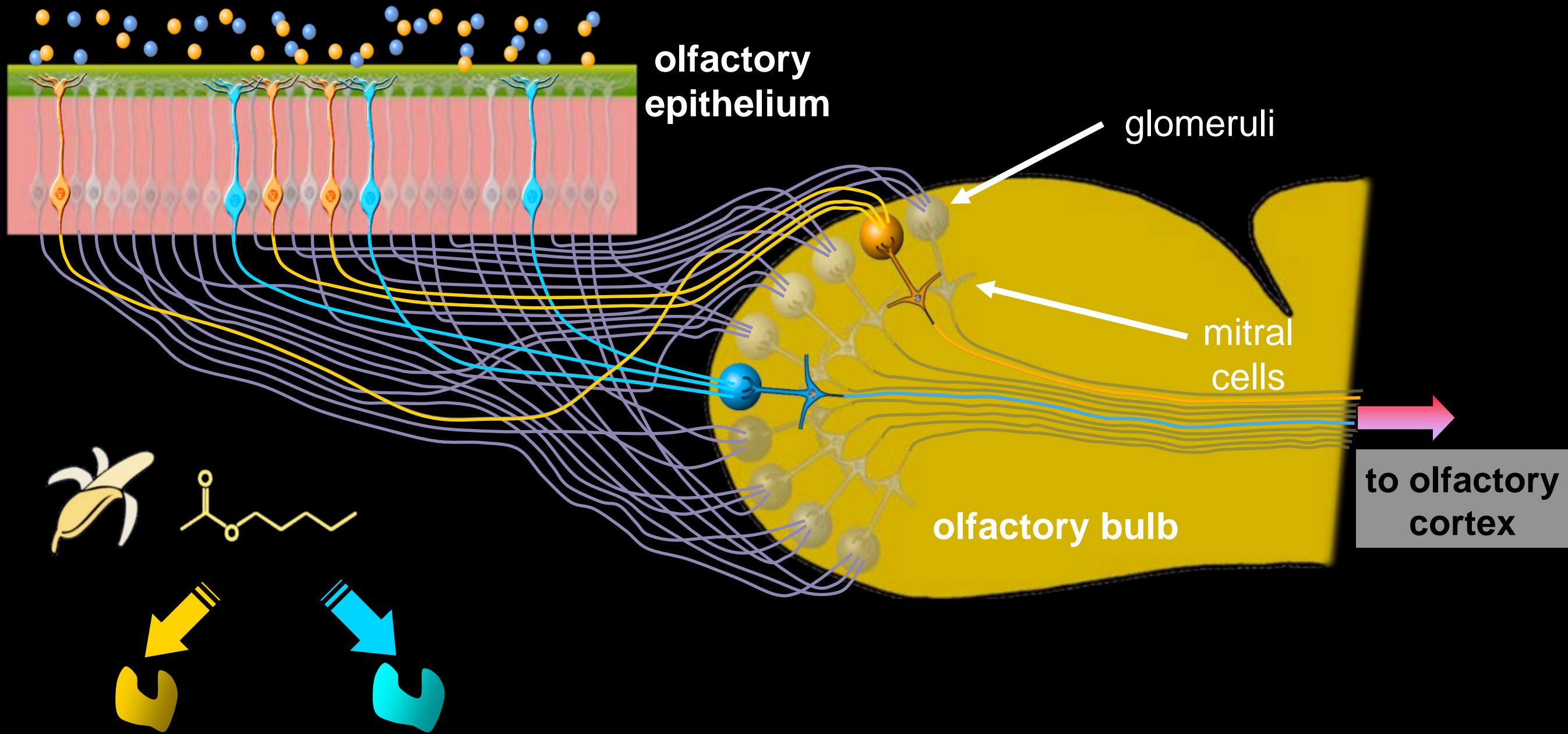


Olfactory receptors:

Human: ~ 350

Mouse: ~ 1200





odorants

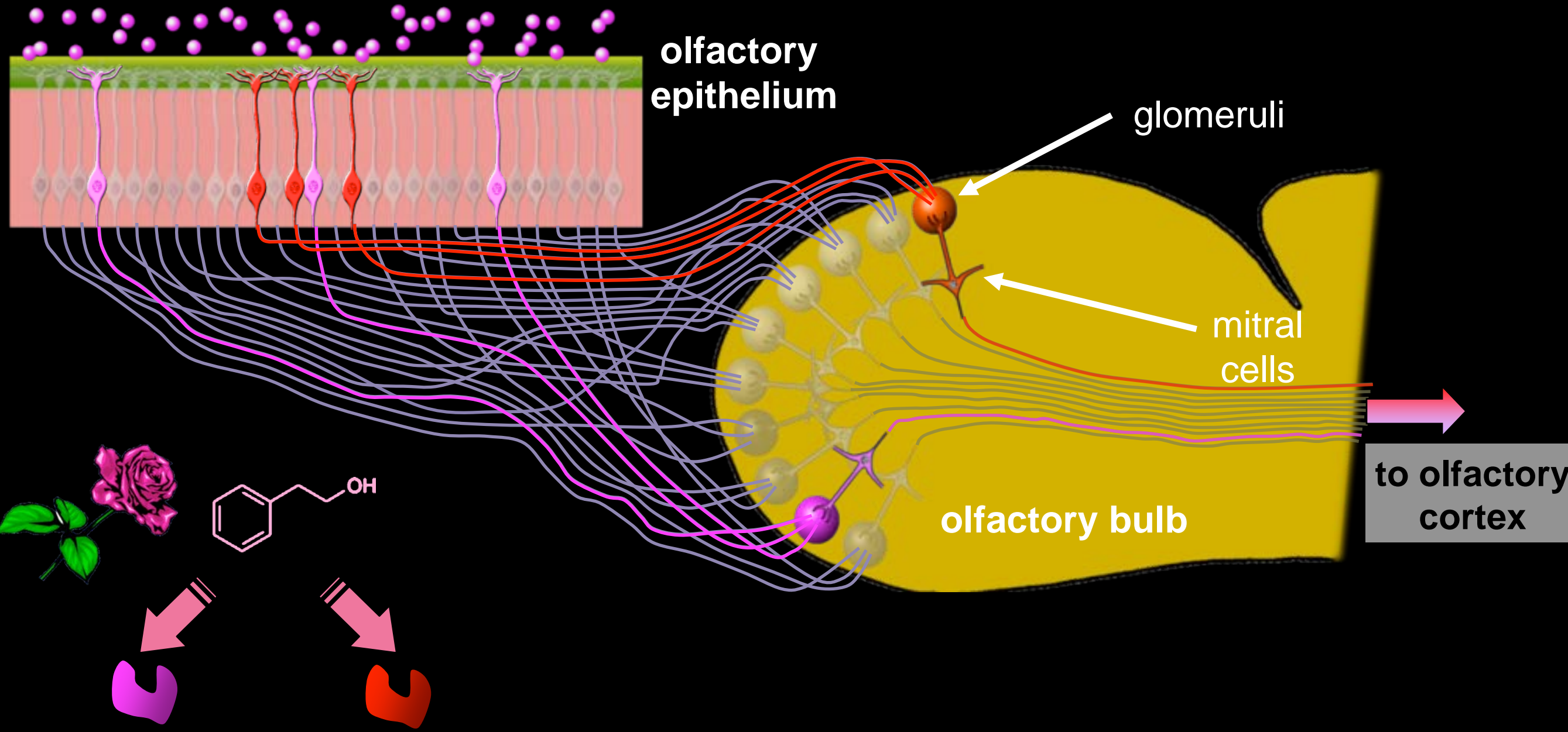
olfactory epithelium

glomeruli

mitral cells

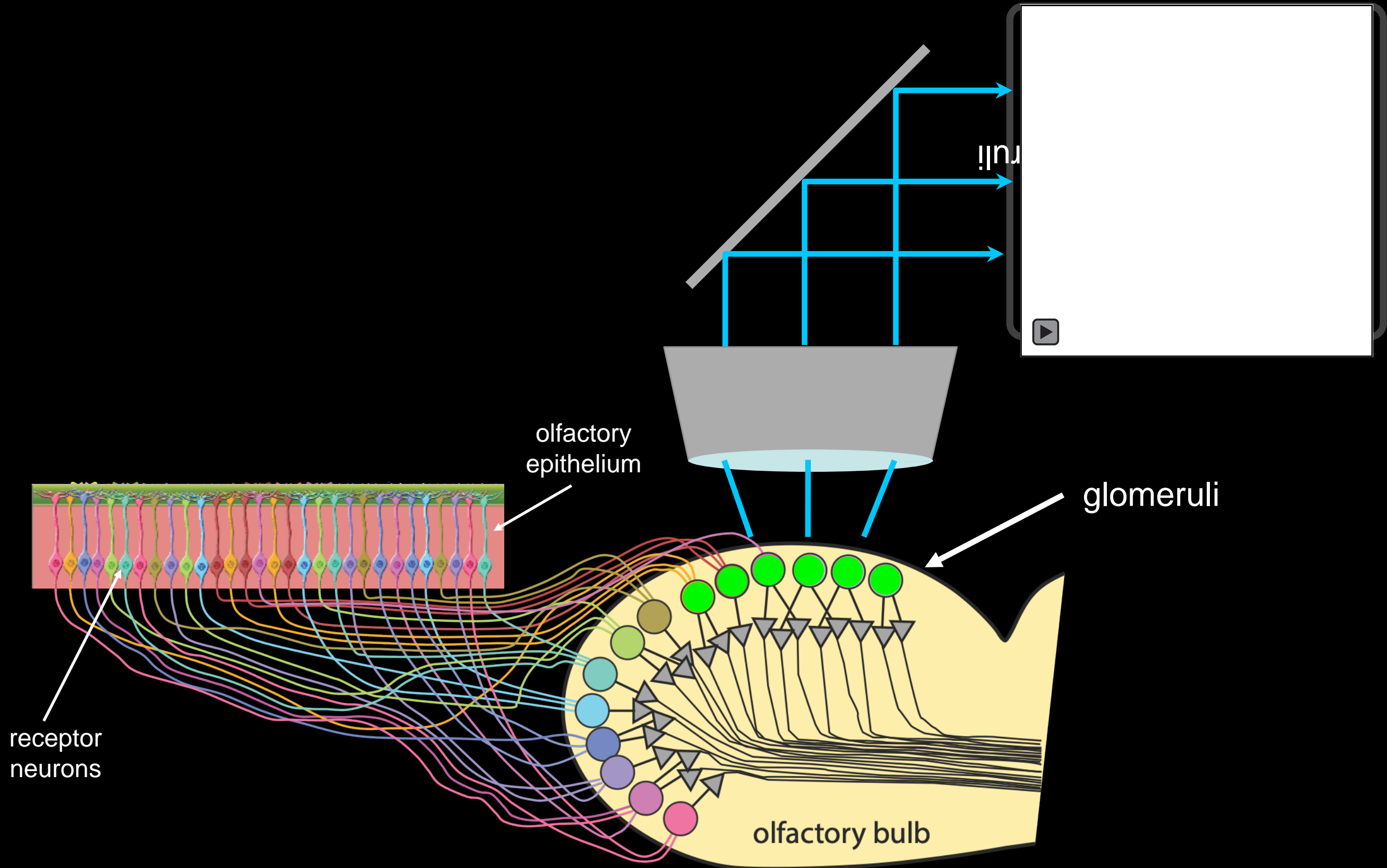
olfactory bulb

to olfactory cortex





butanal

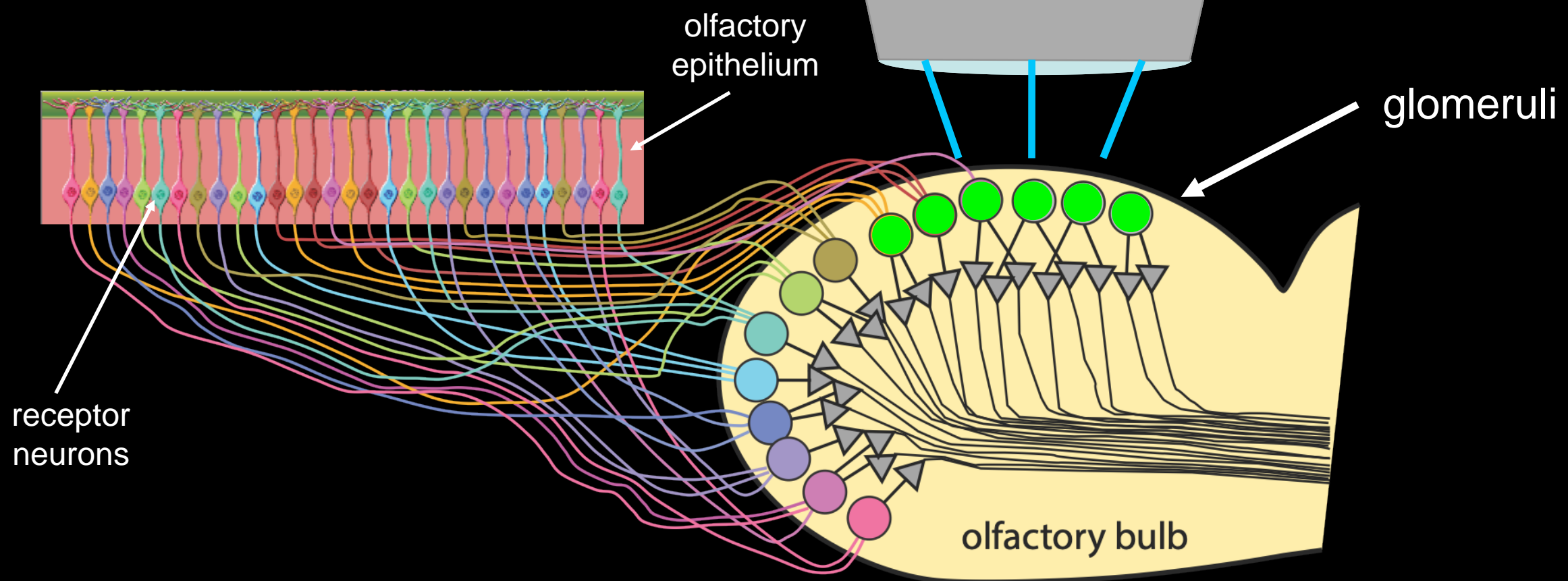
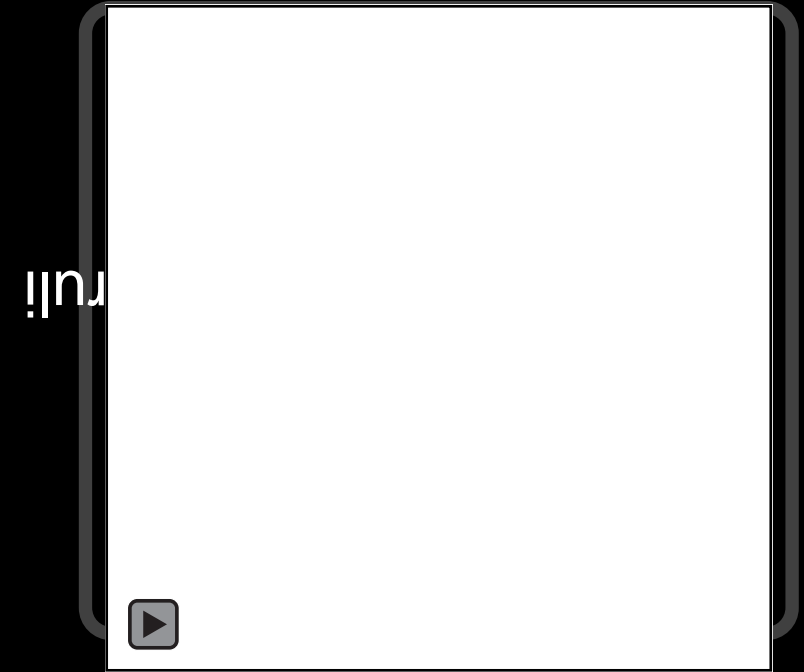
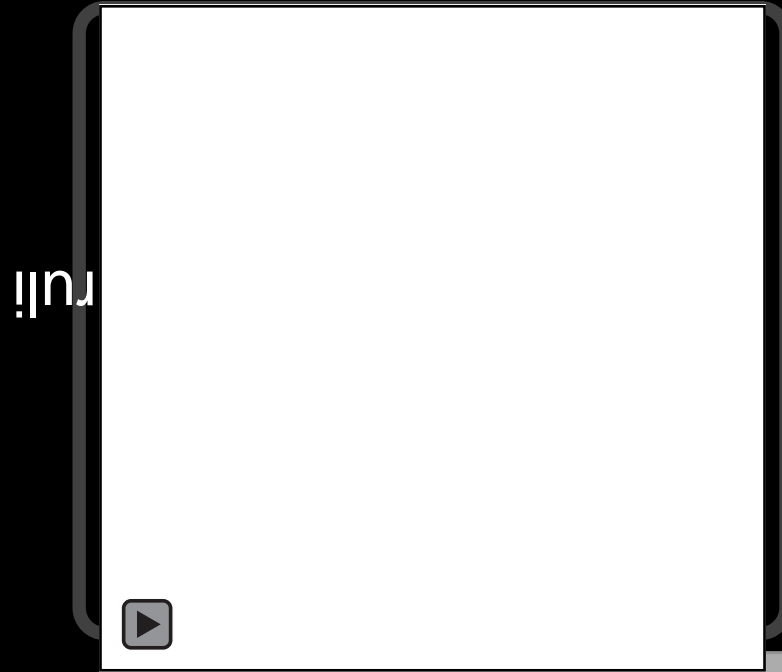
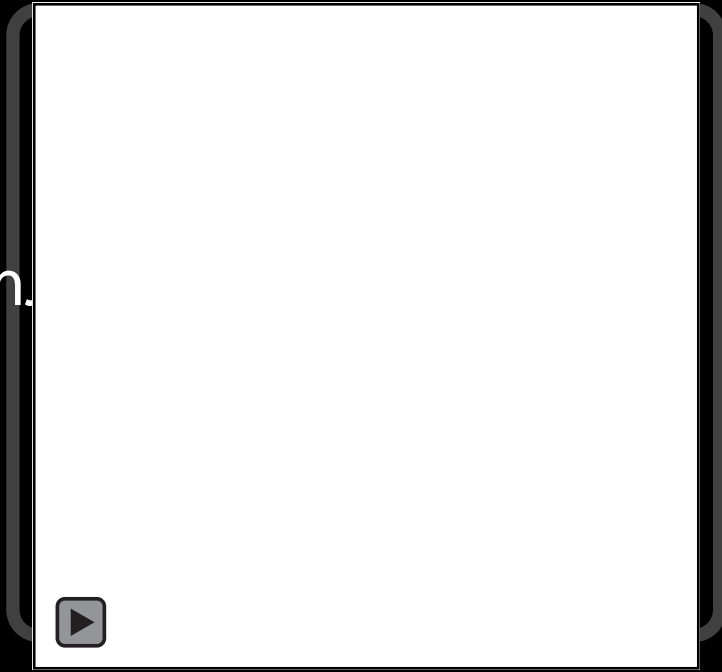


olfactory epithelium

receptor neurons

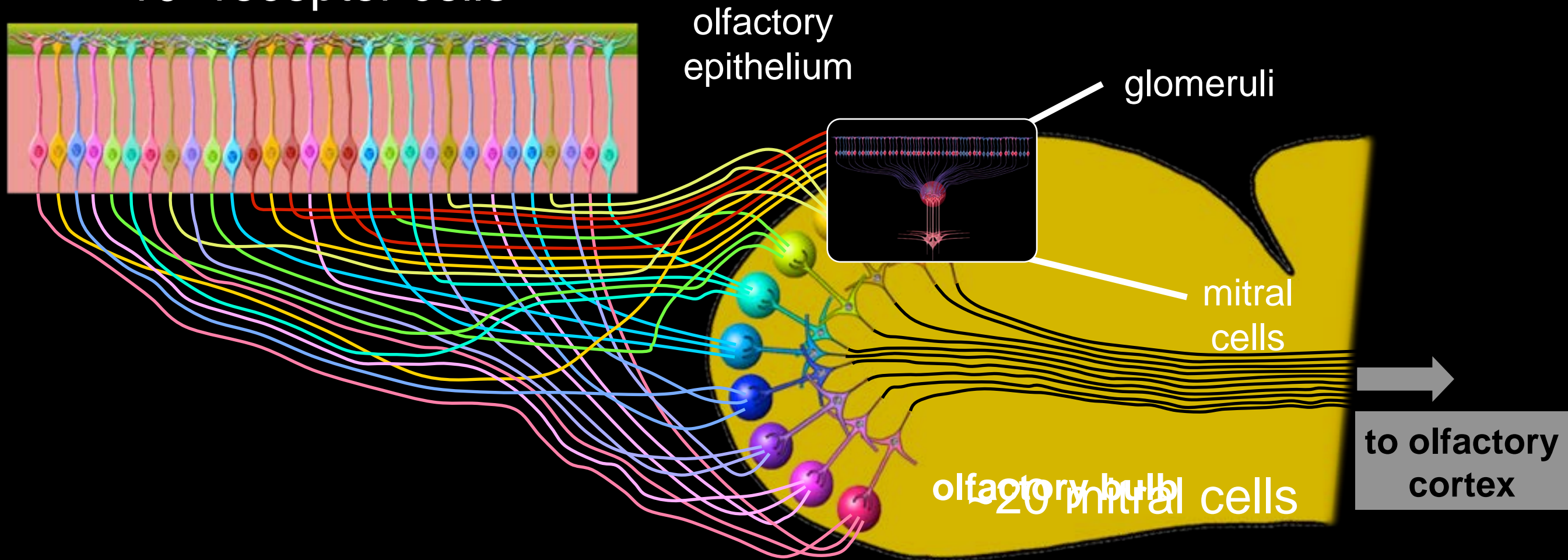
glomeruli

olfactory bulb



~5000 receptor cells

10^7 receptor cells



Olfactory receptors:

Human: ~ 350

Mouse: ~ 1200



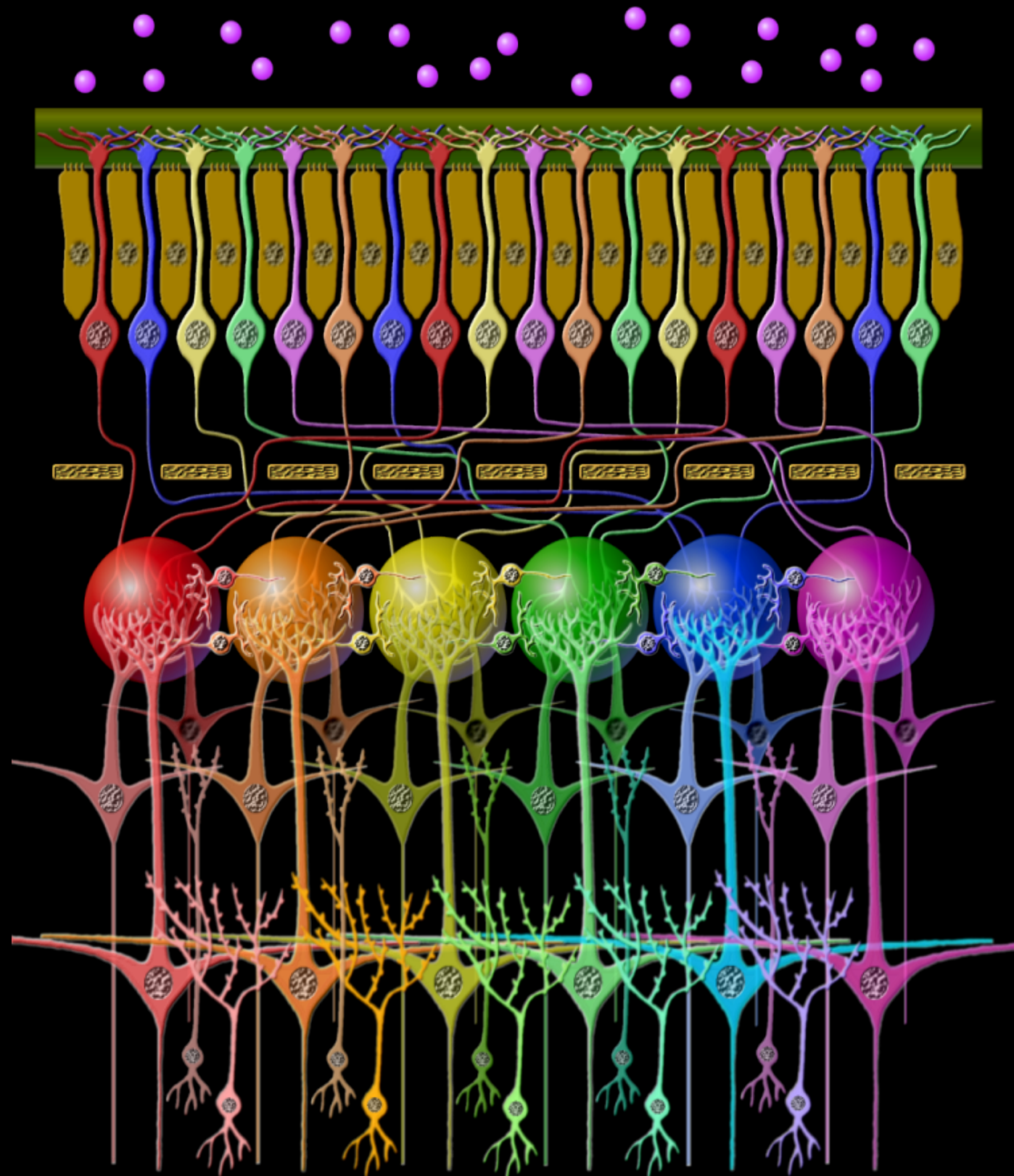
Odorants

Mucus

Olfactory epithelium

Cribriform plate

Olfactory Bulb



Supporting cell

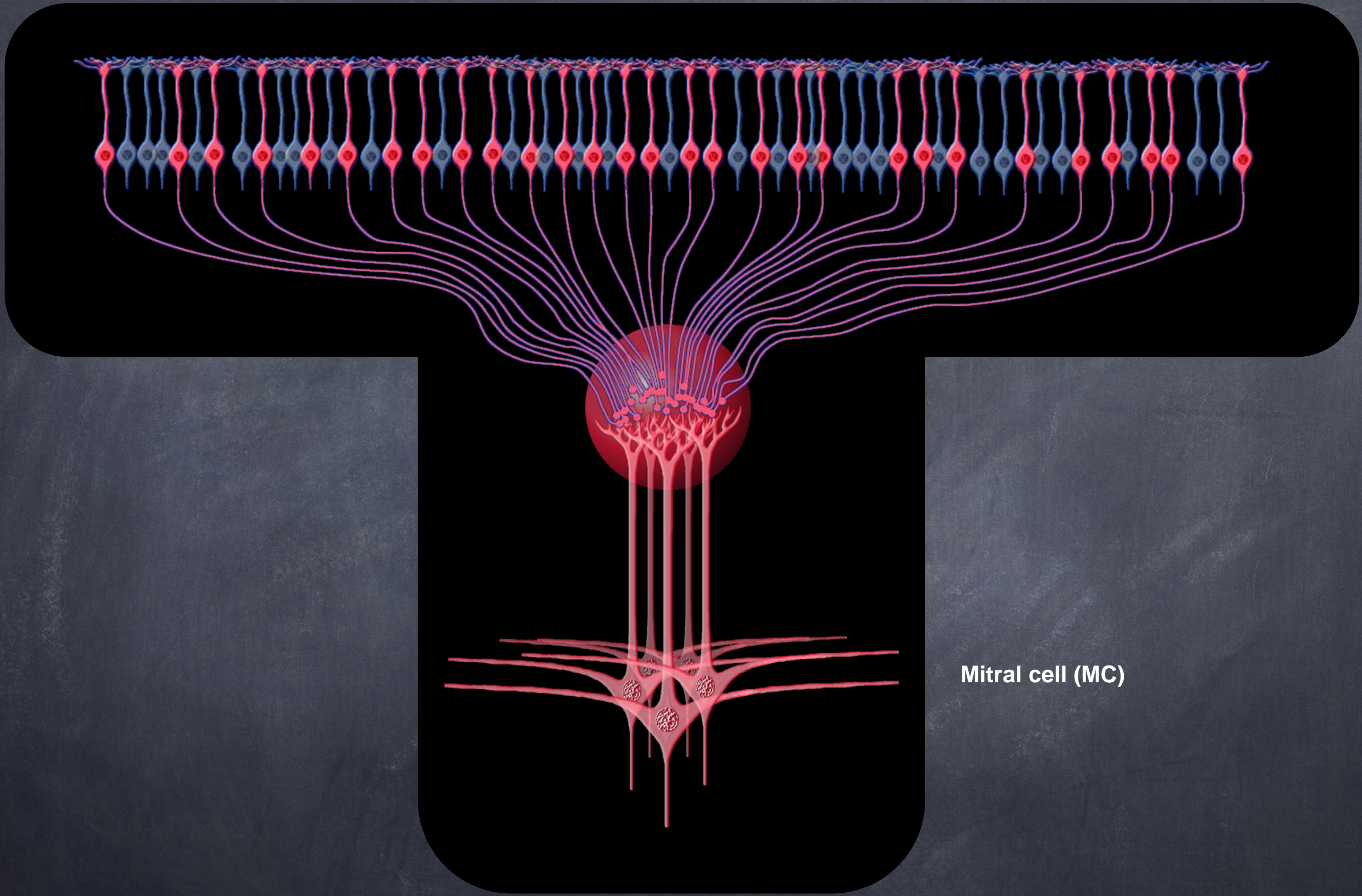
Receptor cell (RC)

Periglomerular cell (PG)

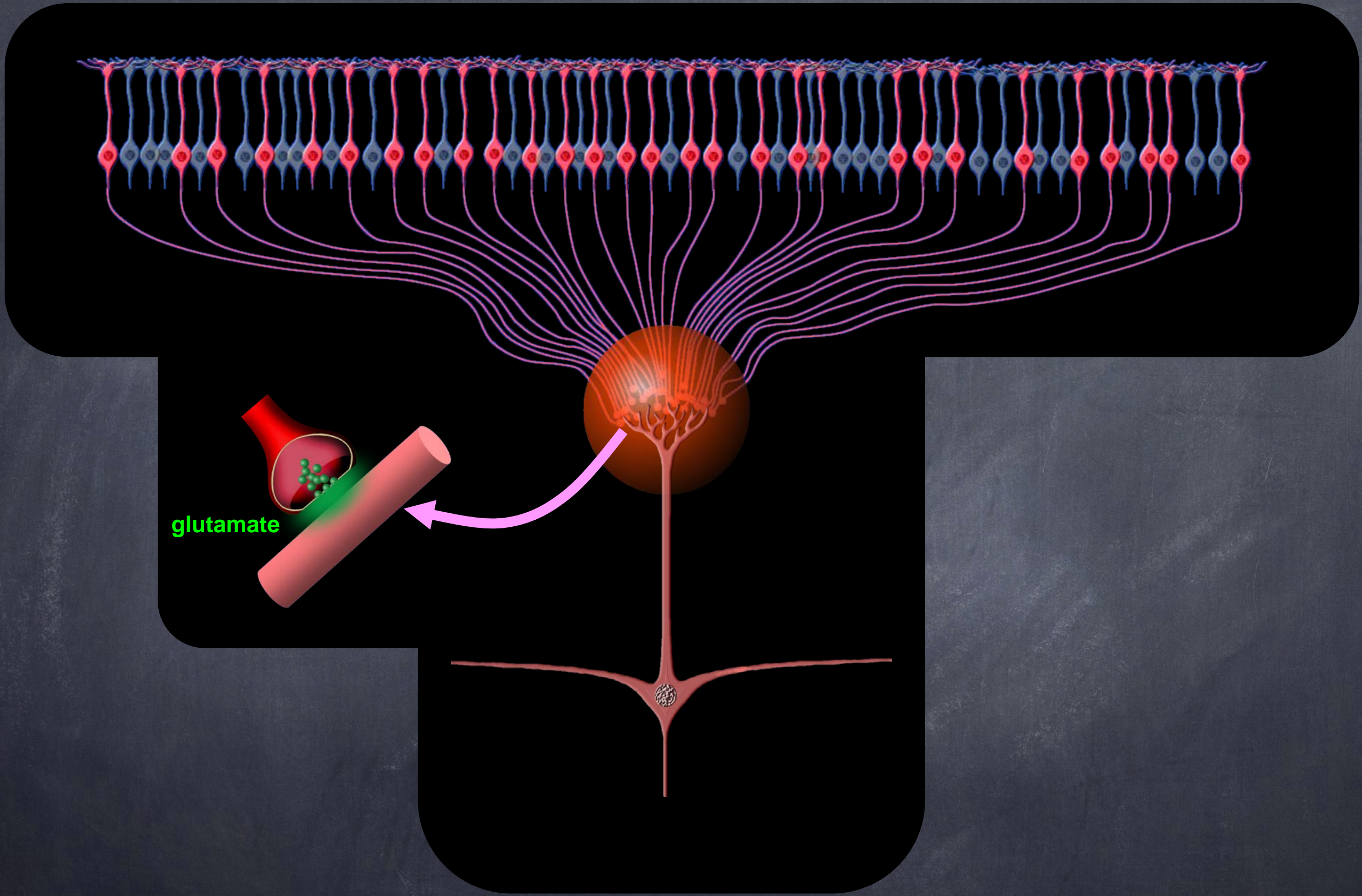
Tufted cell (TC)

Mitral cell (MC)

Granule cell (GC)



Mitral cell (MC)



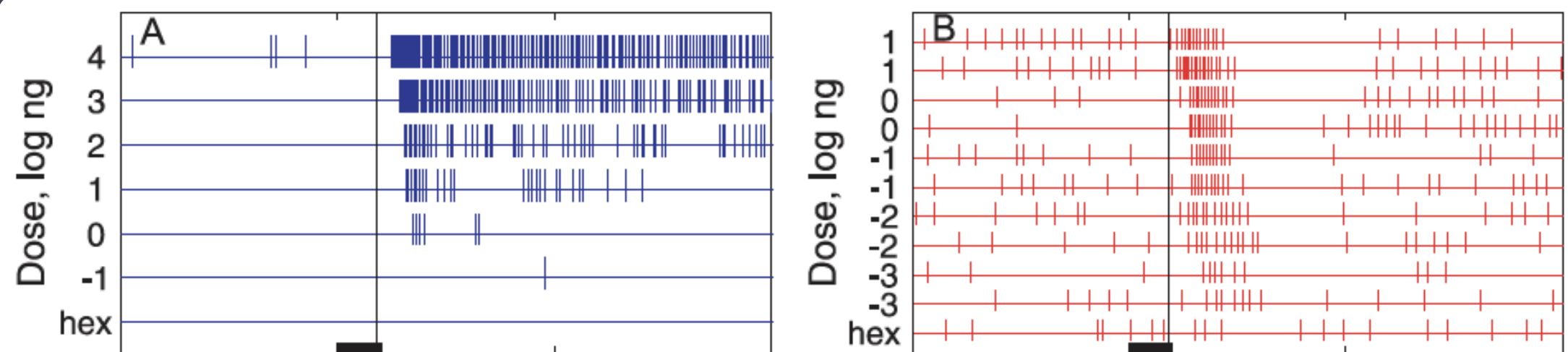
Heterogeneity and Convergence of Olfactory First-Order Neurons Account for the High Speed and Sensitivity of Second-Order Neurons

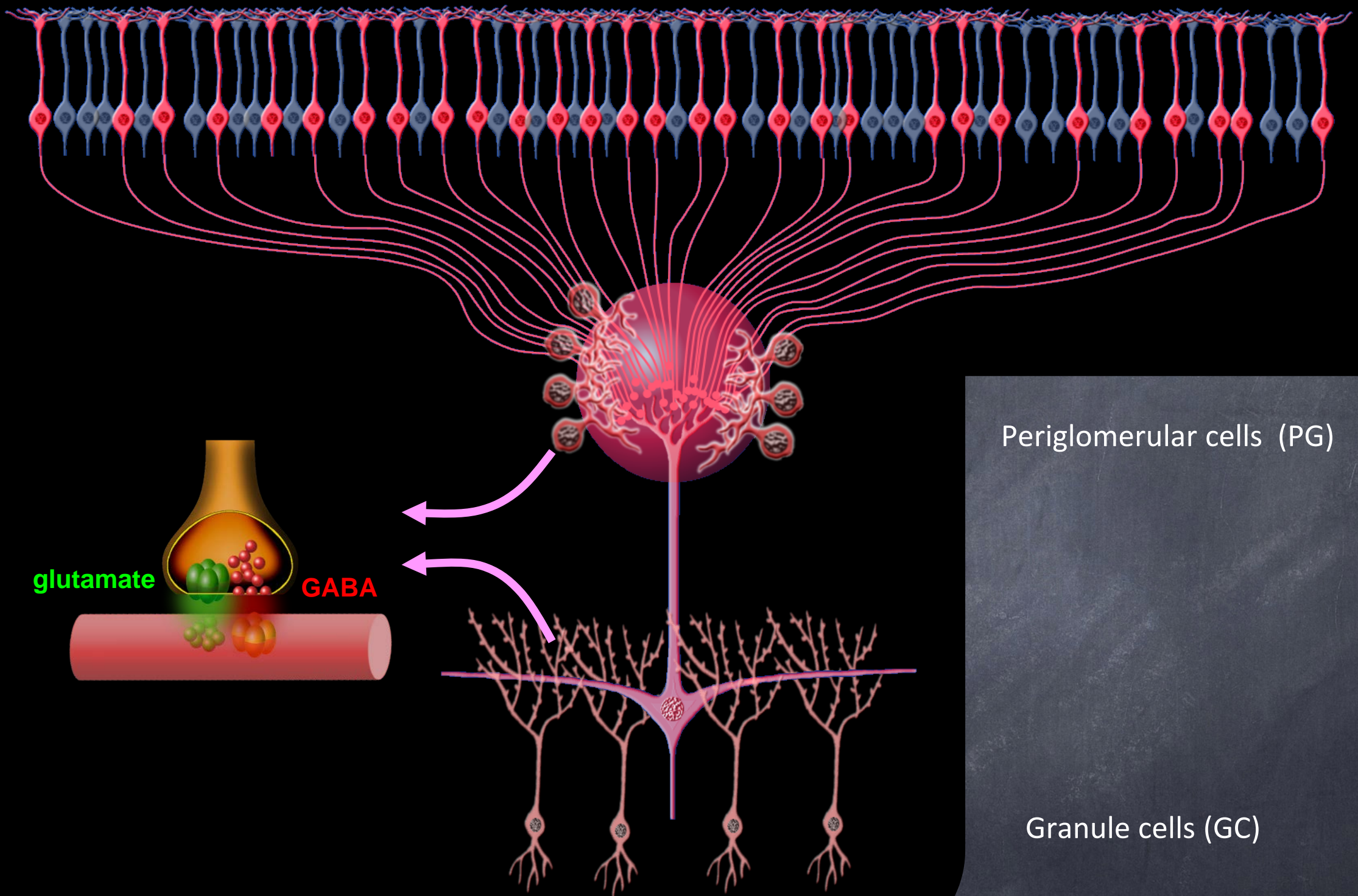
Jean-Pierre Rospars^{1*}, Alexandre Grémiaux^{1^{na}}, David Jarriault^{1^{nb}}, Antoine Chaffiol^{1^{nc}},
Christelle Monsempe¹, Nina Deisig¹, Sylvia Anton^{1nd}, Philippe Lucas¹, Dominique Martinez^{1,2}

¹ Institut National de la Recherche Agronomique (INRA), Unité Mixte de Recherche 1392 Institut d'Ecologie et des Sciences de l'Environnement de Paris, Versailles, France,
² Laboratoire Lorrain de Recherche en Informatique et ses Applications (LORIA), Unité Mixte de Recherche 7503, Centre National de la Recherche Scientifique (CNRS), Vandœuvre-lès-Nancy, France

OSNs

PNs

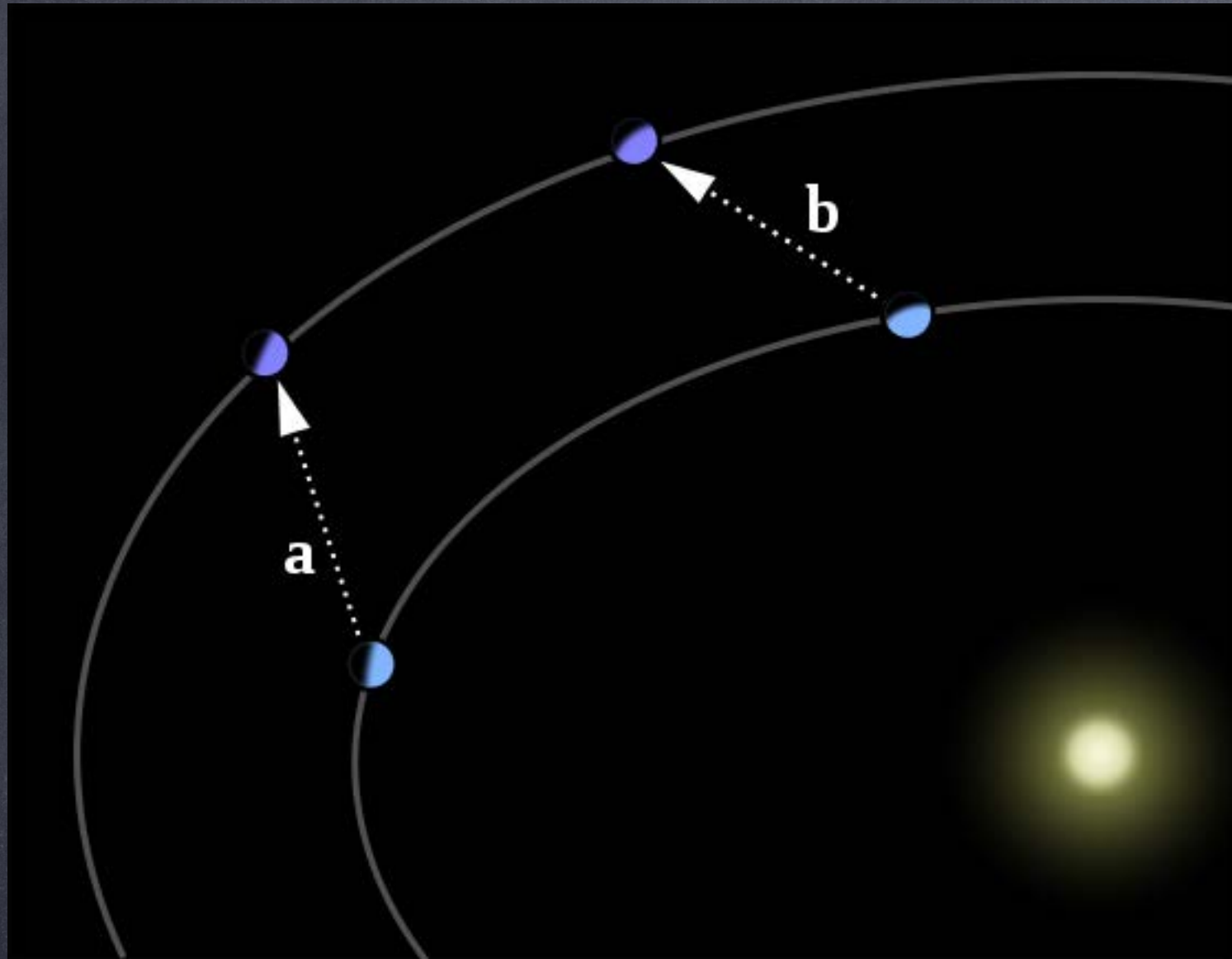




Periglomerular cells (PG)

Granule cells (GC)

Discovery of Neptune (September 24, 1846)



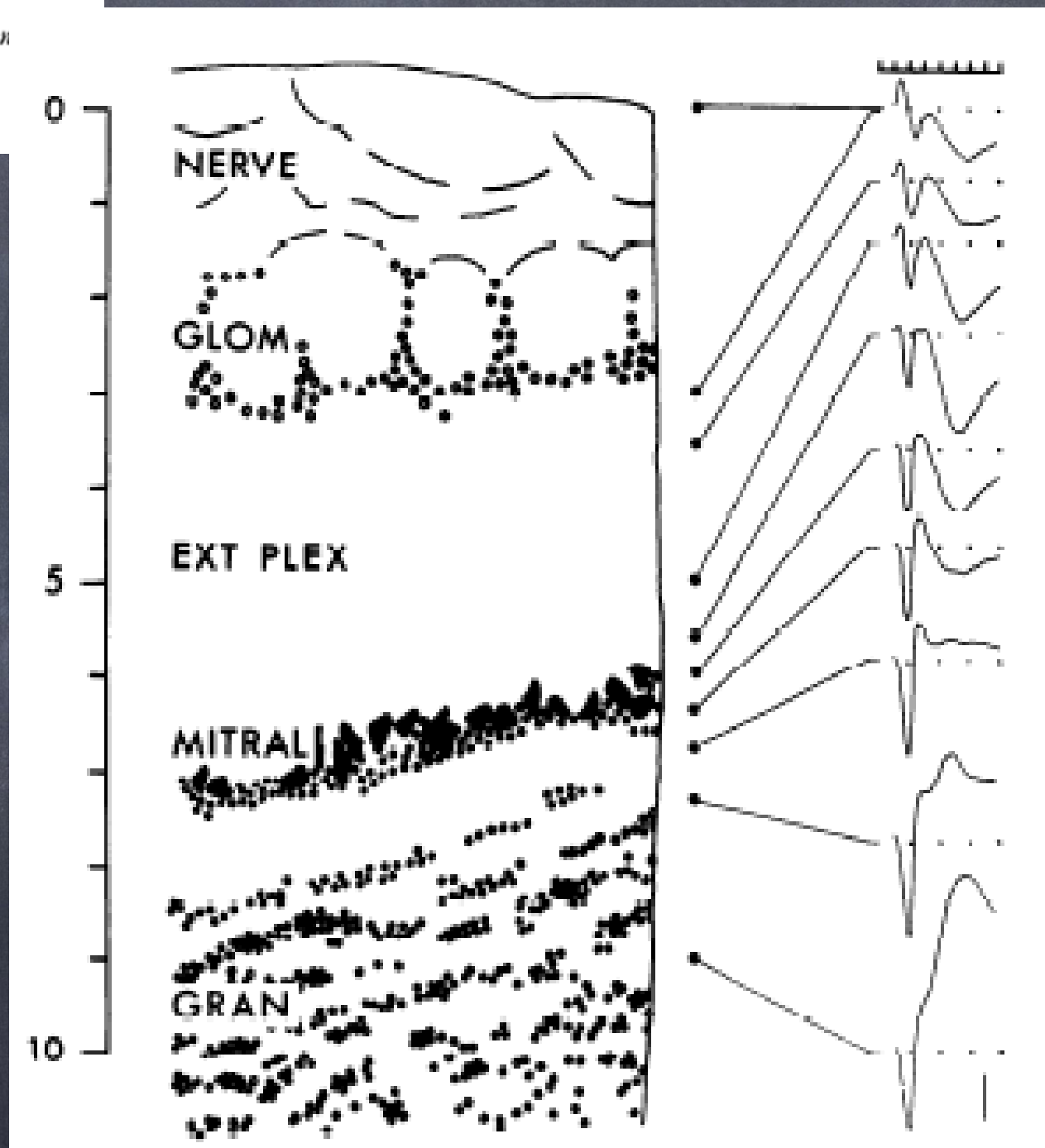
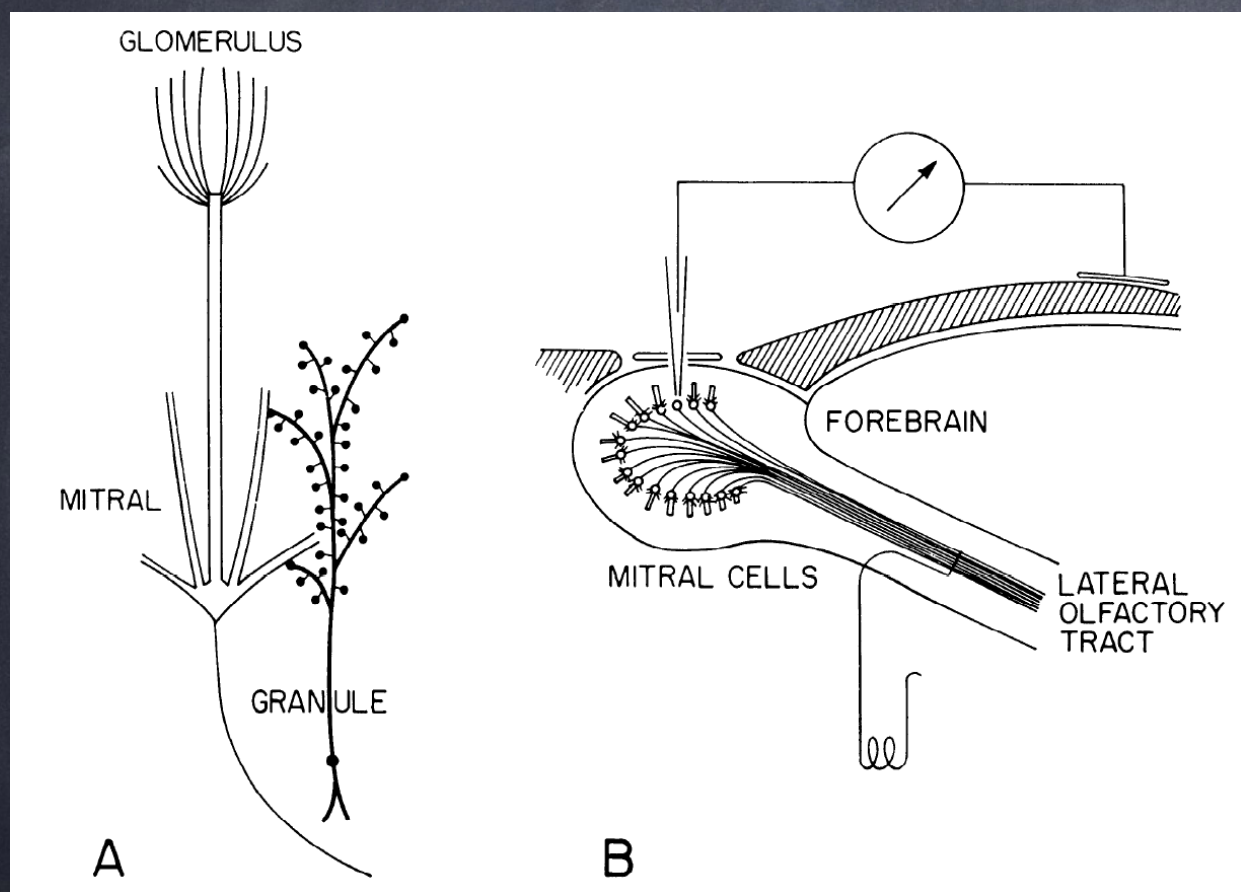
Urbain Le Verrier (1811-1877)
Johann Gottfried Galle (1812-1910)
Heinrich Louis d'Arrest (1822-1975)

Dendrodendritic Synaptic Pathway for Inhibition in the Olfactory Bulb

WILFRID RALL, G. M. SHEPHERD, T. S. REESE, AND M. W. BRIGHTMAN¹

*Office of Mathematical Research, and the Laboratory of Neuroanatomical Sciences,
National Institutes of Health, Bethesda, Maryland*

Received July 22, 1965



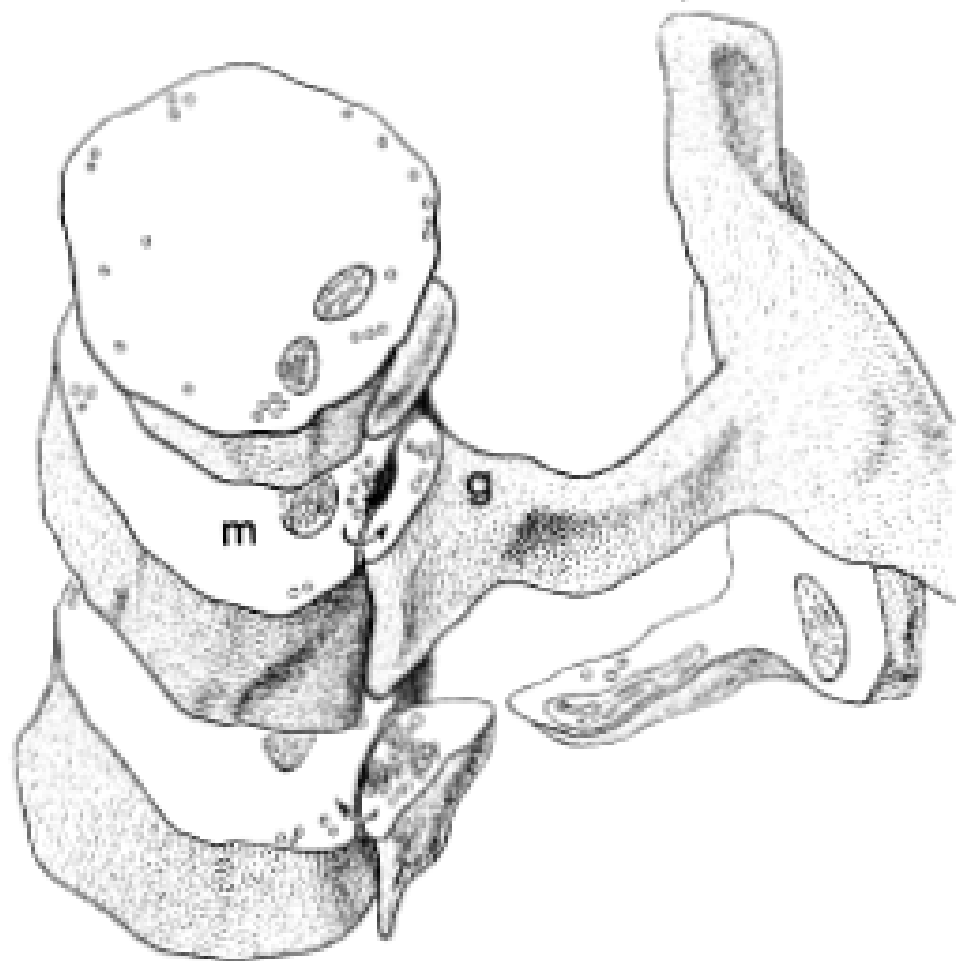


FIG. 3. Graphical reconstruction (11) of a granule synaptic ending (g) on a mitral secondary dendrite (m). The granule ending is shaped like a gemmule and arises from a granule dendrite lying approximately perpendicular to the mitral dendrite. Within a single ending are two synaptic contacts with opposite polarities (indicated by arrows). The reconstruction was made directly from a series of tracings of twenty-three consecutive electron micrographs; no sections are omitted in showing cut surfaces. Microtubules and endoplasmic reticulum are not shown. $\times 20\ 000$.

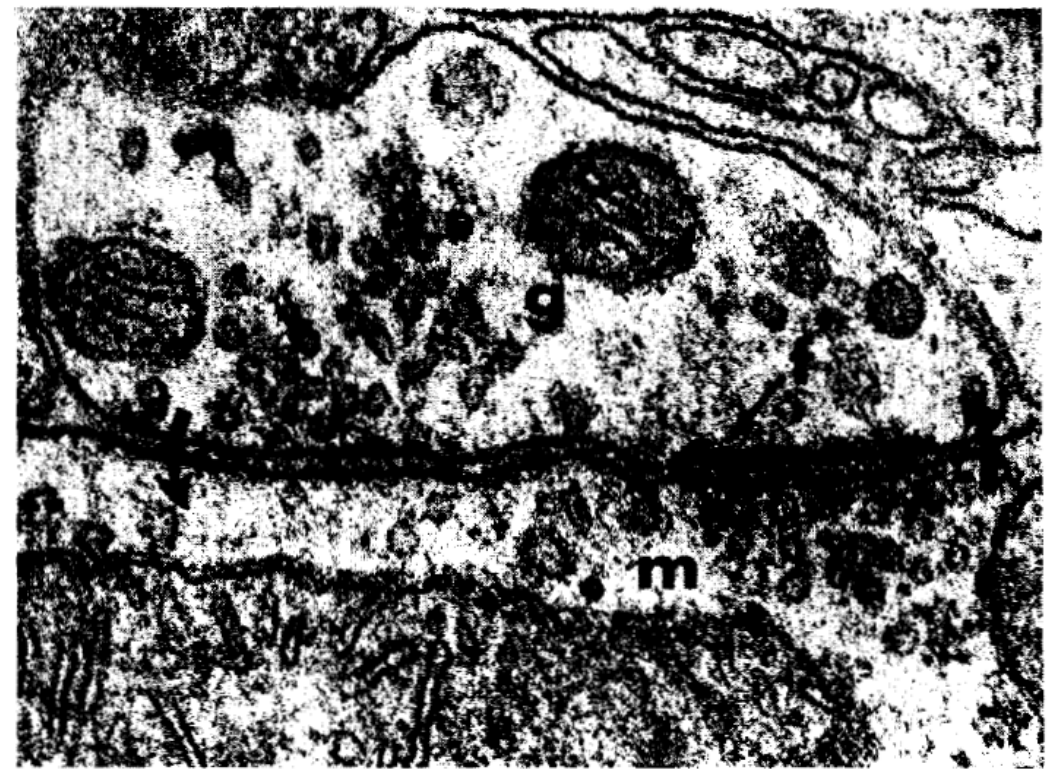
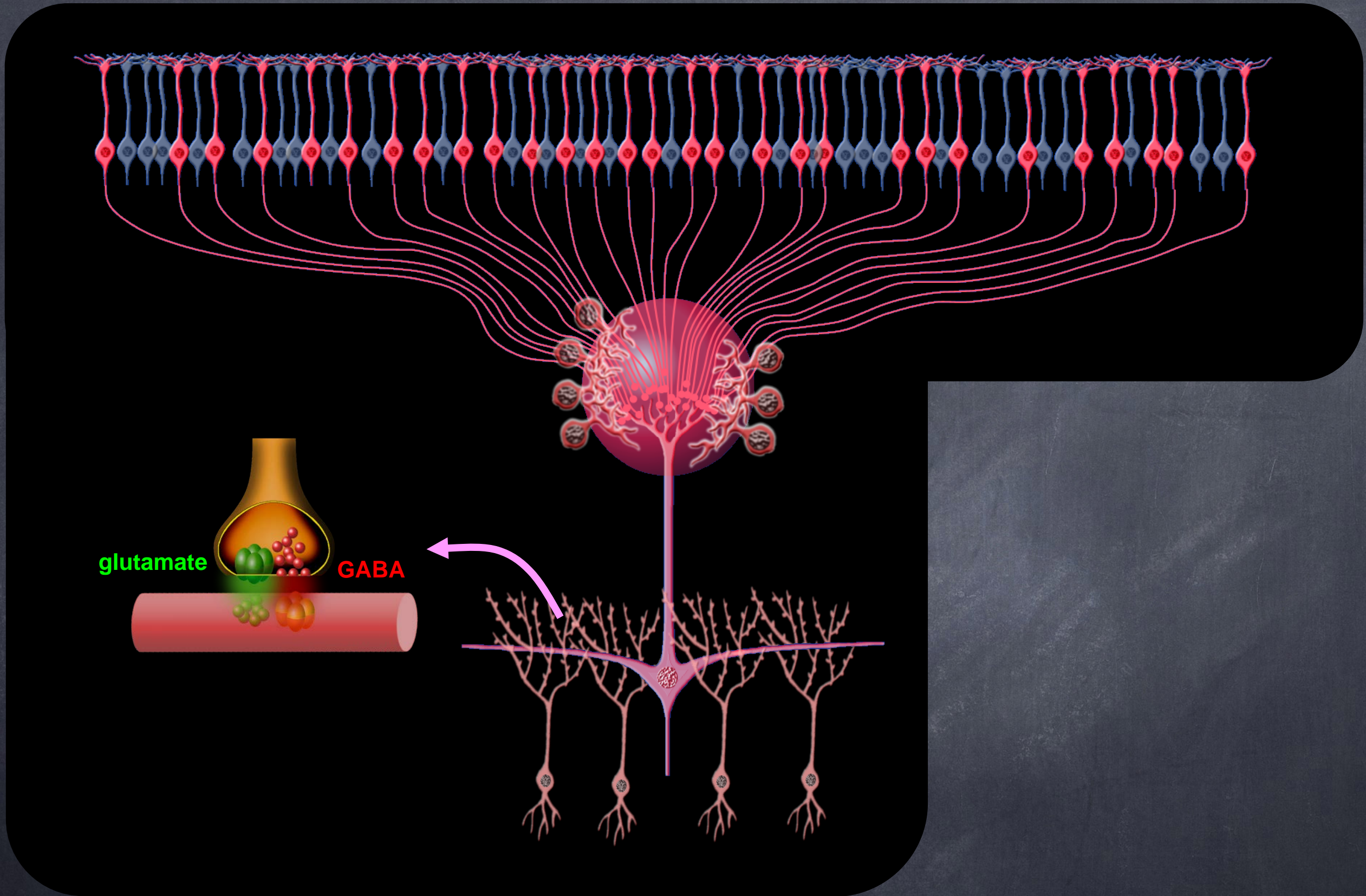
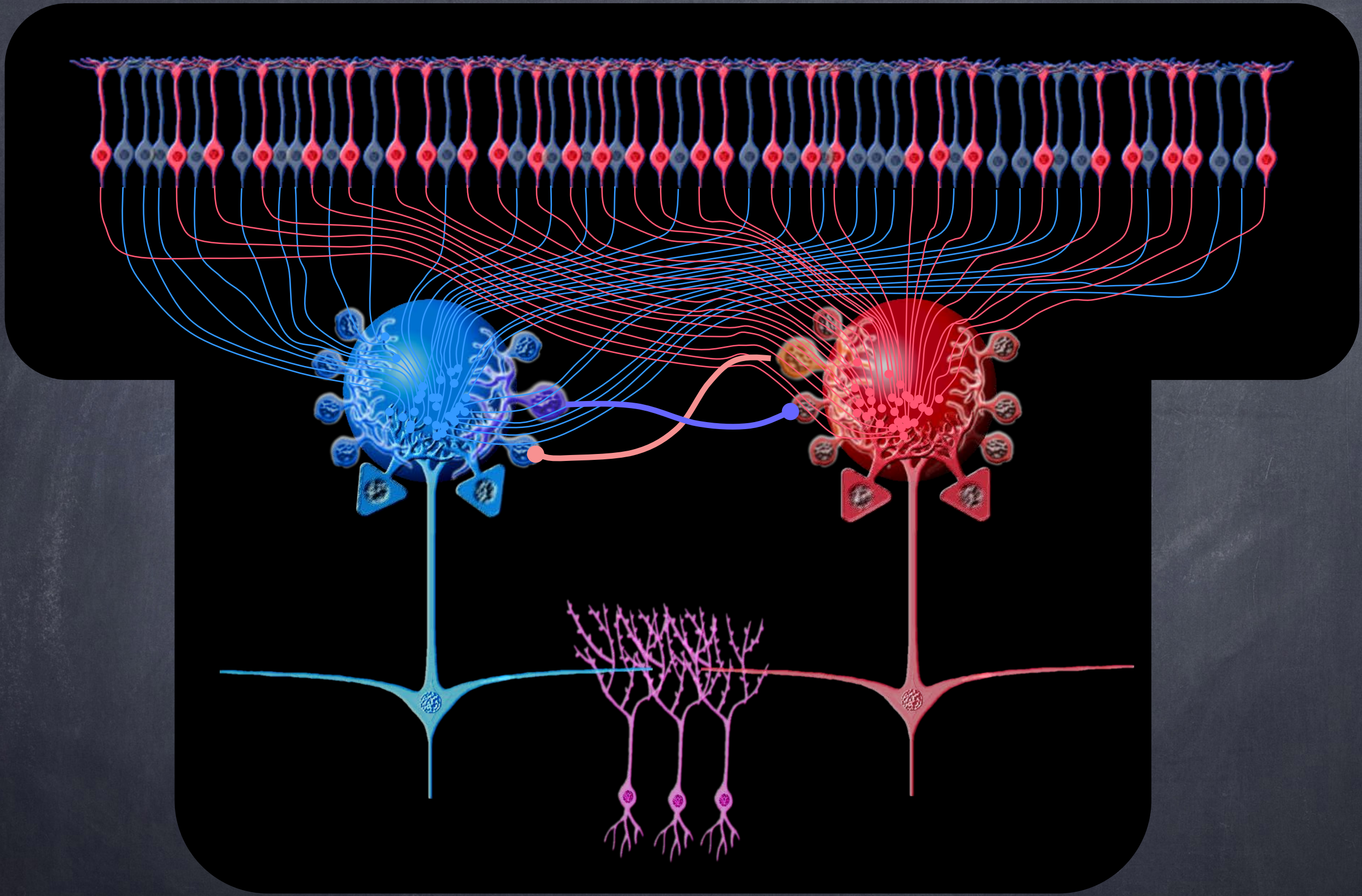
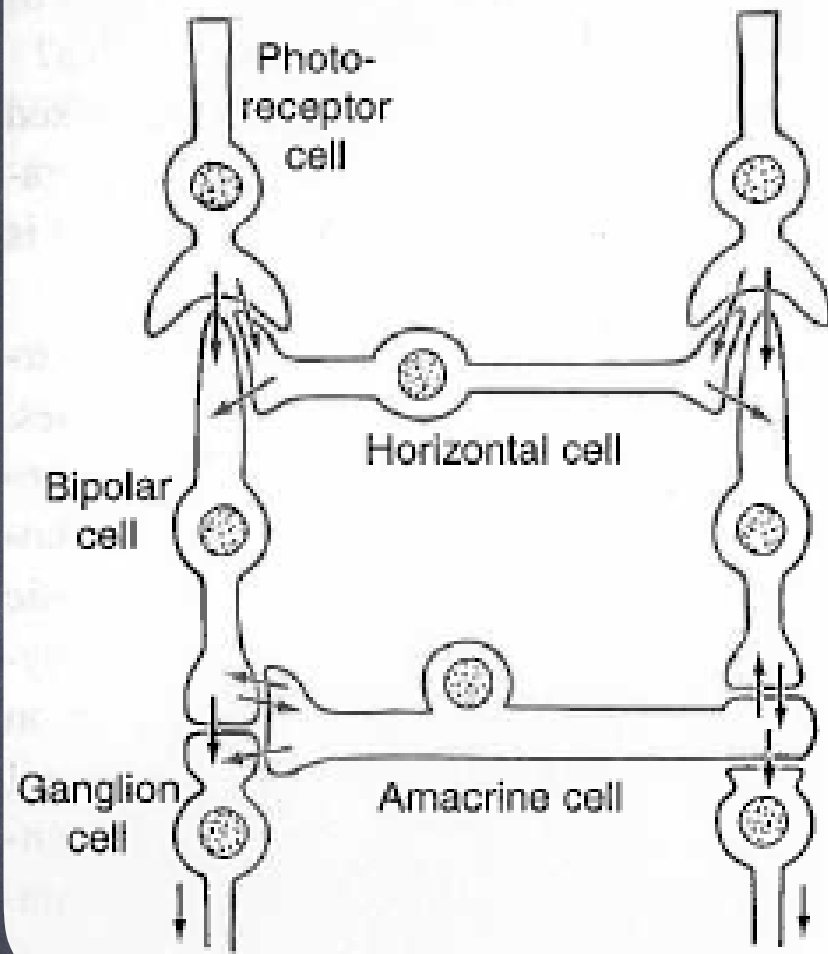


FIG. 4. A mitral secondary dendrite (m) and one of the many synaptic endings (g), presumed to be gemmules from granule cells. There are two synaptic contacts with opposite polarities (indicated by arrows). Where the polarity is from the mitral dendrite to the granule dendrite (as judged by the grouping of vesicles), a dense filamentous material (f) is attached to the postsynaptic cell membrane. Lead citrate; $\times 90\ 000$.

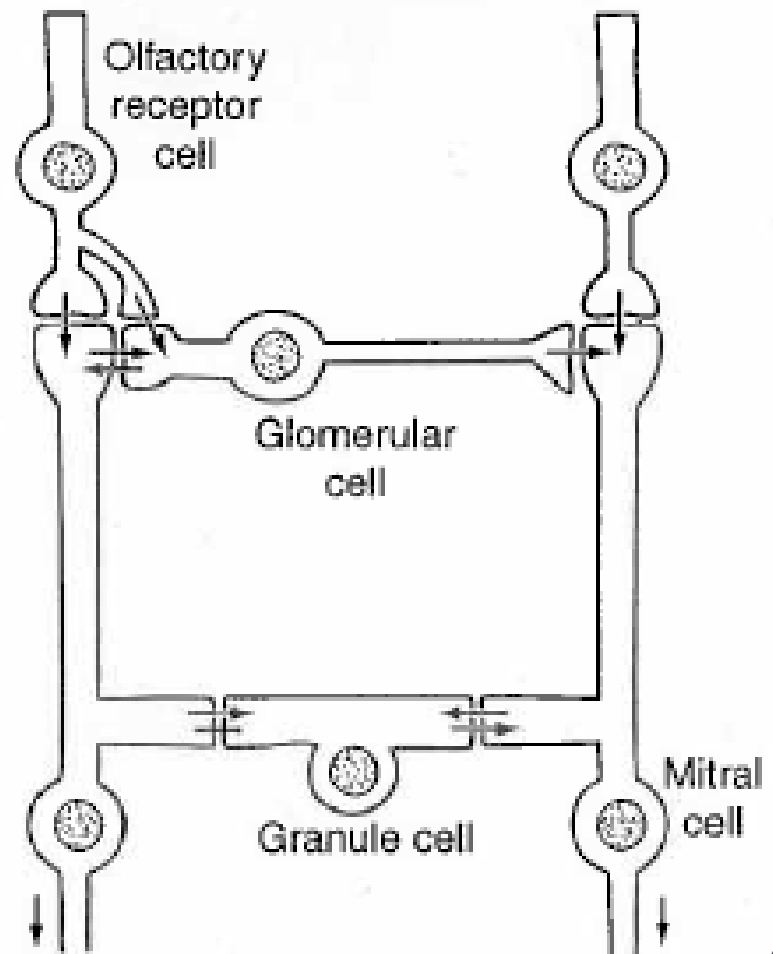


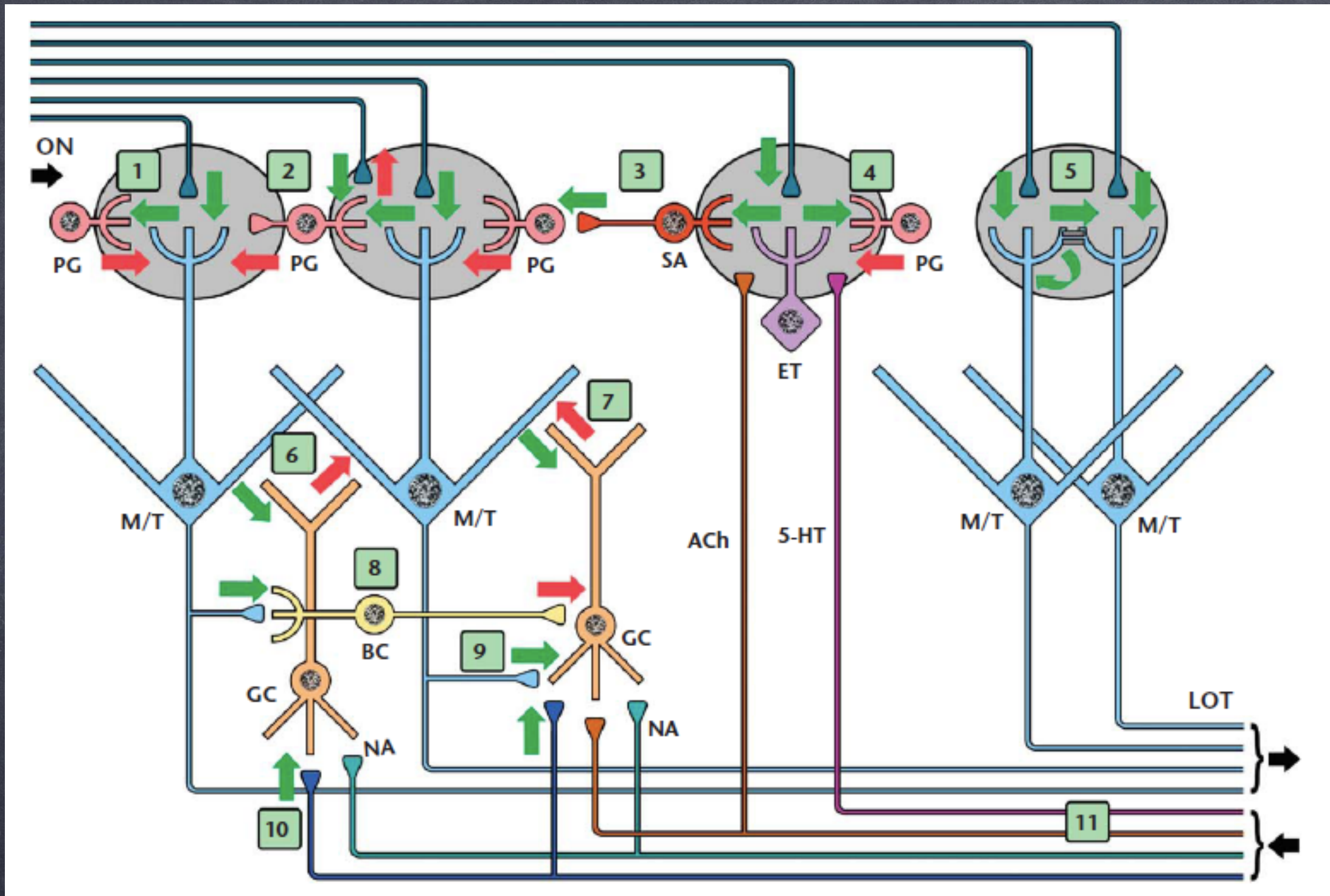


A. RETINA



B. OLFACTORY BULB

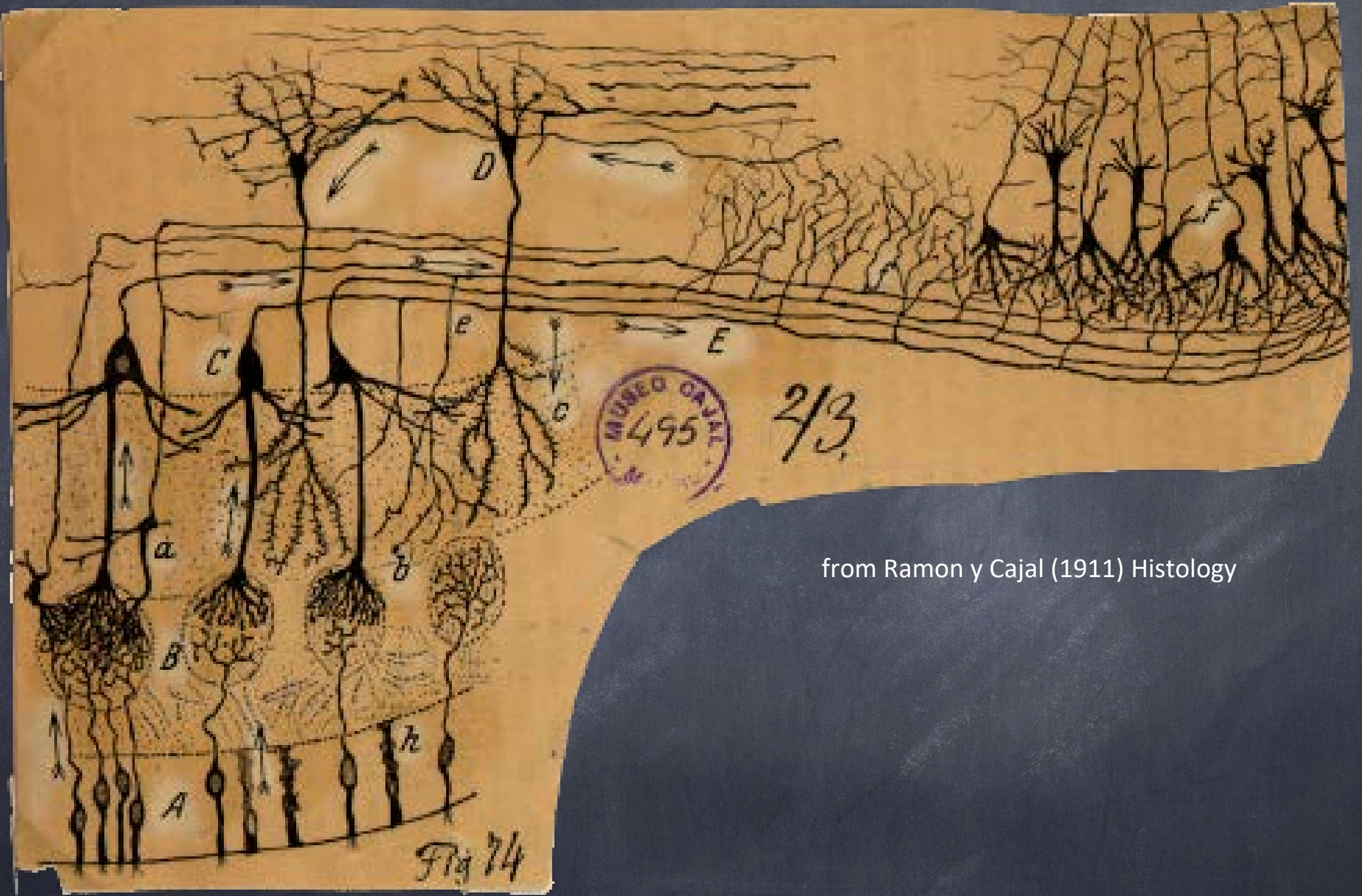




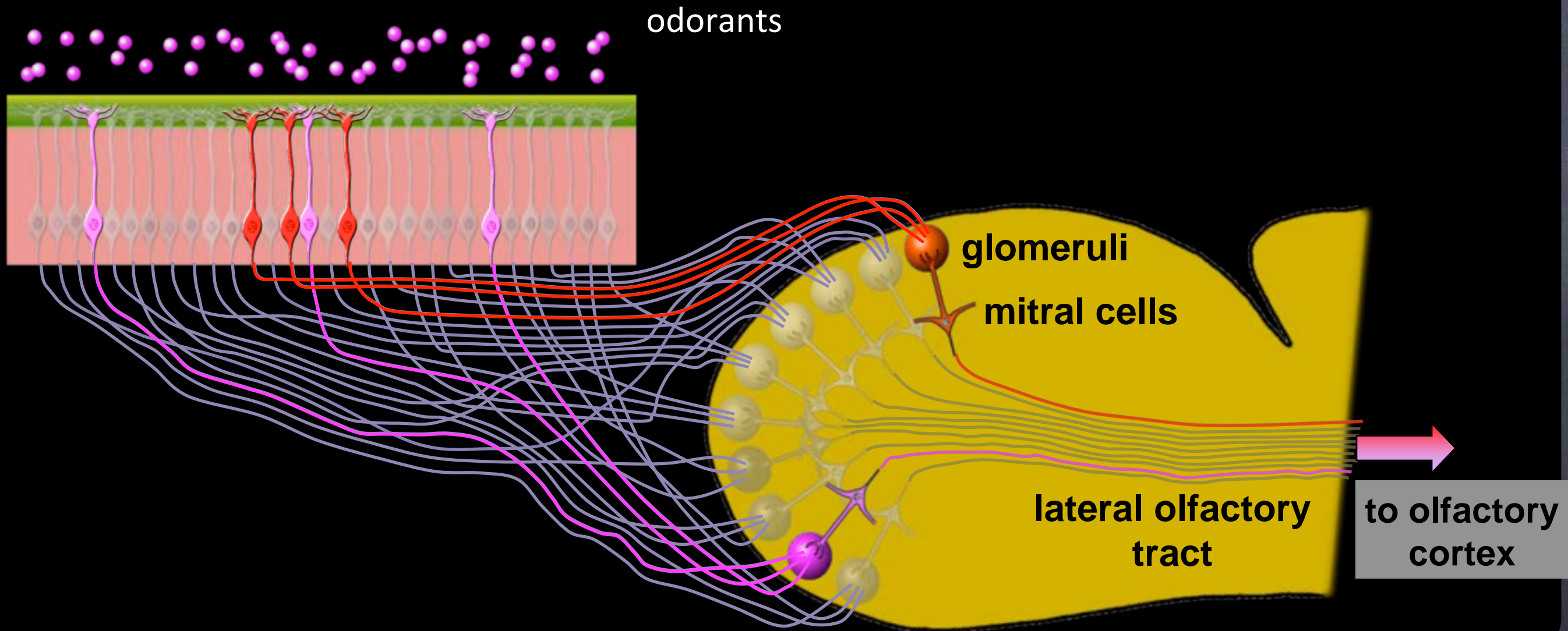
M/T - mitral tufted cells
 PG - periglomerular cell

ET - external tufted cell
 SA - short axon cell

GC - granule cell
 BC - Blane cell



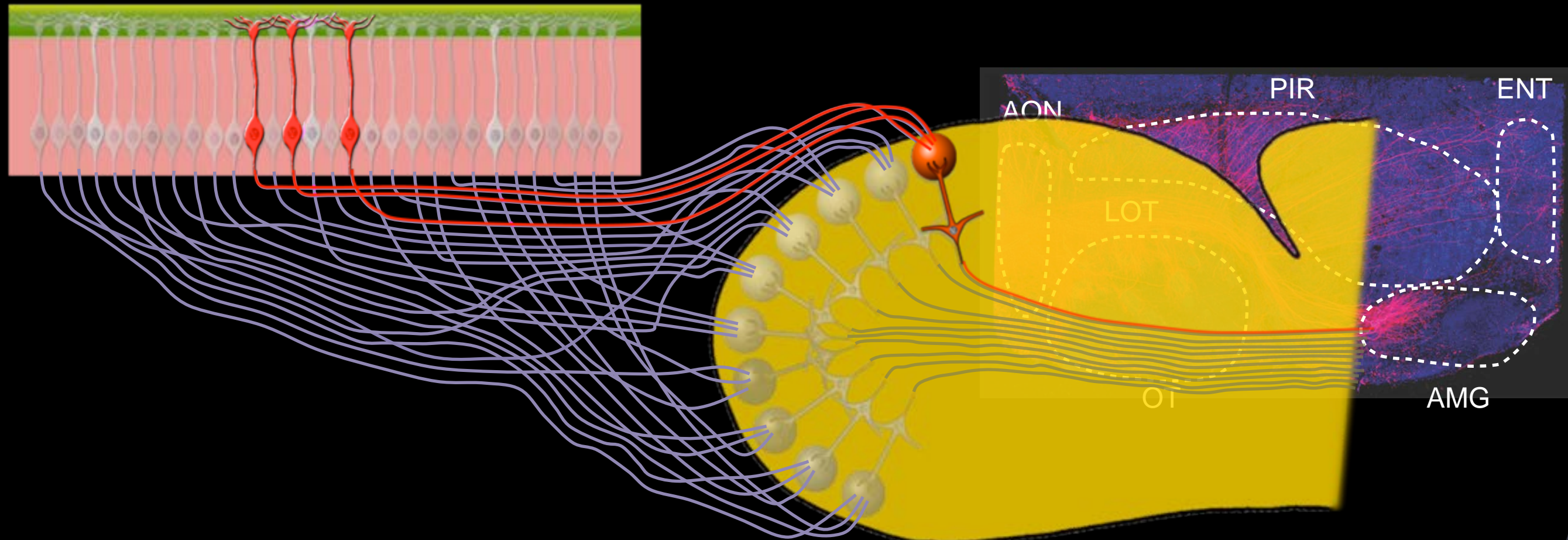
from Ramon y Cajal (1911) Histology



Distinct representations of olfactory information in different cortical centres

Dara L. Sosulski¹, Maria Lissitsyna Bloom^{1†}, Tyler Cutforth^{1†}, Richard Axel¹ & Sandeep Robert Datta^{1†}

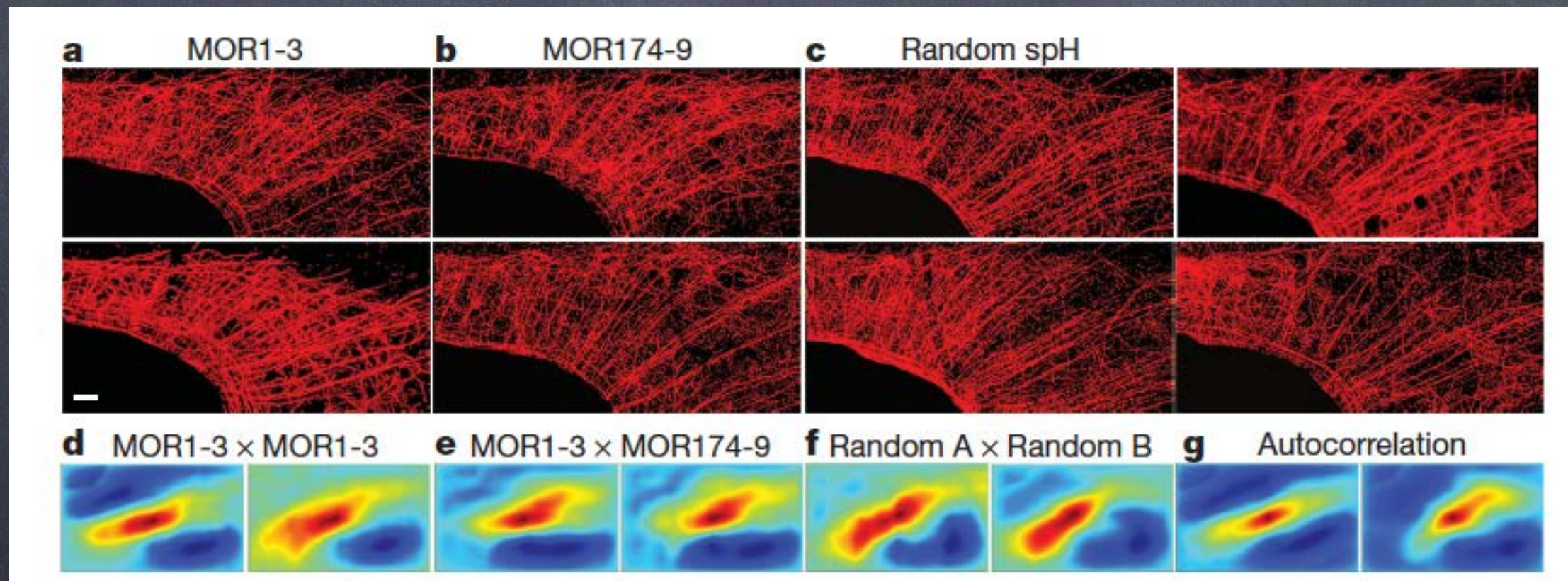
Nature 472, 213–216 (2011).



Distinct representations of olfactory information in different cortical centres

Dara L. Sosulski¹, Maria Lissitsyna Bloom^{1†}, Tyler Cutforth^{1†}, Richard Axel¹ & Sandeep Robert Datta^{1†}

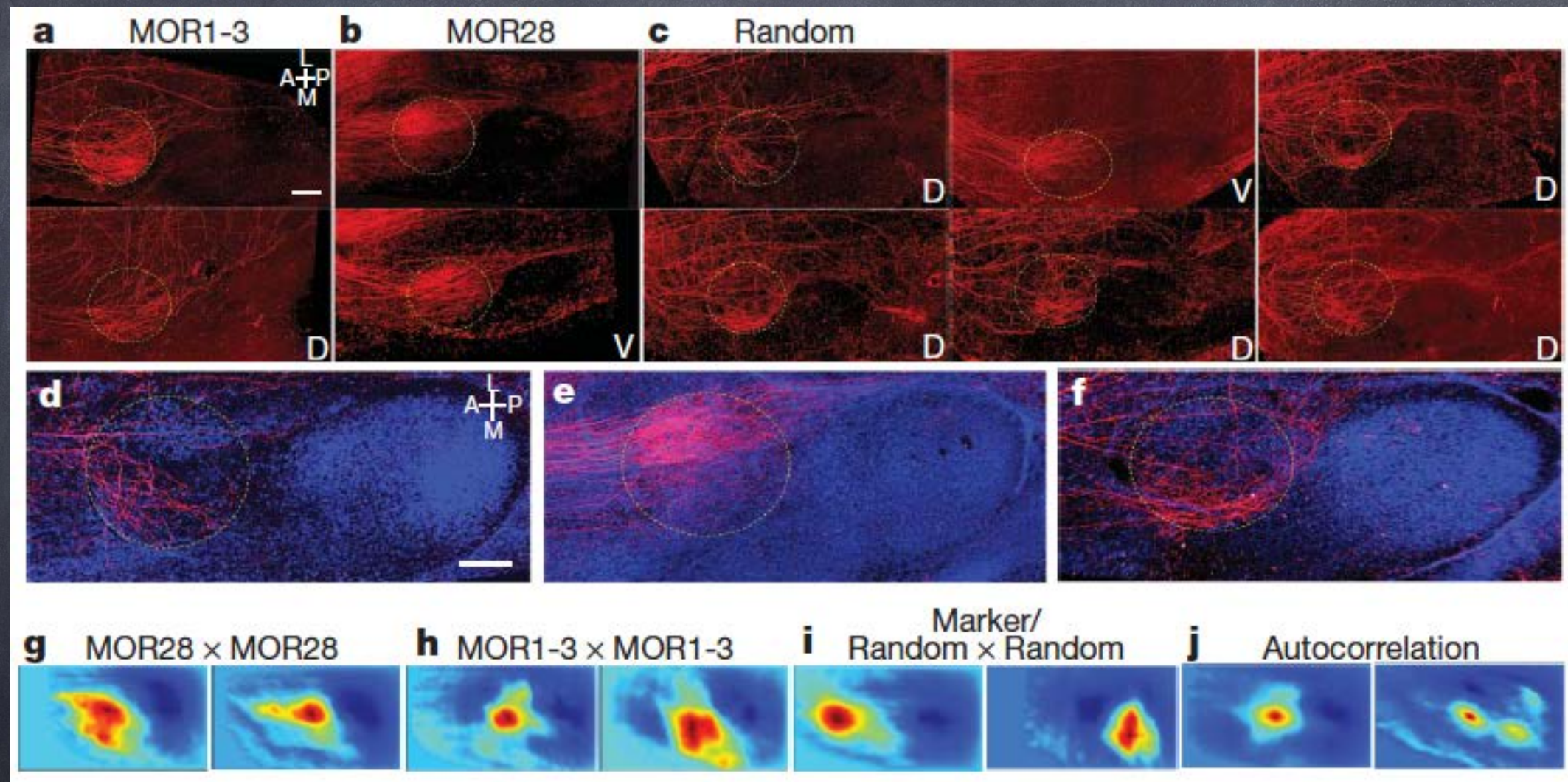
Nature 472, 213–216 (2011).

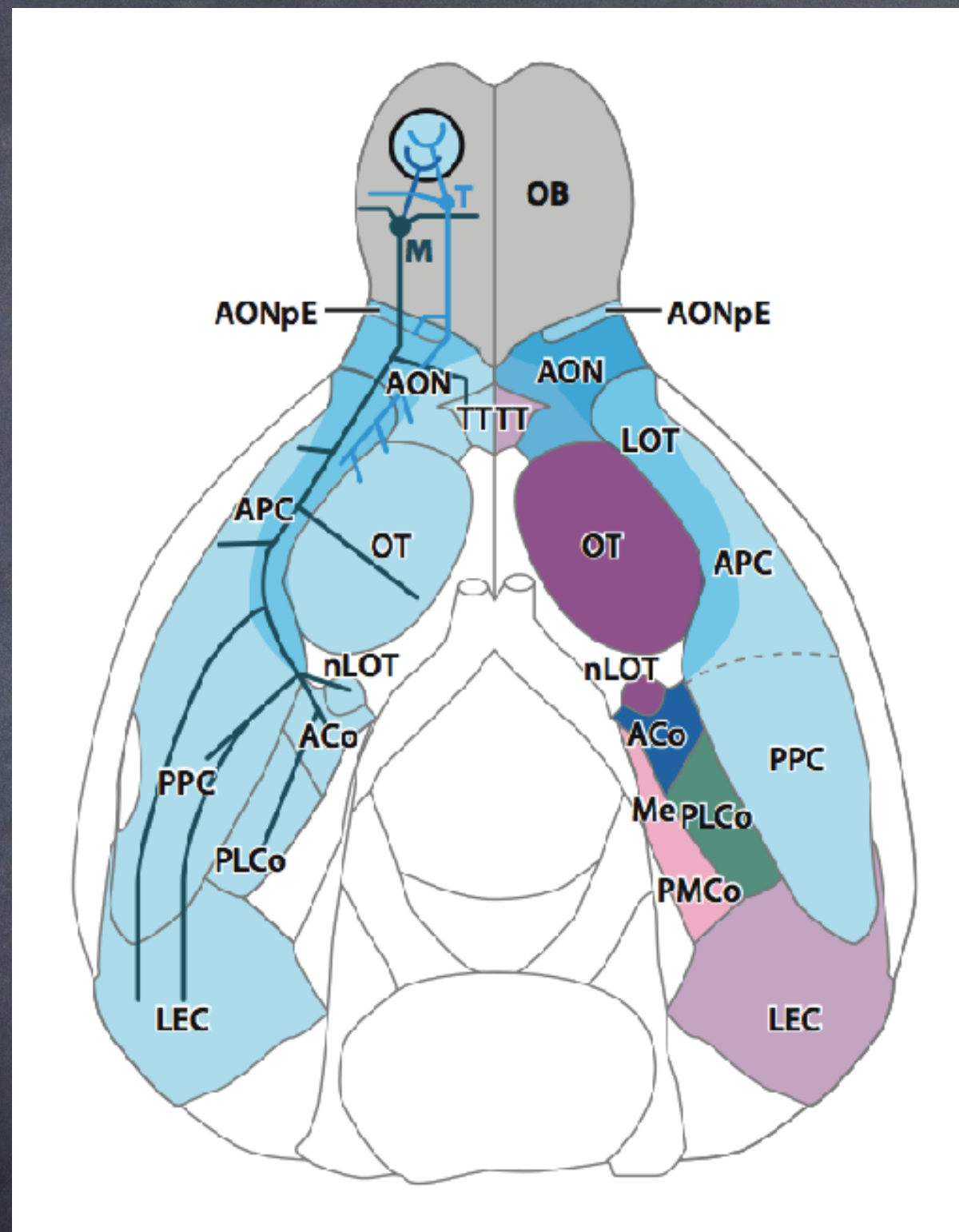


Distinct representations of olfactory information in different cortical centres

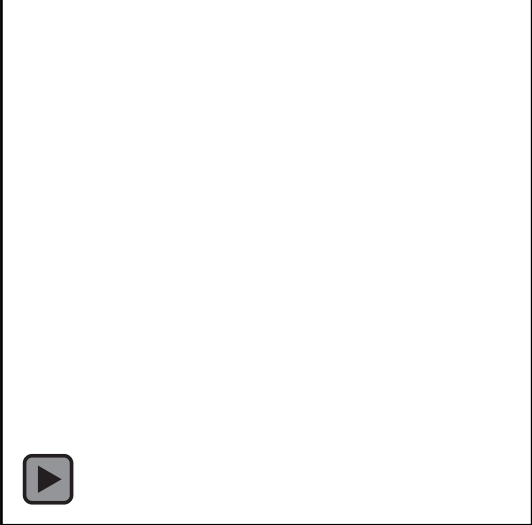
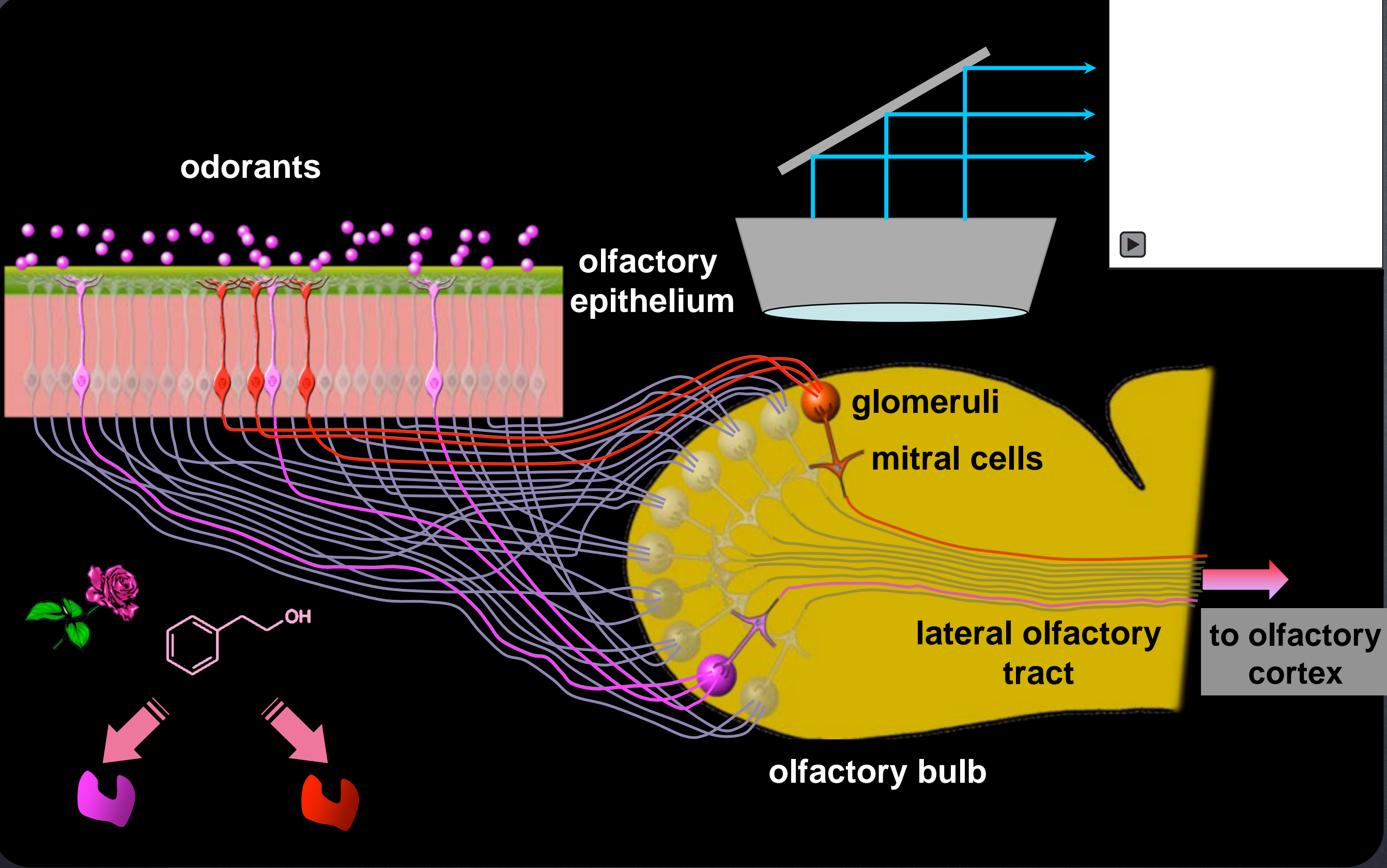
Dara L. Sosulski¹, Maria Lissitsyna Bloom^{1†}, Tyler Cutforth^{1†}, Richard Axel¹ & Sandeep Robert Datta^{1†}

Nature 472, 213–216 (2011).



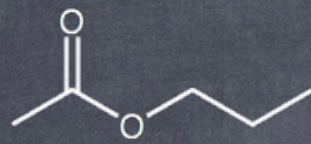
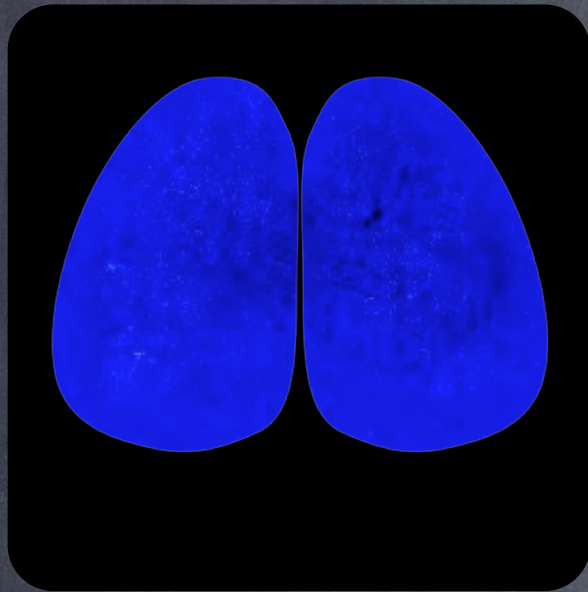


From Mori & Sakano, 2011; adapted from Luskin & Price, 1983

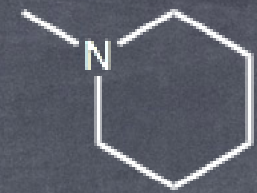
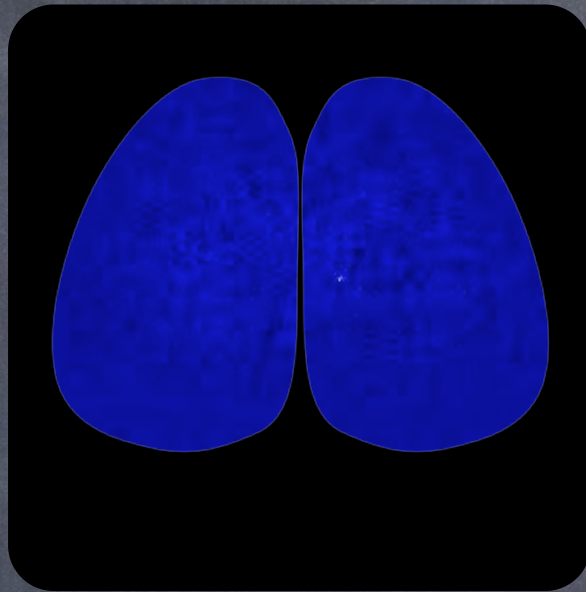




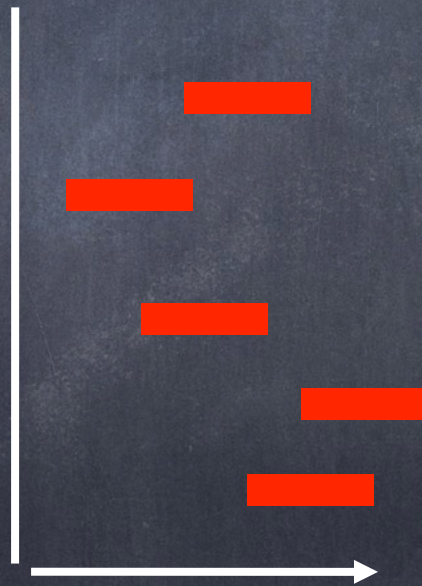
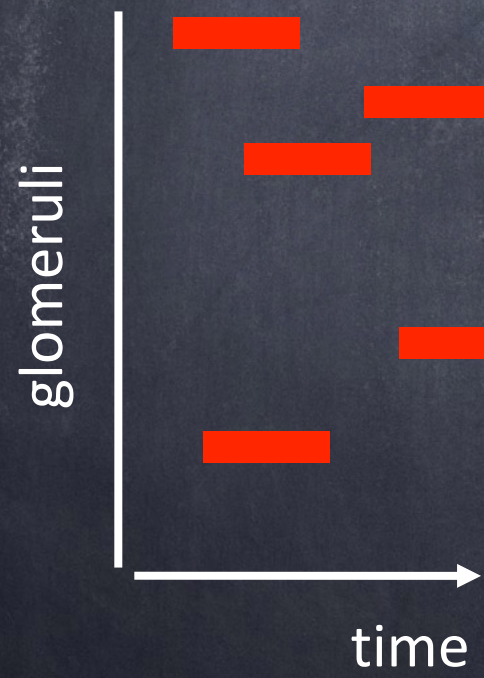
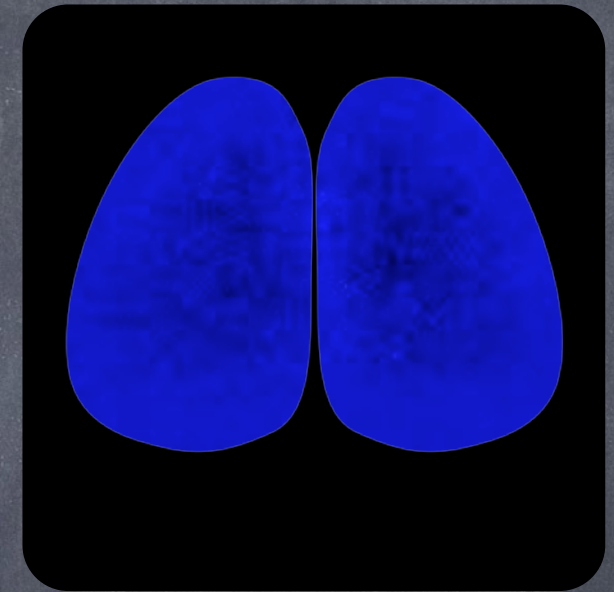
butanal

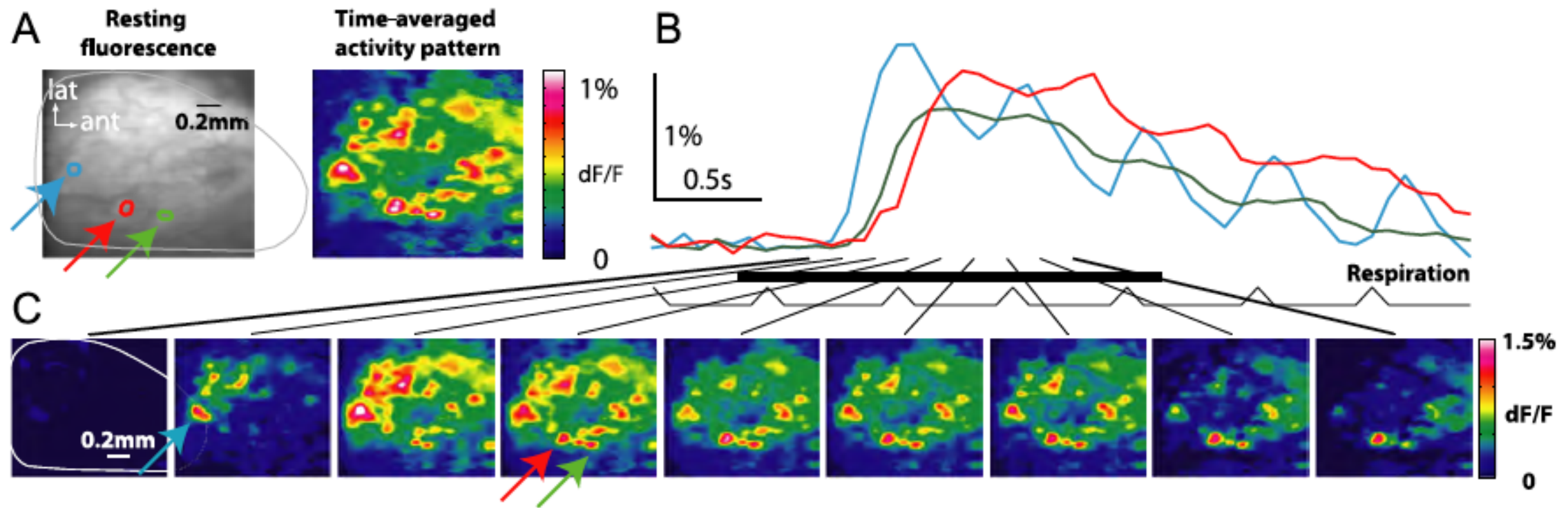


propylacetate

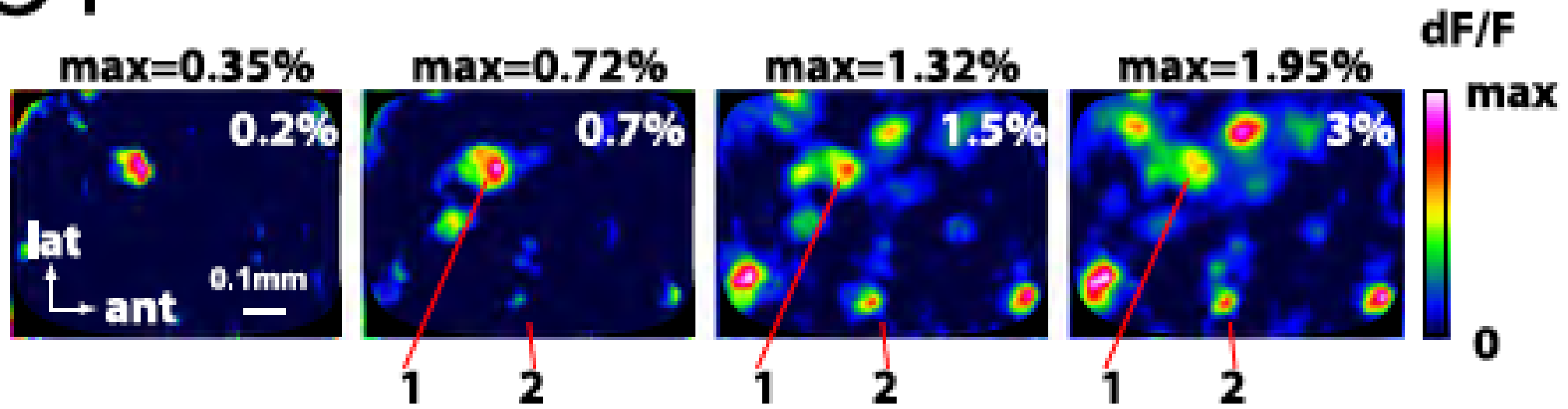


N-methylpiperidine

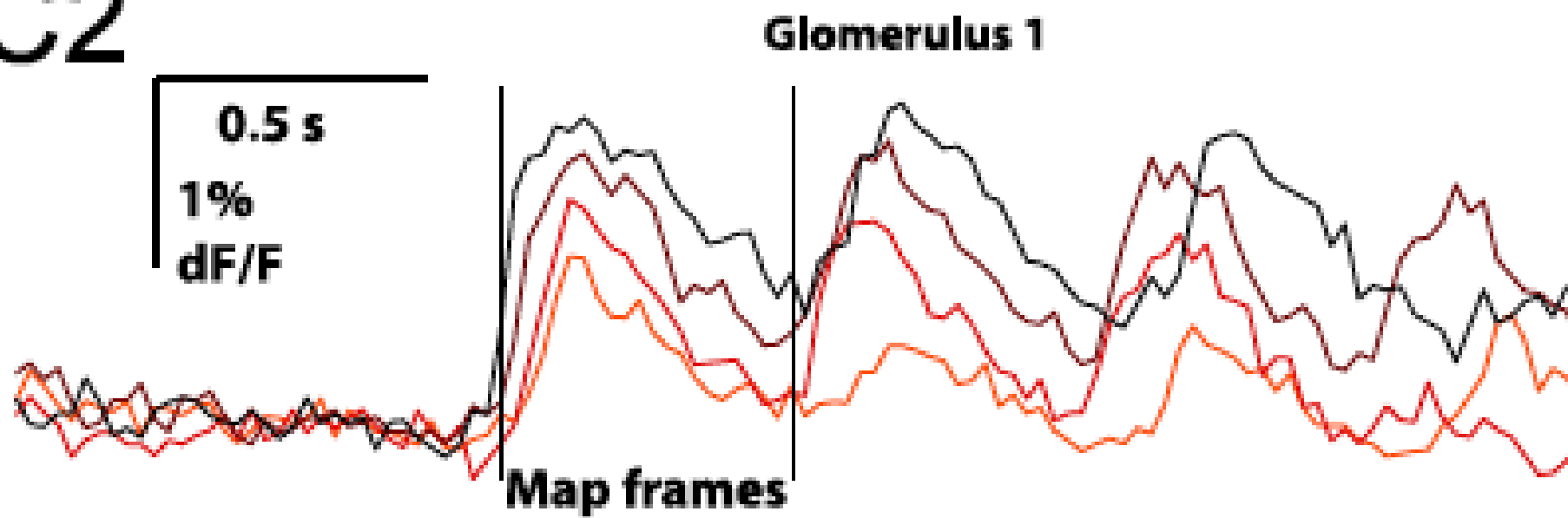




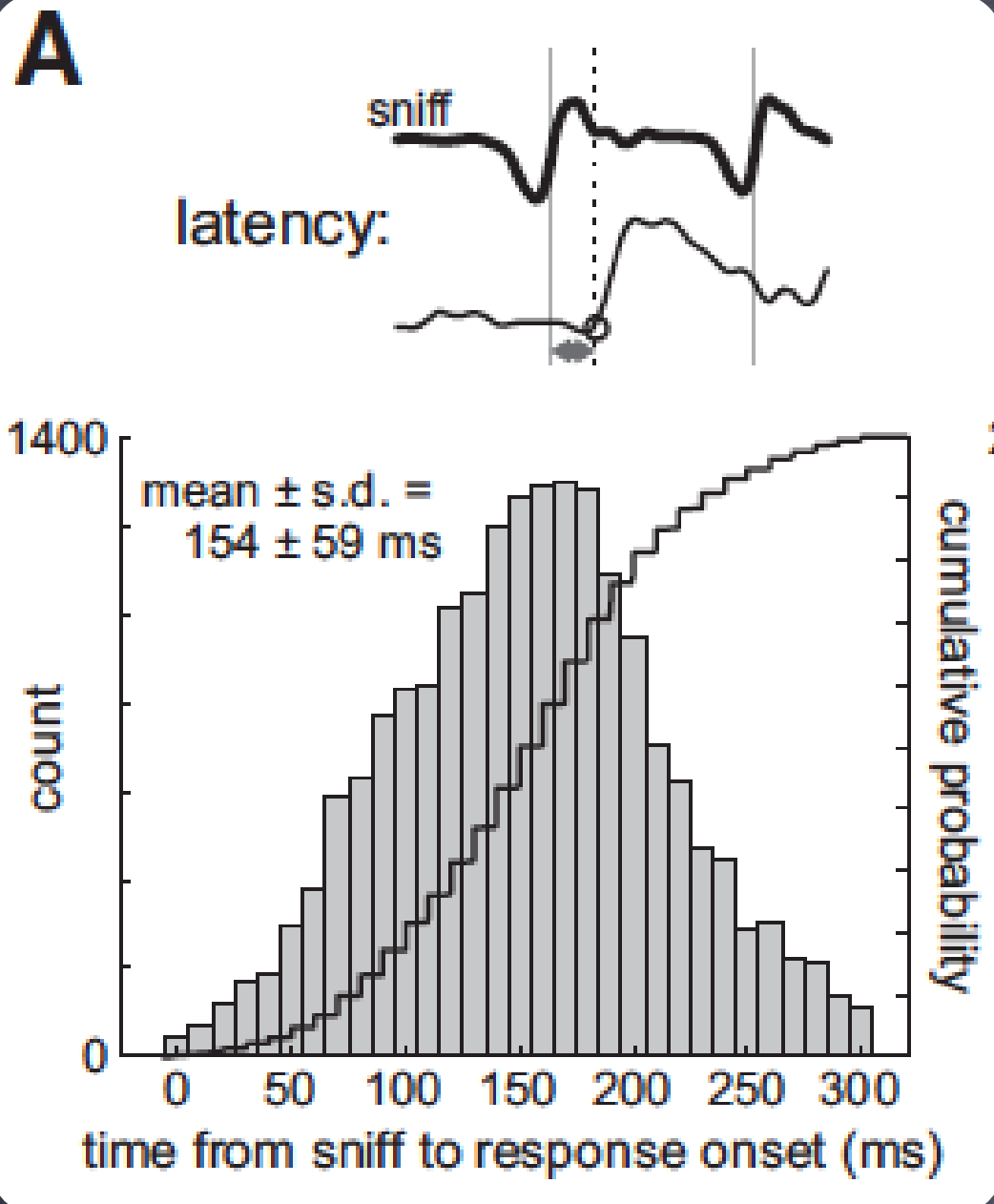
C1

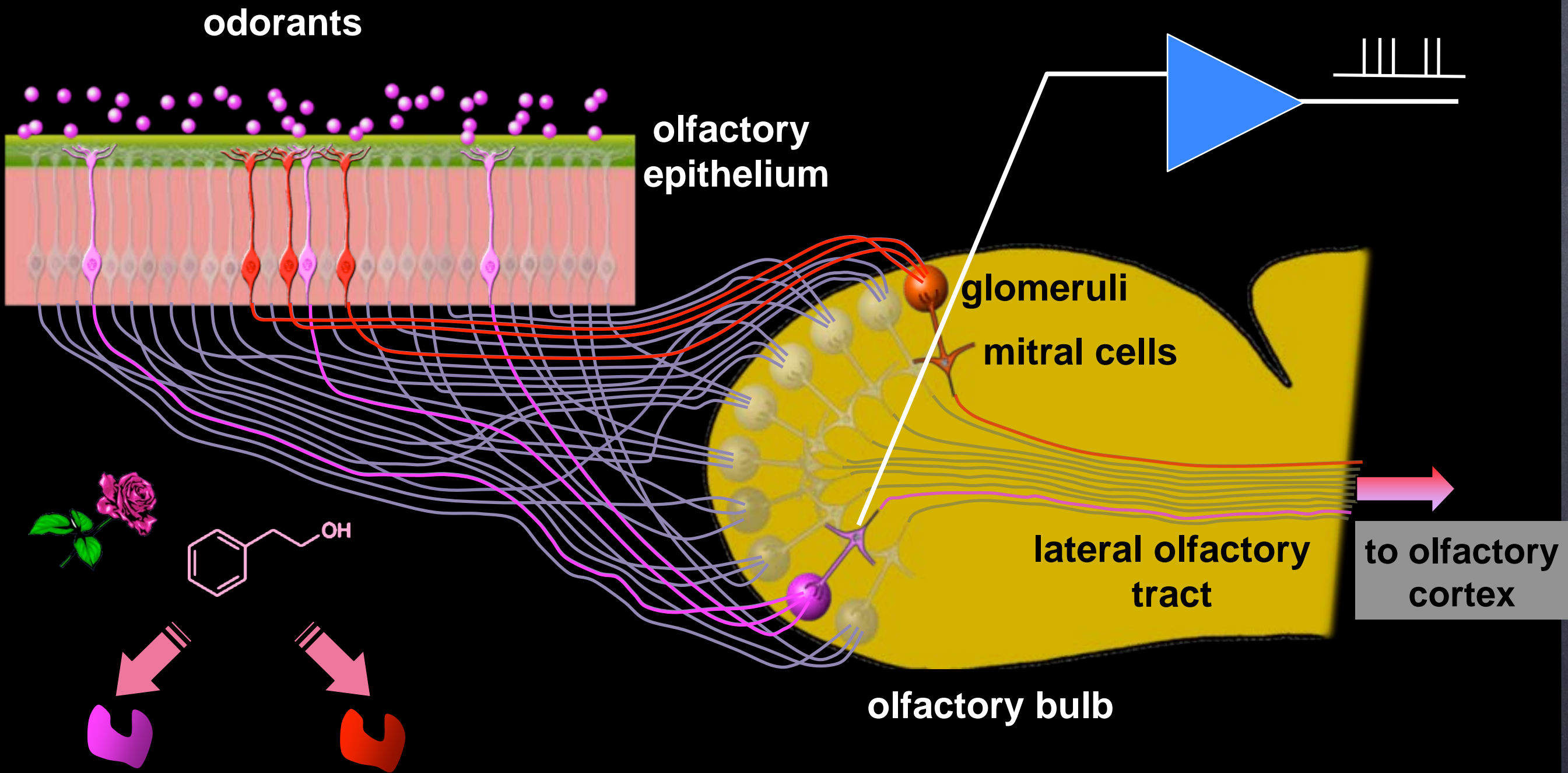


C2



Temporal structure of receptor neuron input to the olfactory bulb imaged in behaving rats.





THE ELECTRICAL ACTIVITY OF THE MAMMALIAN
OLFACTORY BULB

E. D. ADRIAN, M.D.

Physiological Laboratory, Cambridge, England



Edgar Adrian
1889-1977

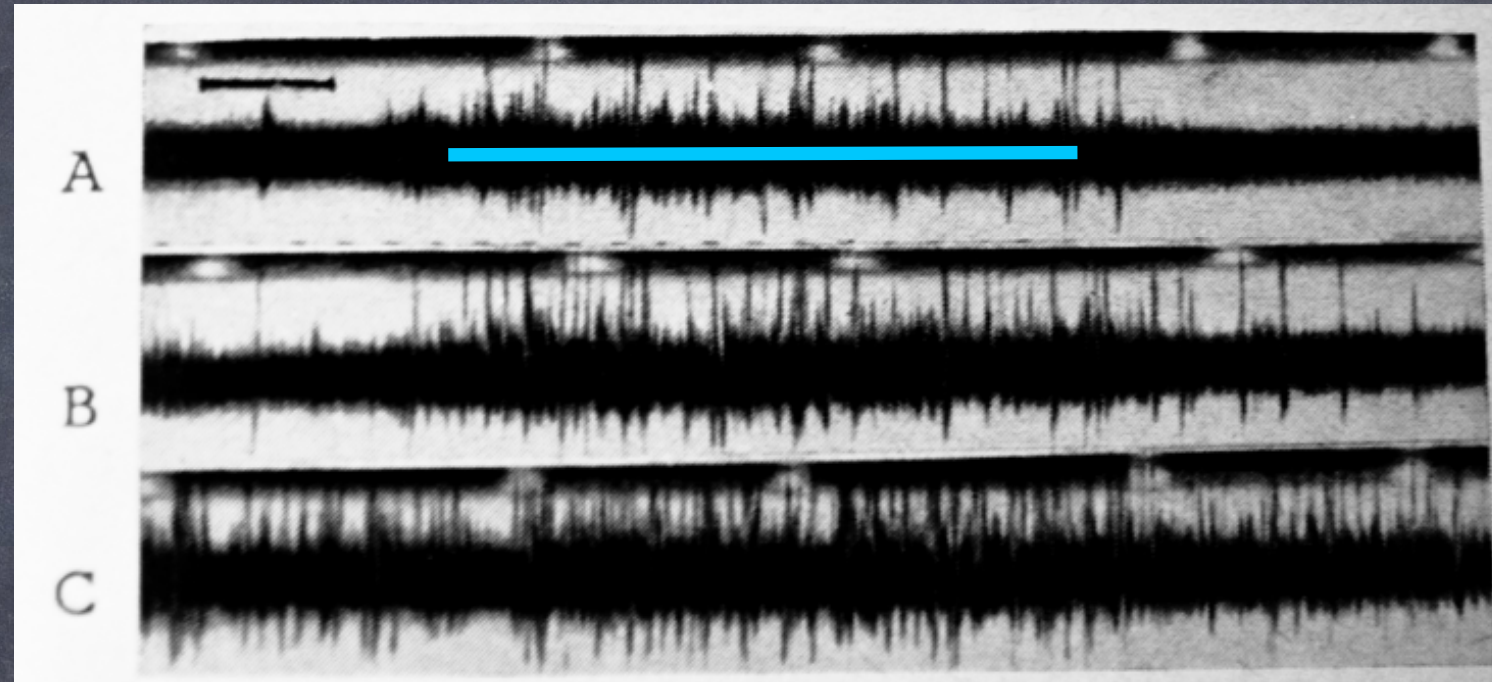


Fig.9

“In very deep anaesthesia when the bulb is quiet, a moderate olfactory stimulus sets up a discharge of impulses in the mitral axons at each inspiration and there are no impulses between (Fig. 9A). In less deep anaesthesia the olfactory discharges appear against a background of continuous irregular activity and as the anaesthesia lightens the continuous activity becomes more and more prominent until it may be no longer possible to detect any changes due to the stimulus (fig 9C)”

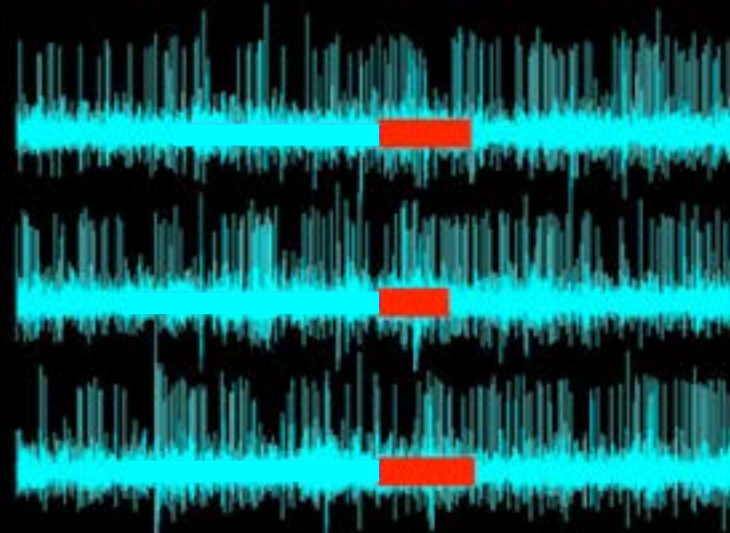
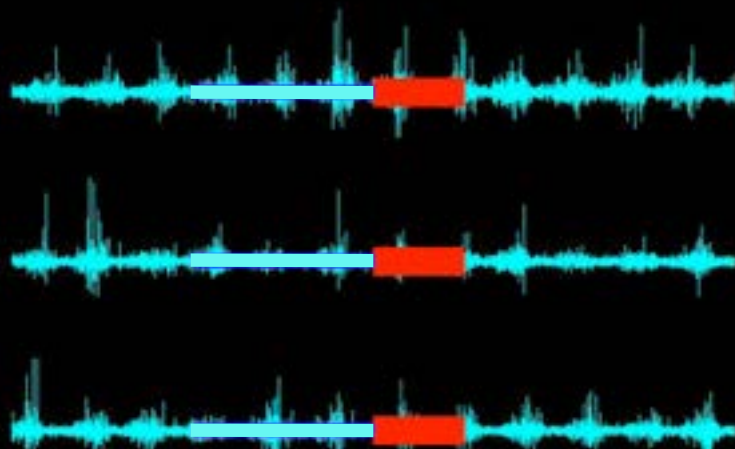
50+ years later...



anesthetized

awake, behaving

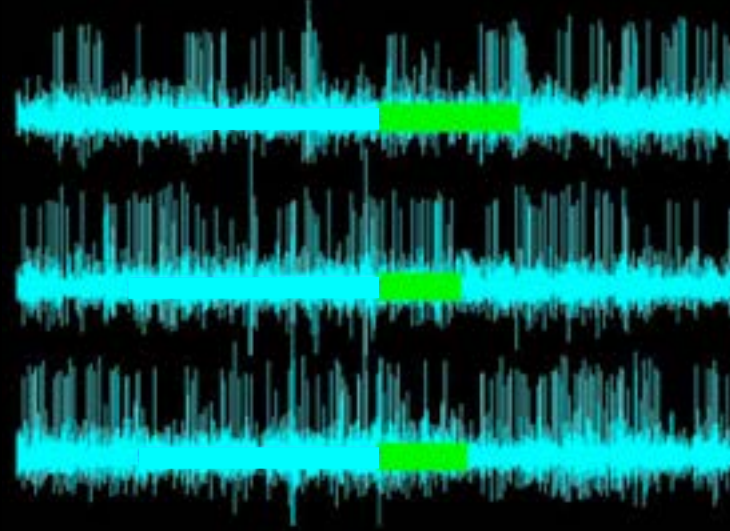
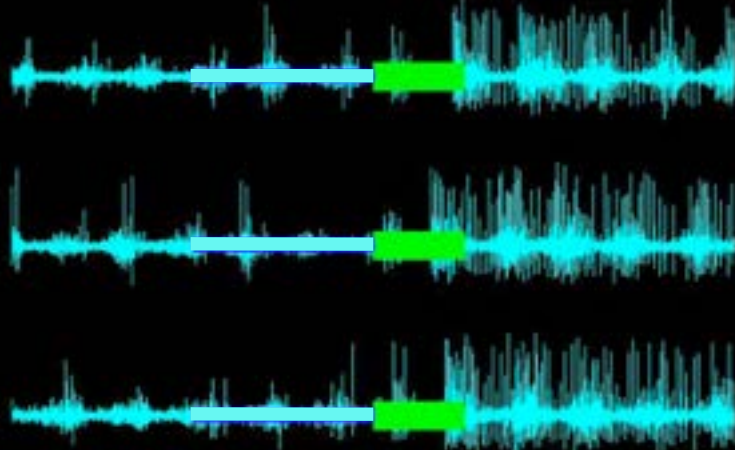
Citral



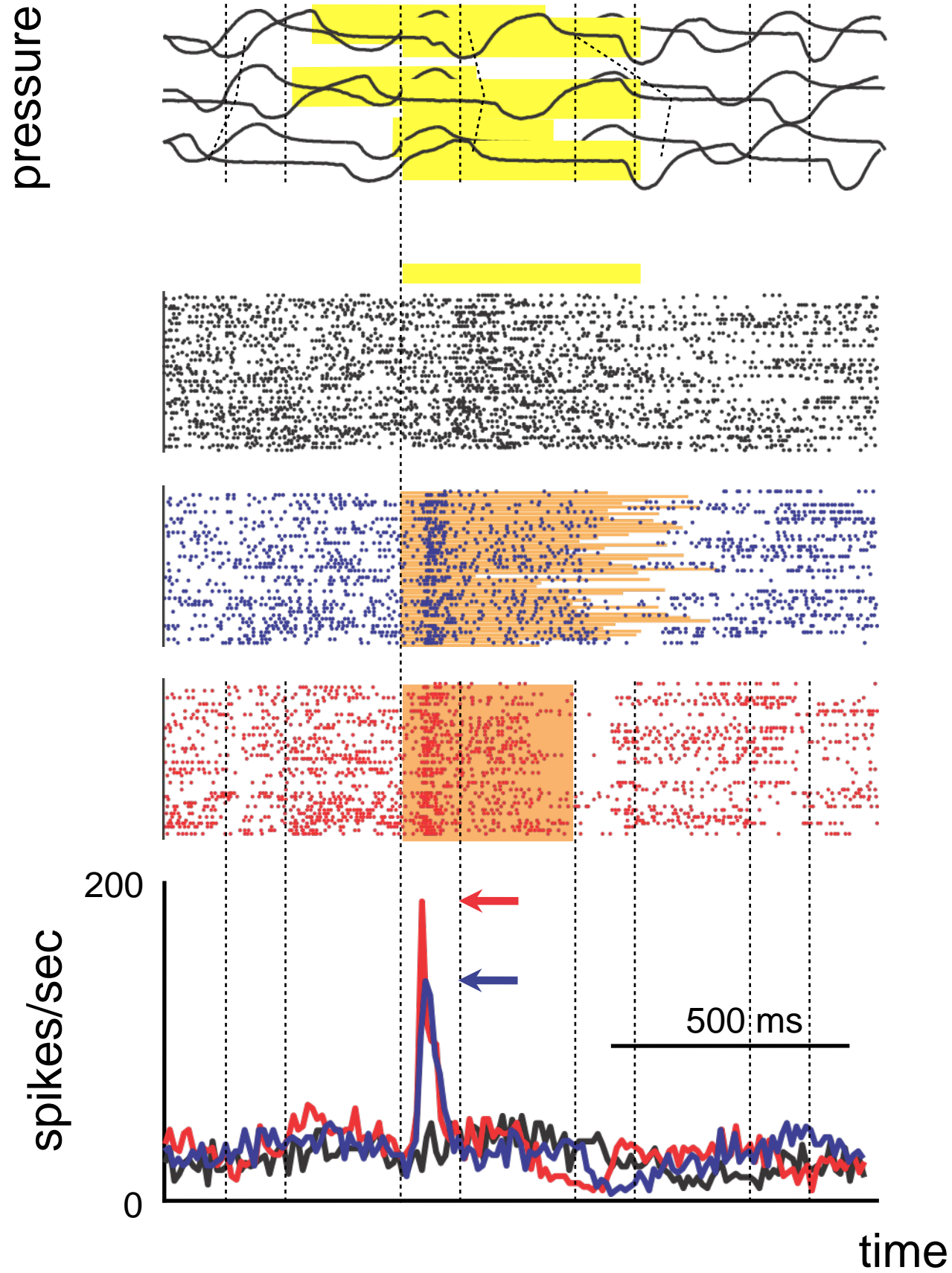
1 sec



Amyl
Acetate



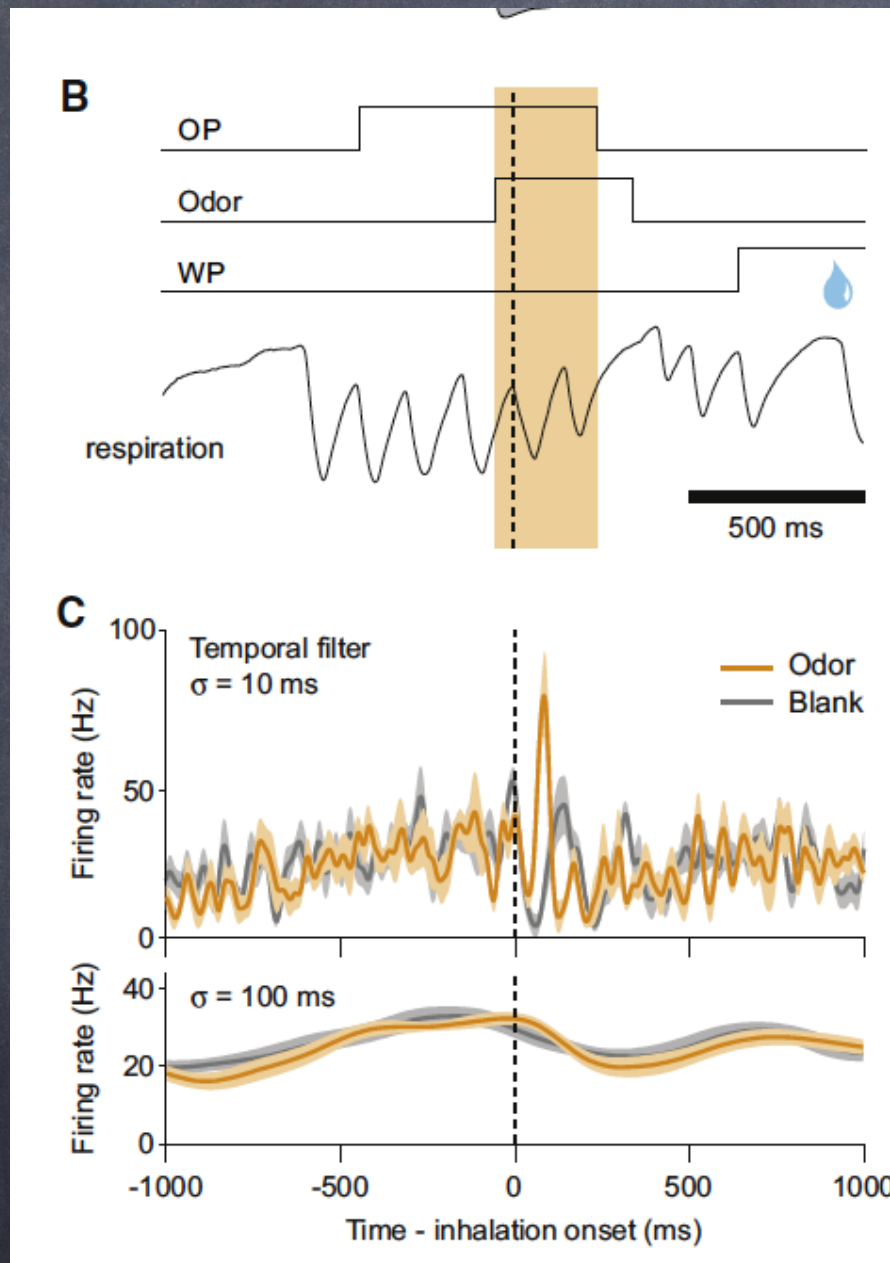
D. Rinberg, A. Koulakov,
A. Gelperin. J. Neurosci., (2006)



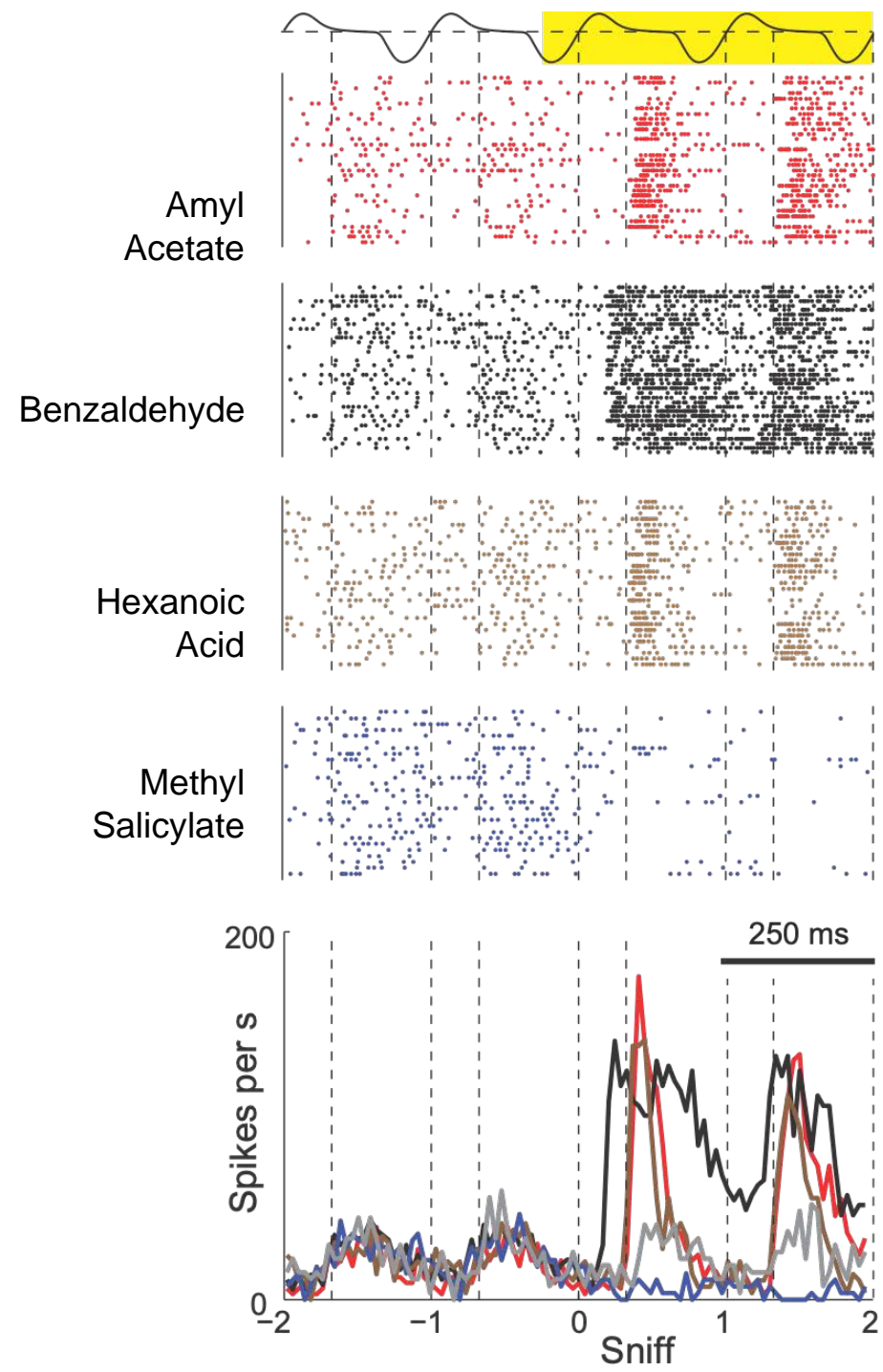
- locked to the phase of the sniffing cycle
- precise
- temporally diverse

Robust Odor Coding via Inhalation-Coupled Transient Activity in the Mammalian Olfactory Bulb

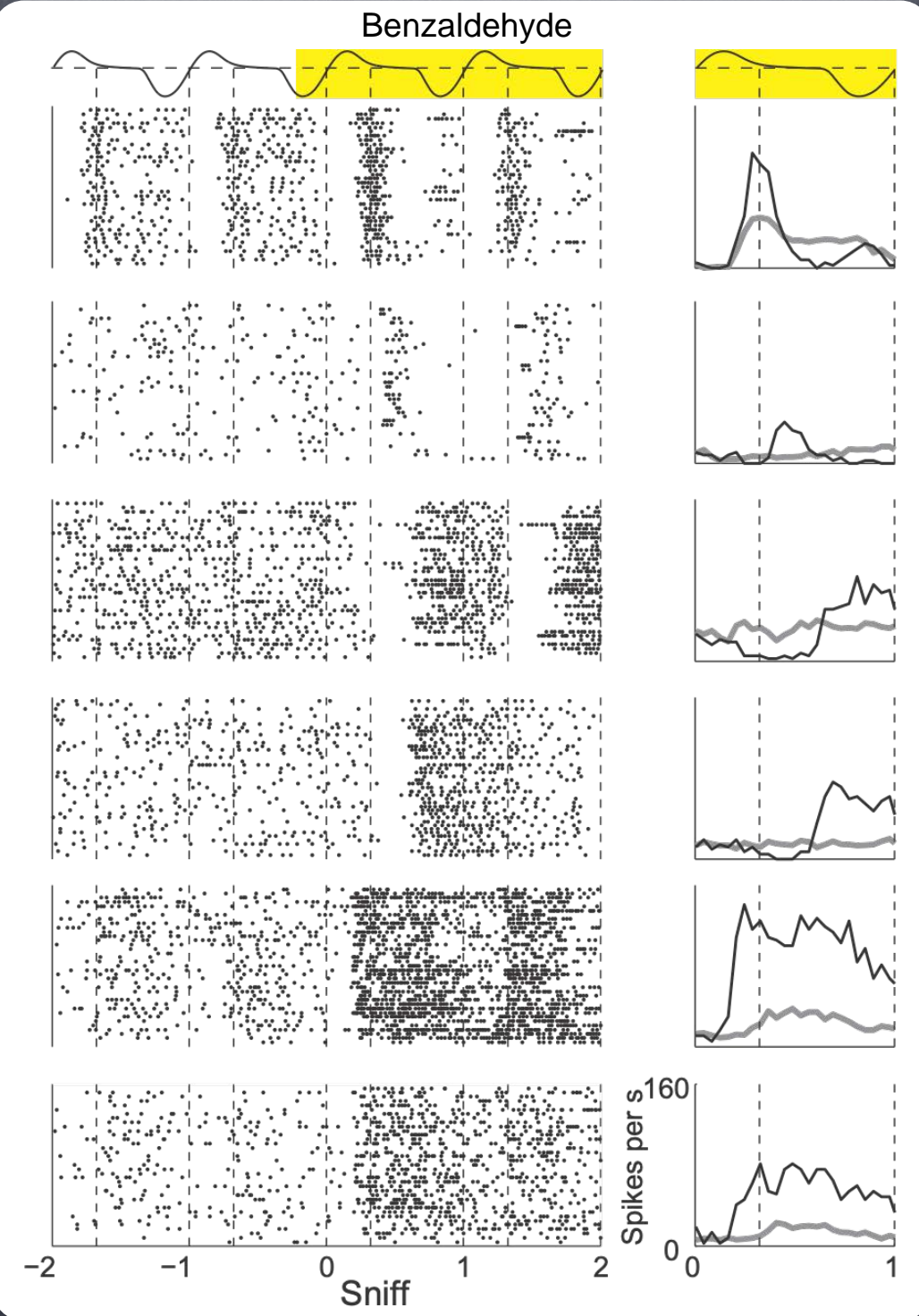
Kevin M. Cury¹ and Naoshige Uchida^{1,*}



one cell - many odors



many cells - one odor



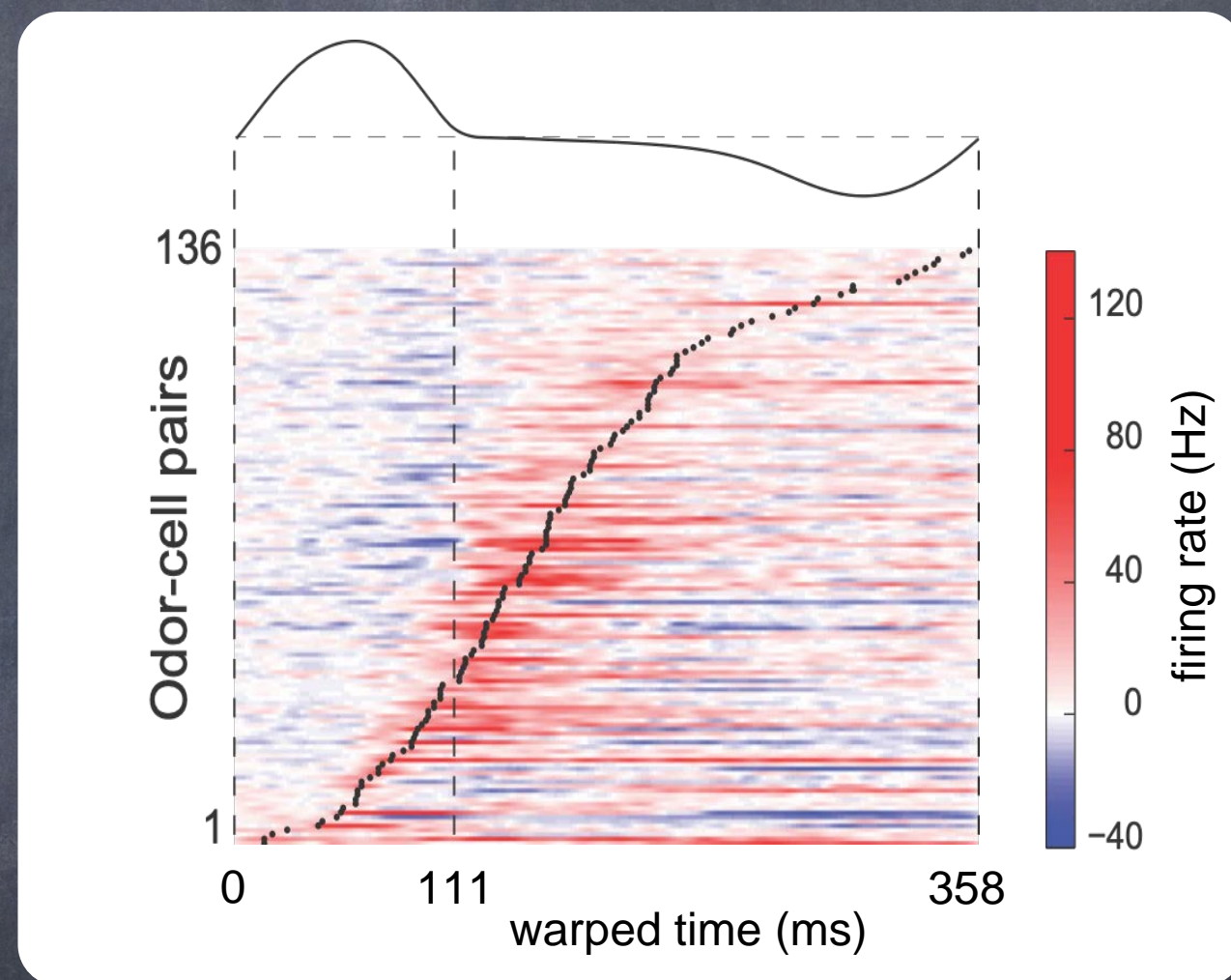
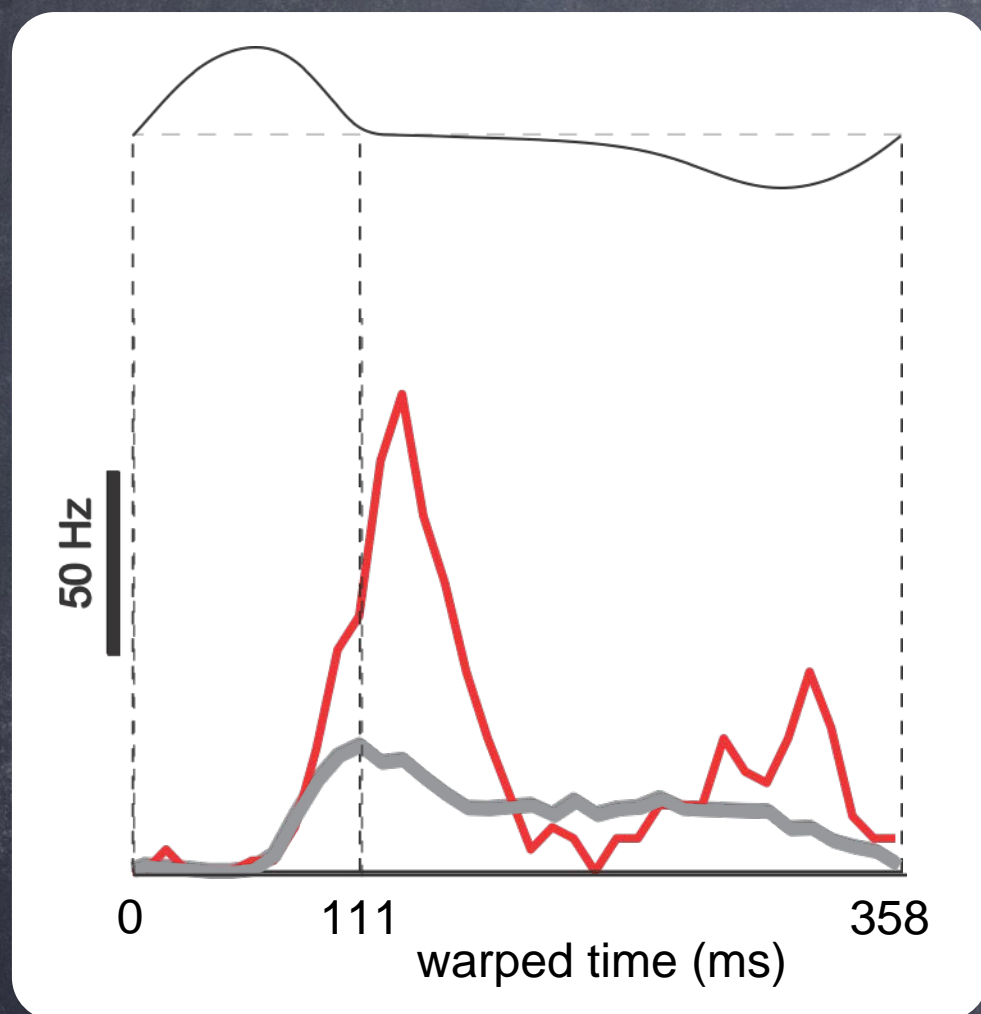
odor responses are temporally diverse

460 cell-odor pairs:

136 excitatory responses

139 inhibitory responses

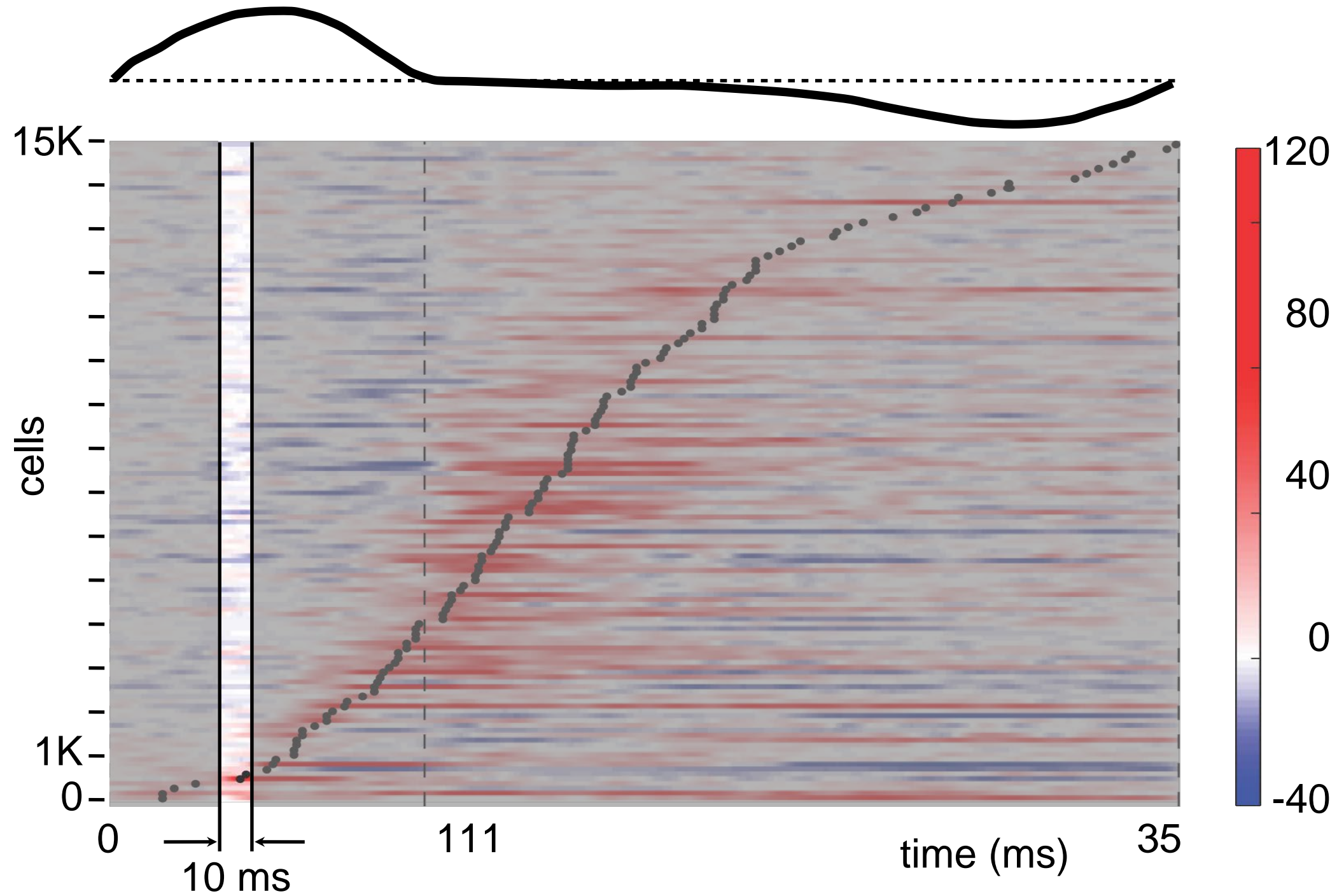
excitatory response



460 cell-odor pairs:
136 excitatory responses



~50.000 M/T cells
~15.000 excitatory responses



Odor Representations in Olfactory Cortex: “Sparse” Coding, Global Inhibition, and Oscillations

Cindy Poo¹ and Jeffrey S. Isaacson^{1,*}

¹Department of Neuroscience, School of Medicine, University of California, San Diego, La Jolla, CA 92093, USA

*Correspondence: jisaacson@ucsd.edu

DOI 10.1016/j.neuron.2009.05.022

Neuron 2009

pyramidal neuron integration time: ~10 ms

Oscillations and Sparsening of Odor Representations in the Mushroom Body

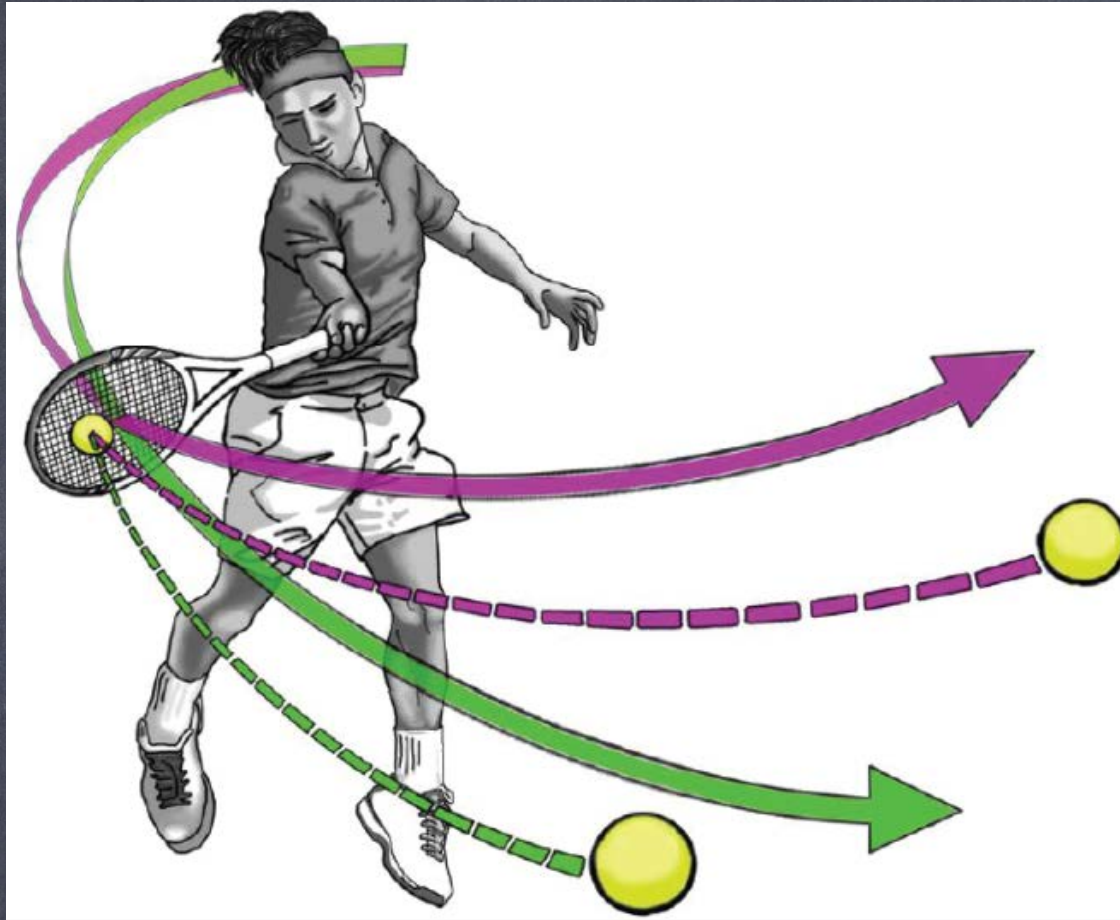
Javier Perez-Orive,* Ofer Mazor,* Glenn C. Turner,
Stijn Cassenaer, Rachel I. Wilson, Gilles Laurent†

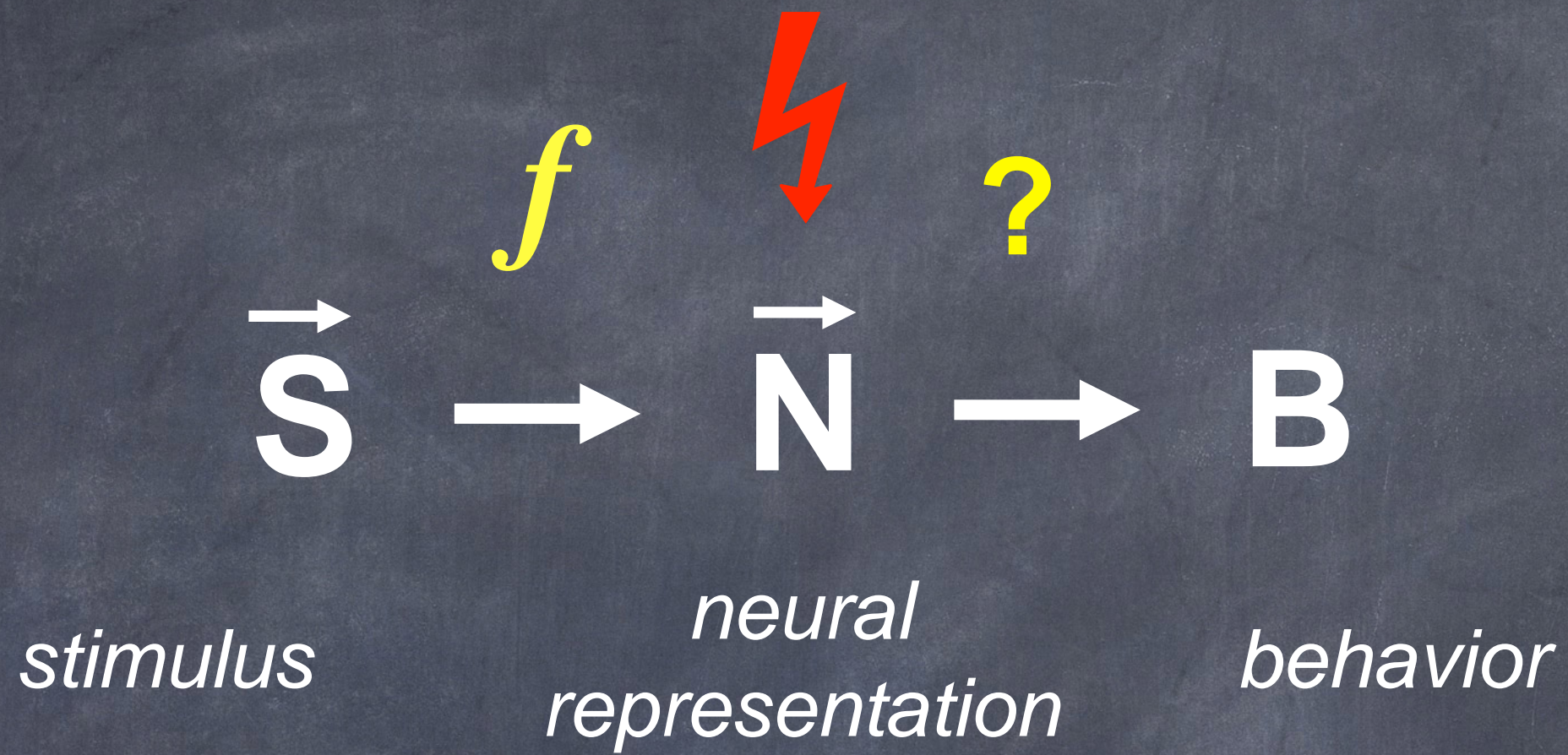
Science, 2002

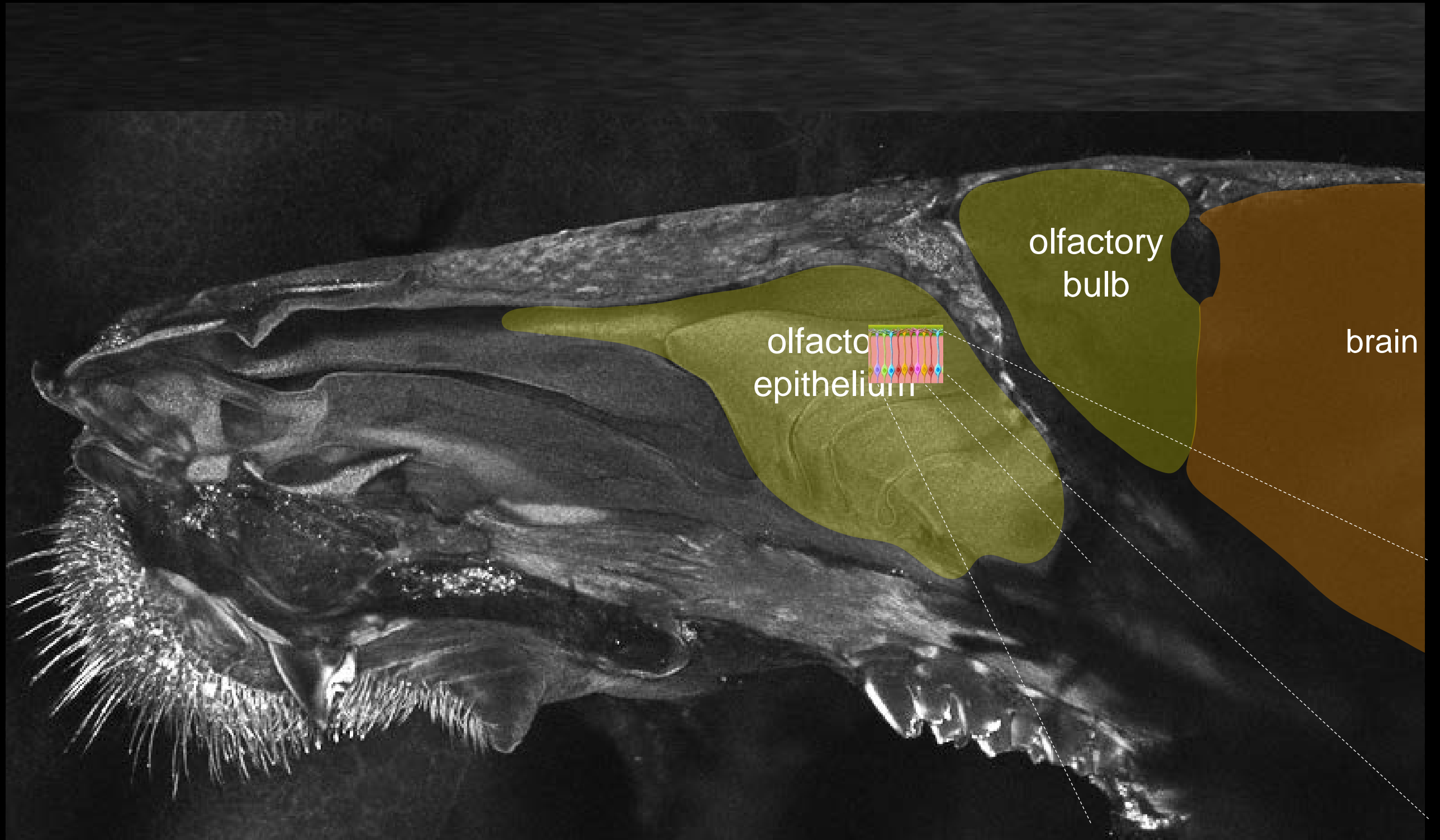
Lecture II

Sensory (olfactory) coding from behavioral perspective

Dima Rinberg
rinberg@nyu.edu







olfacto
epithelium

olfactory
bulb

brain

odorant molecules

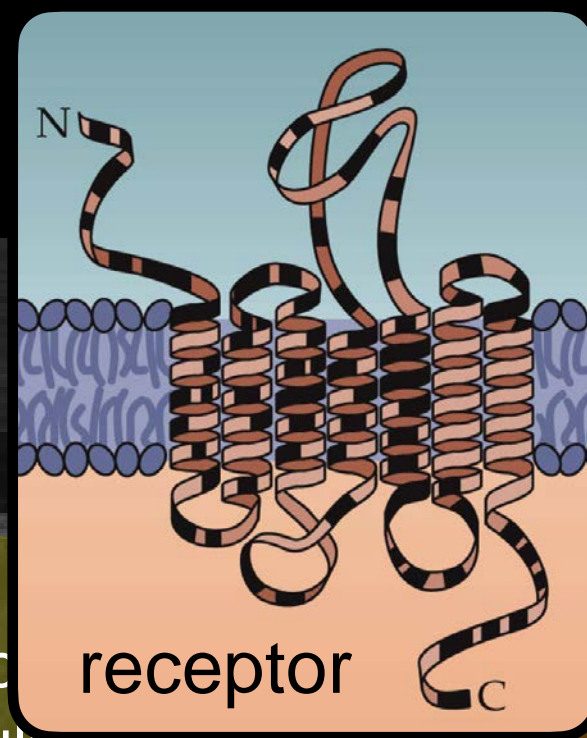


Human



Mouse

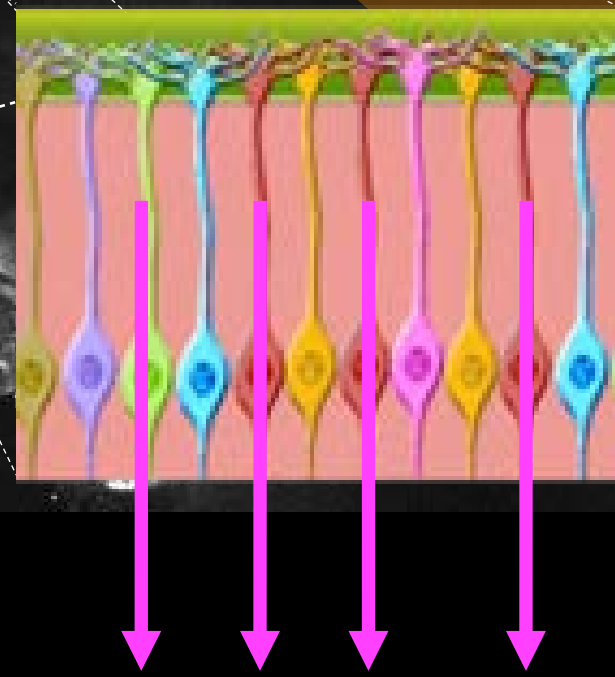
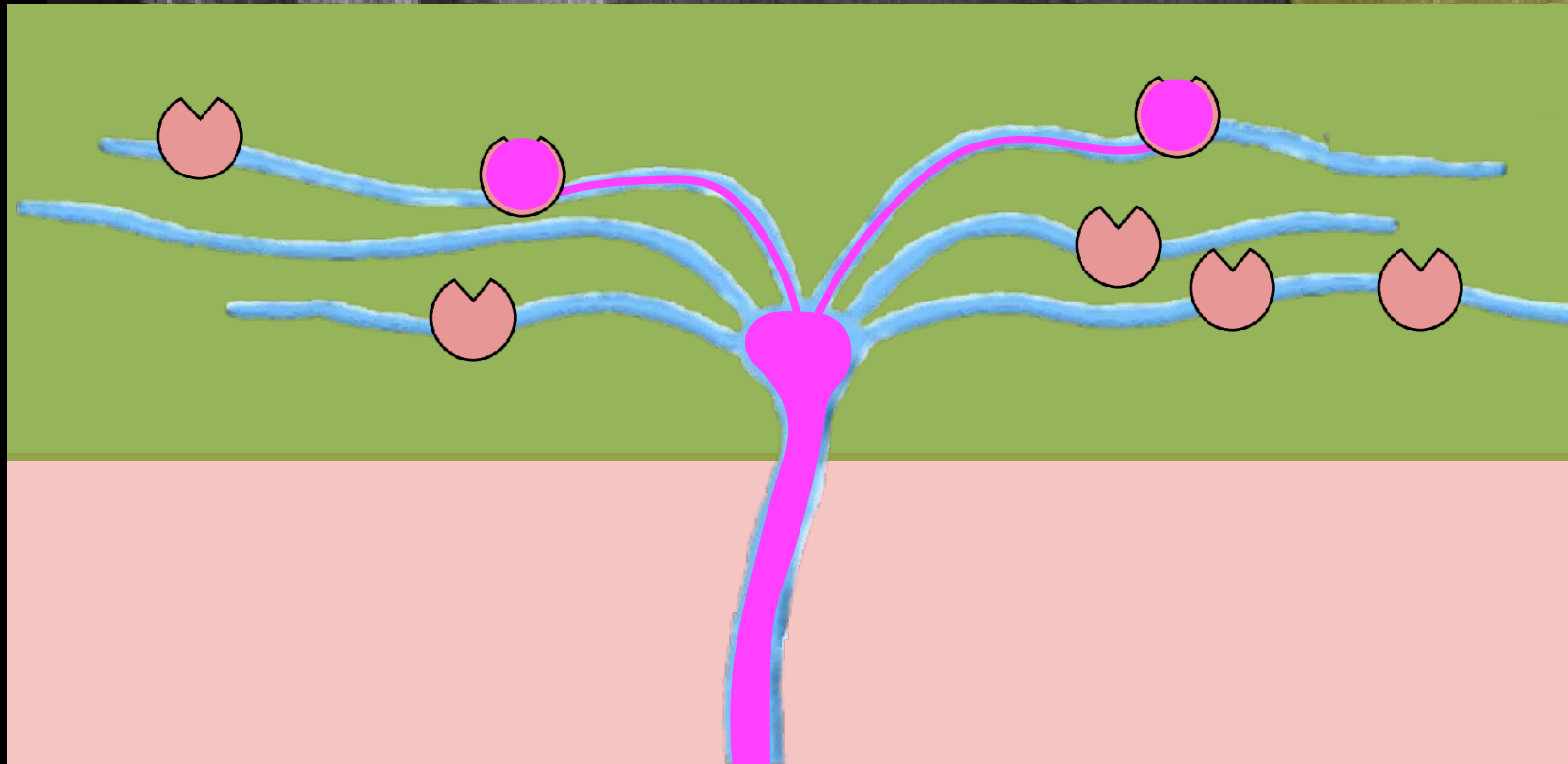
olfactory receptors



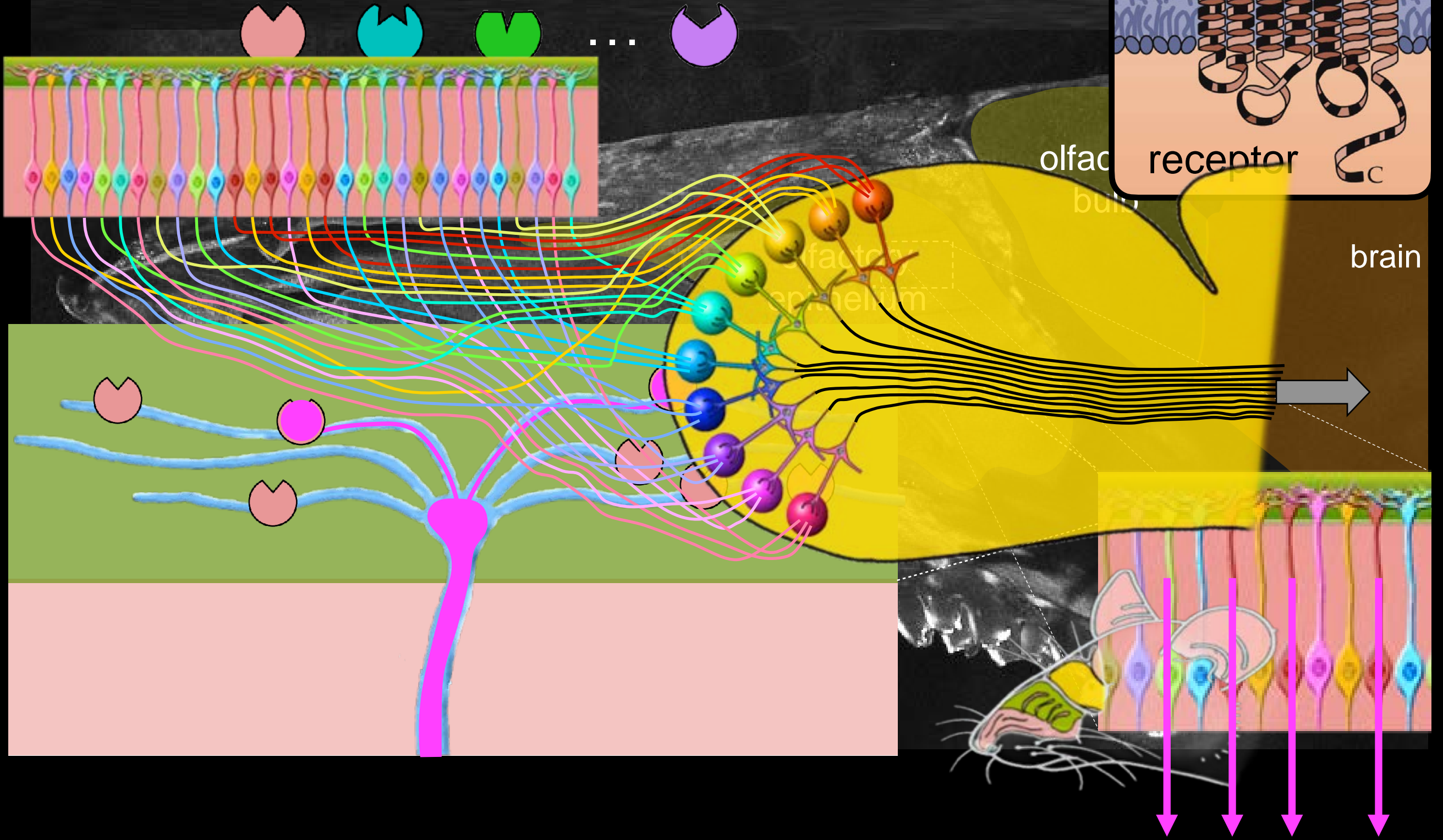
olfactory bulb

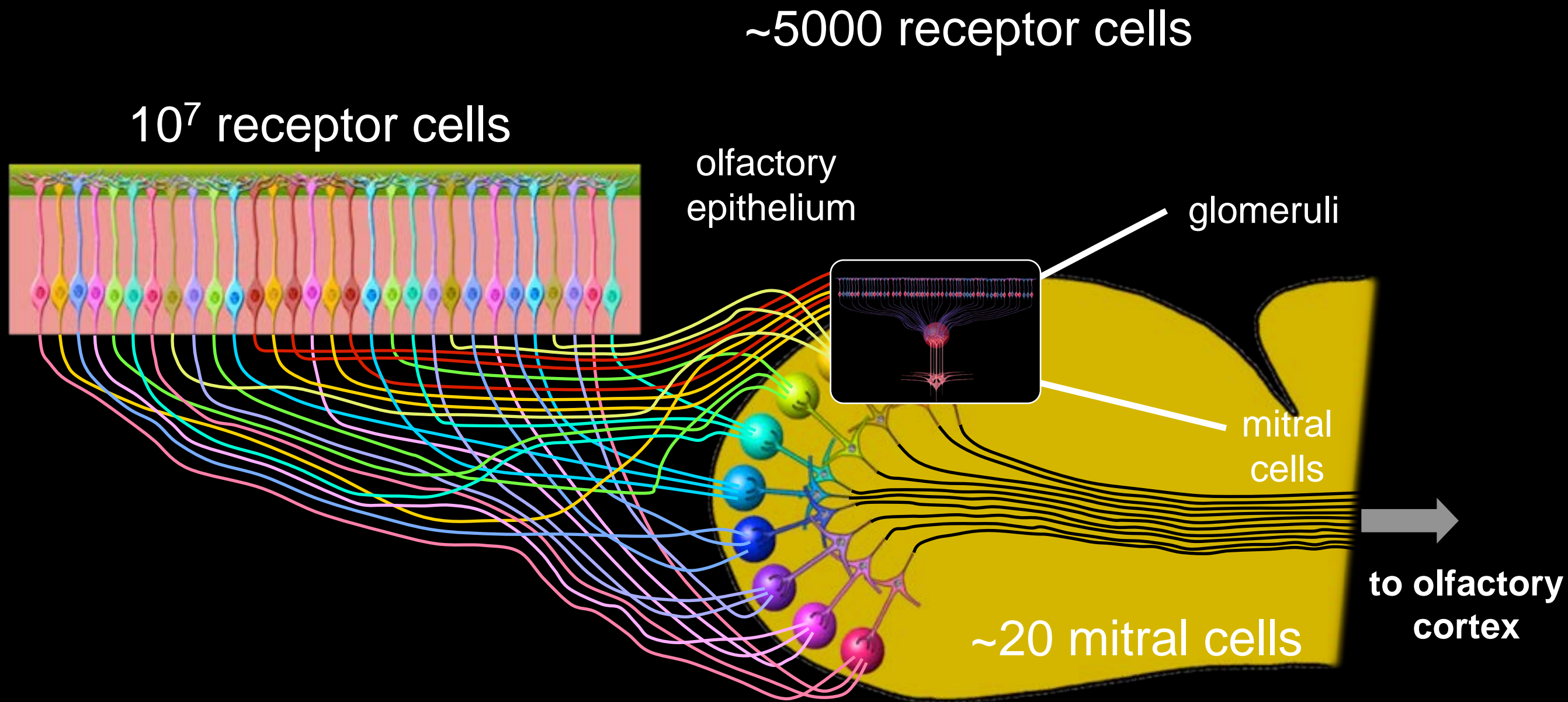
brain

olfactory epithelium



1 ← → ~360 Human
1 ← → ~1200 Mouse



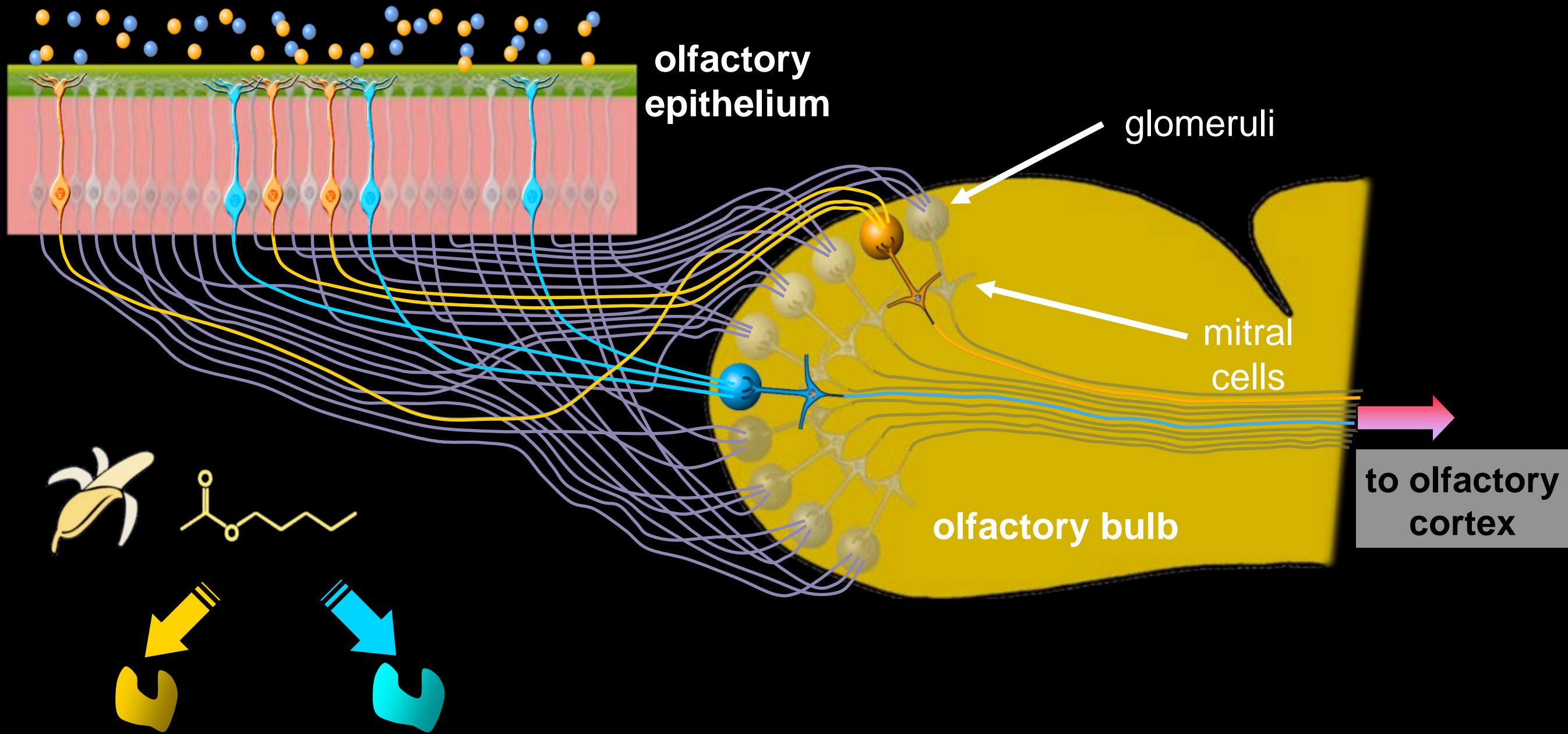


Olfactory receptors:

Human: ~ 350

Mouse: ~ 1200





odorants

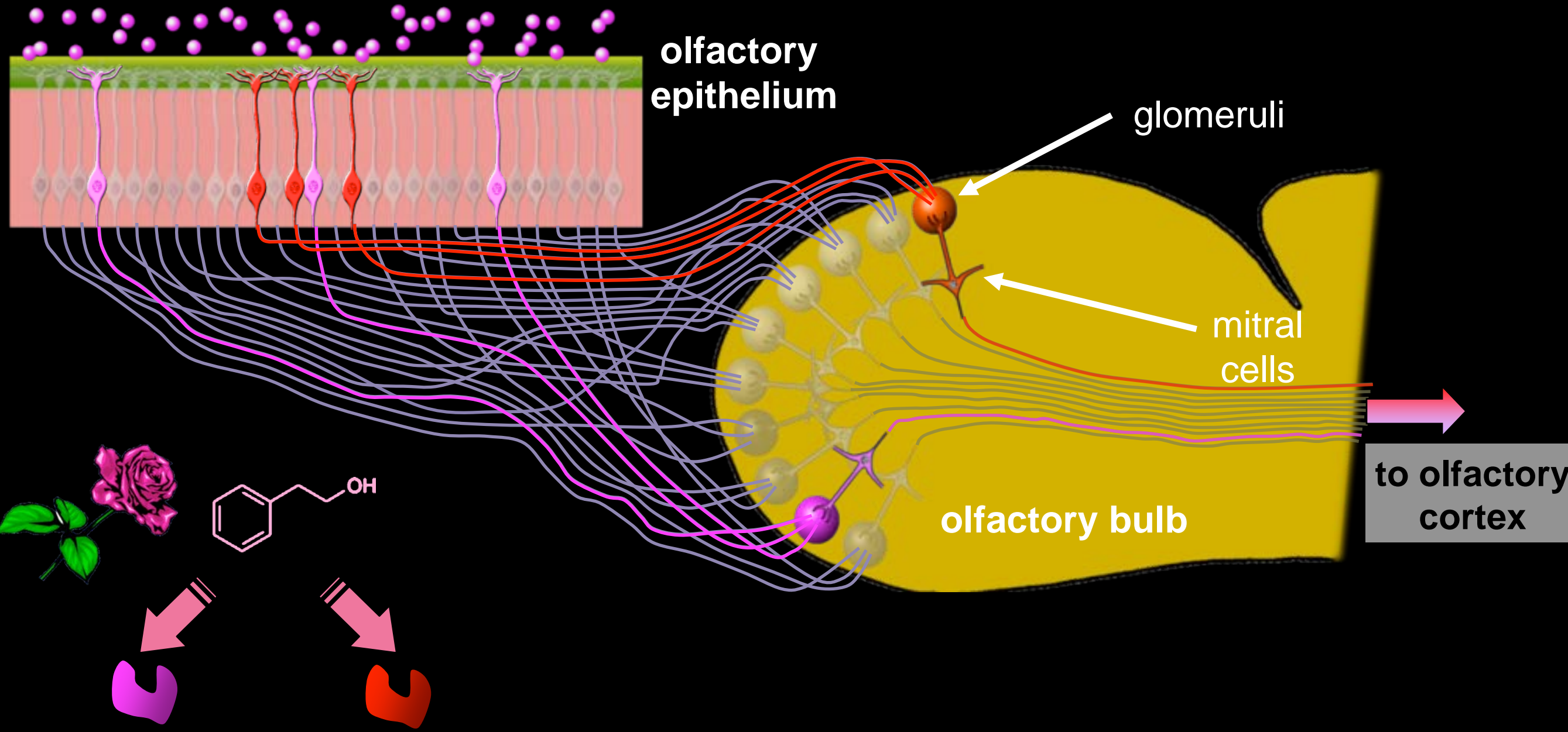
olfactory epithelium

glomeruli

mitral cells

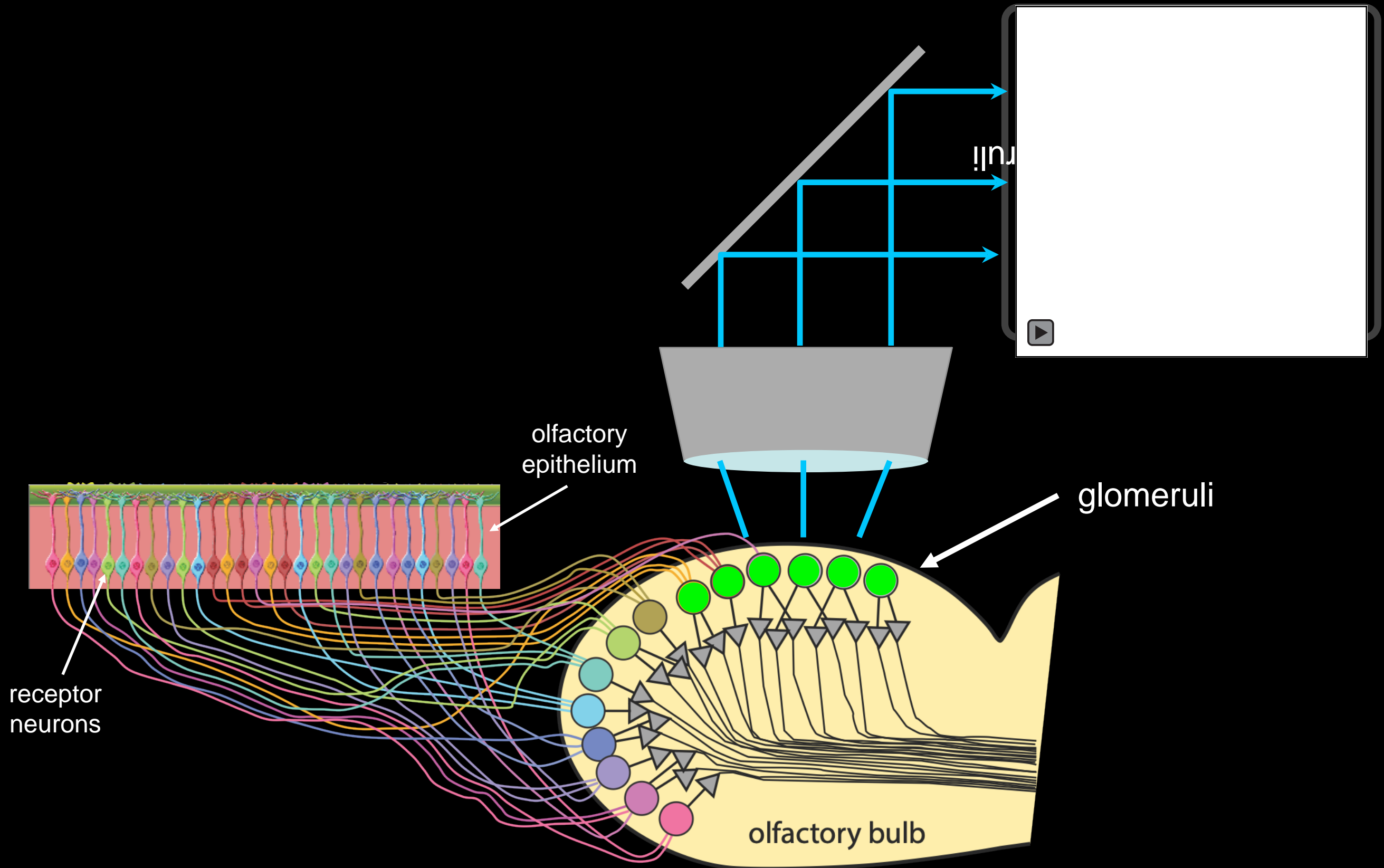
olfactory bulb

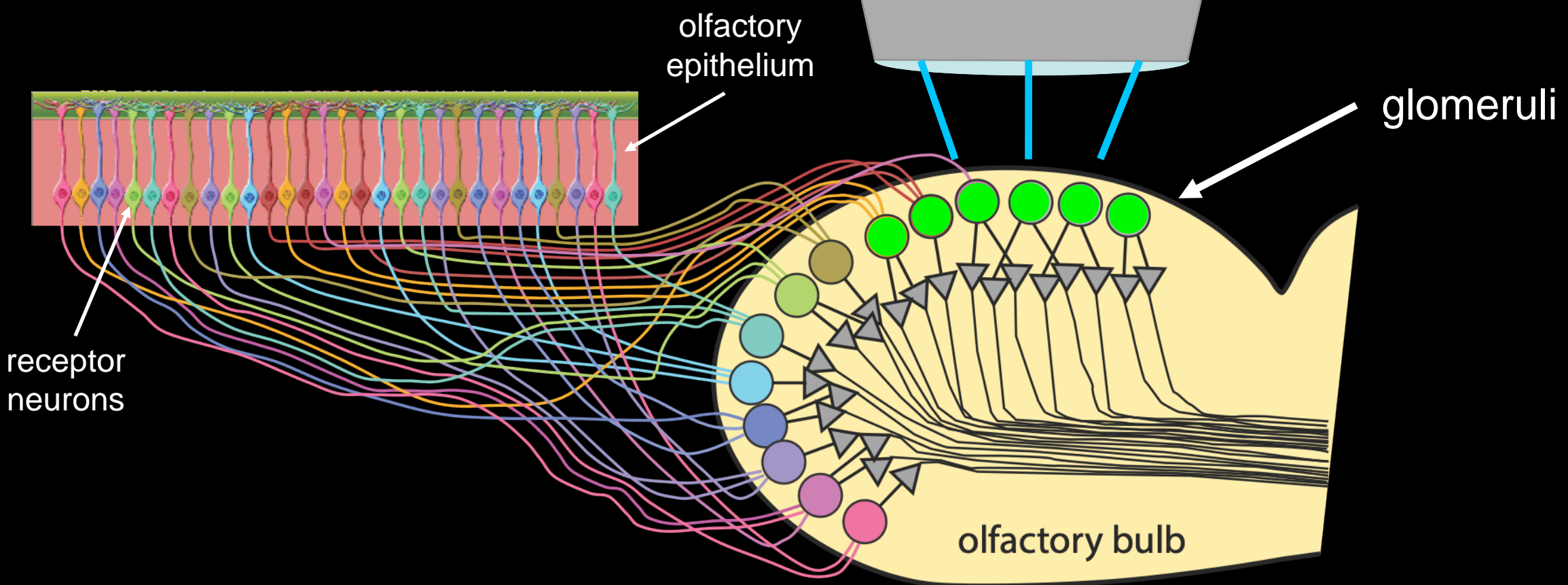
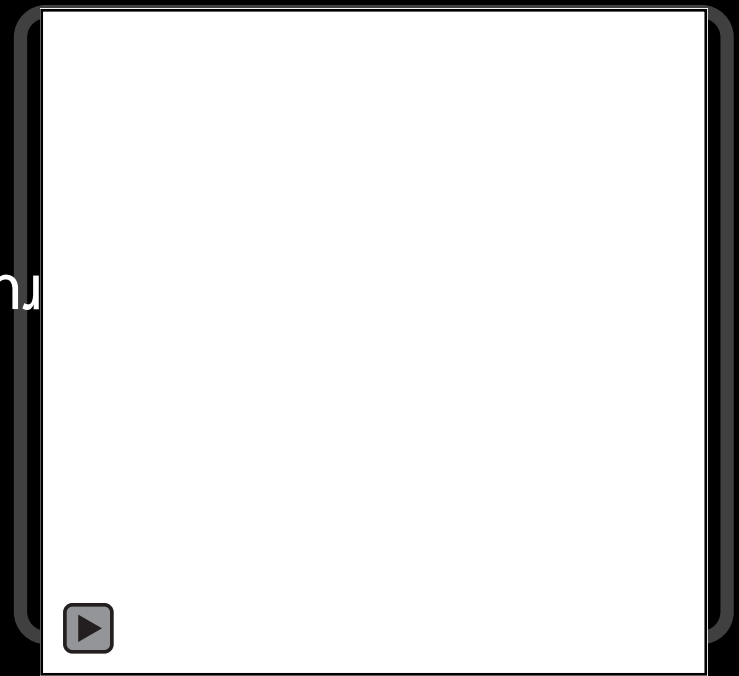
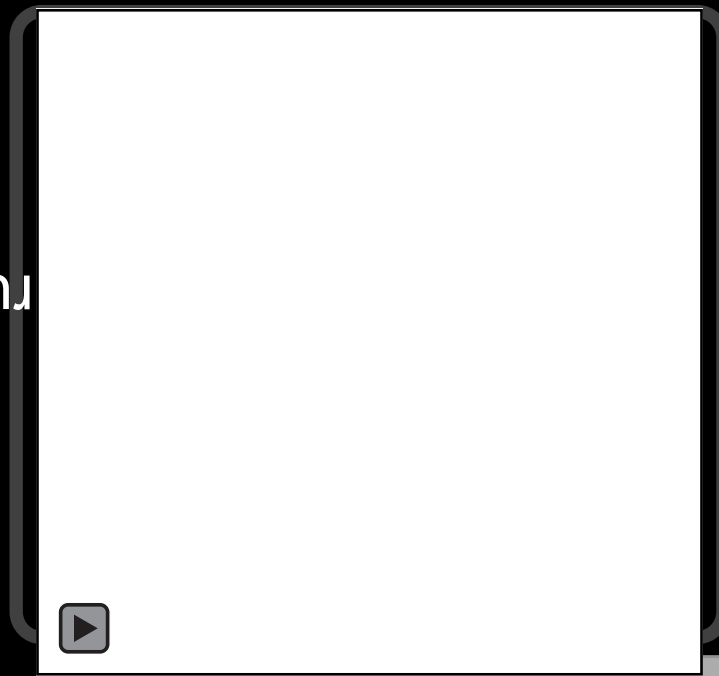
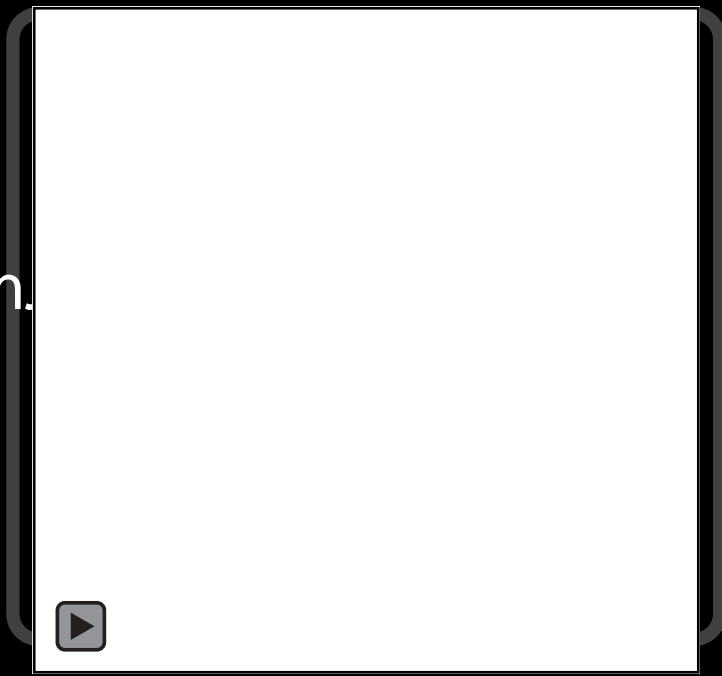
to olfactory cortex



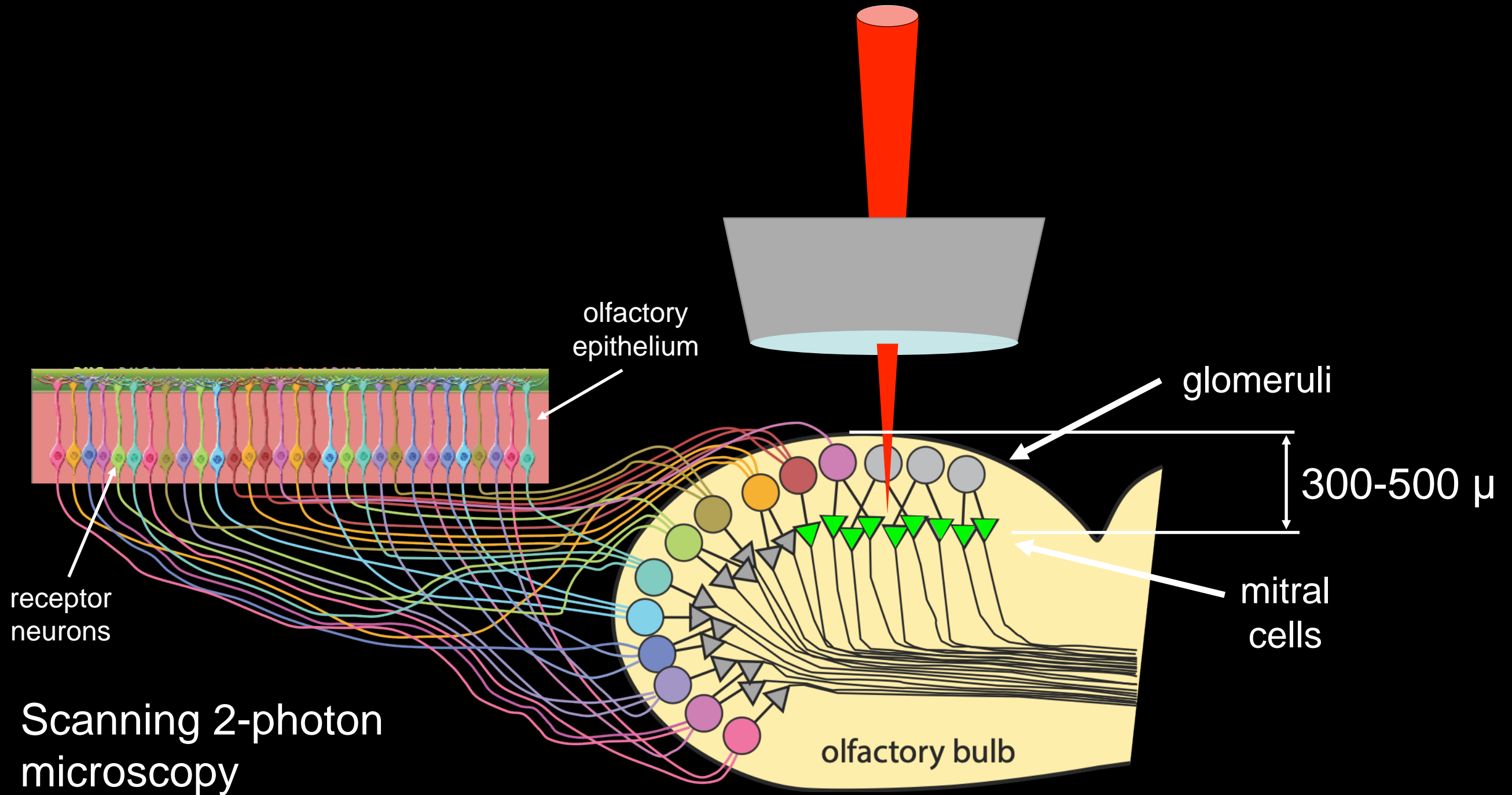


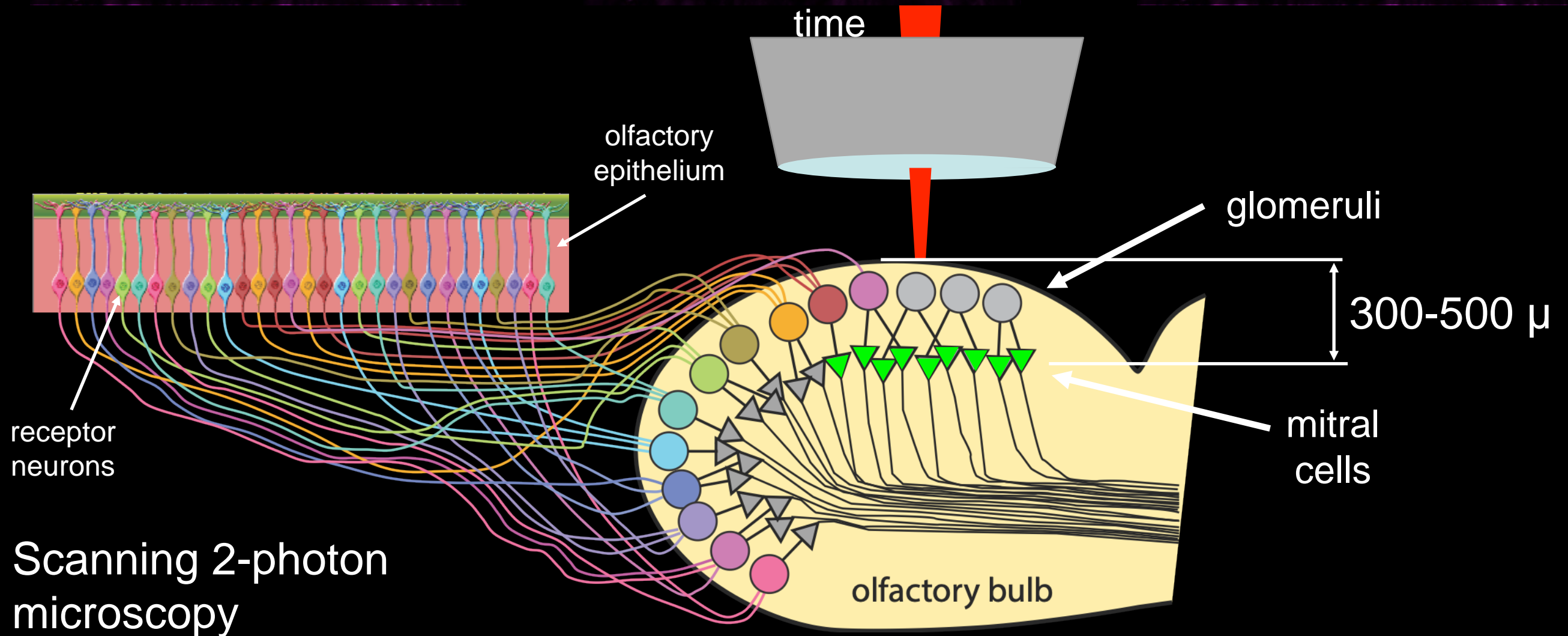
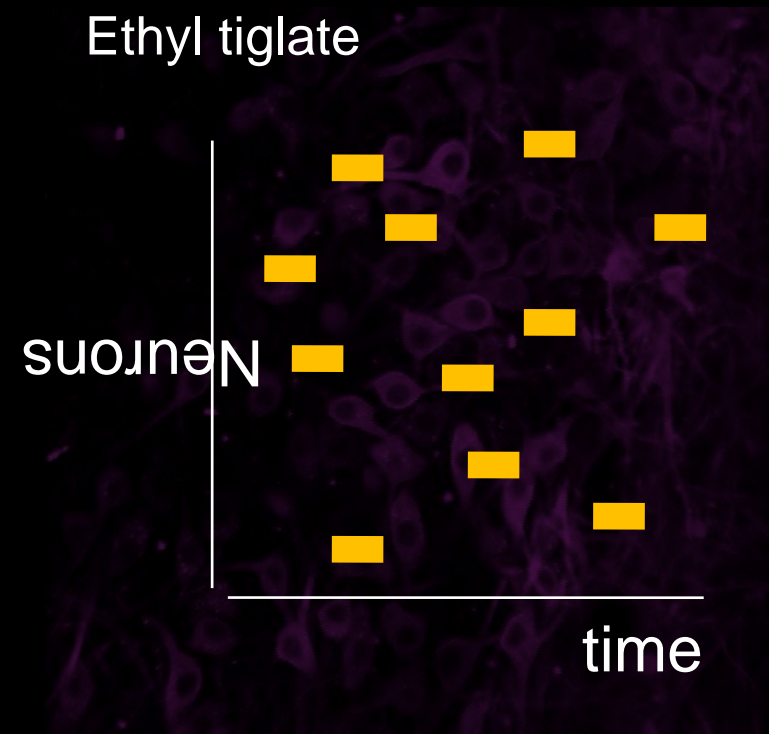
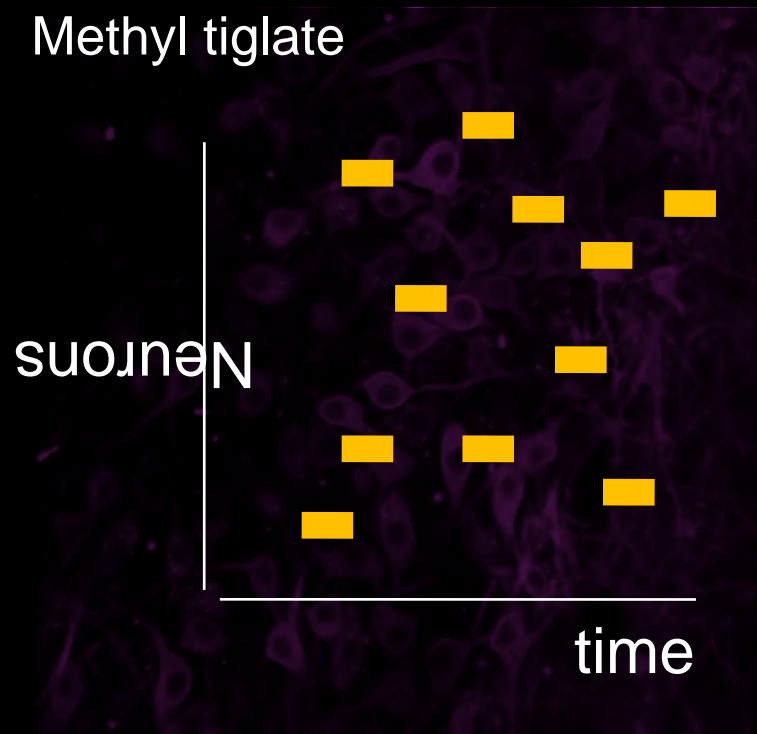
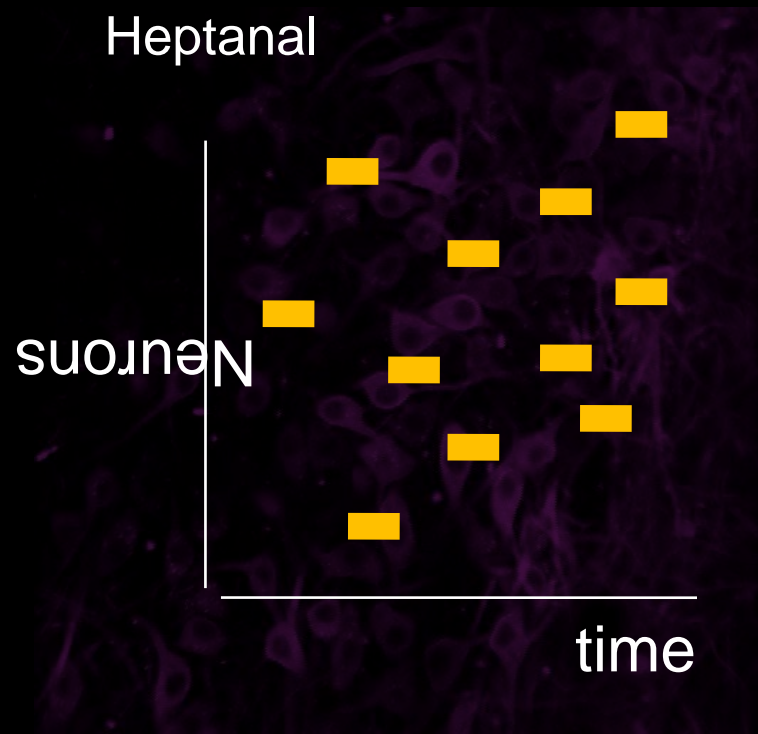
butanal





● Ethyl tiglate





S



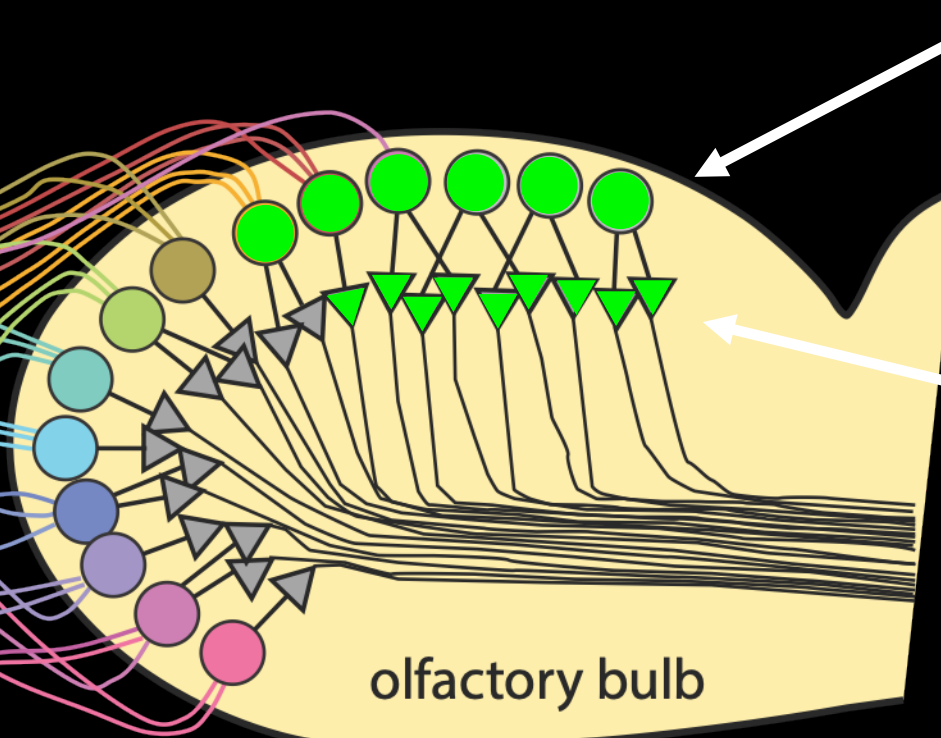
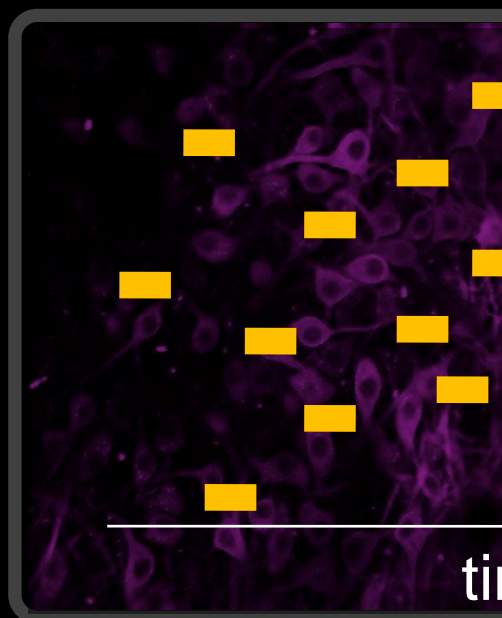
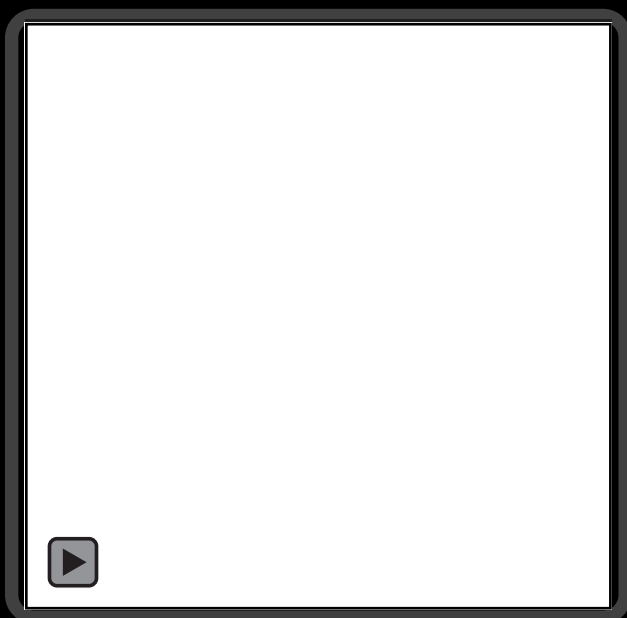
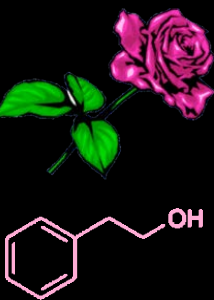
N



N



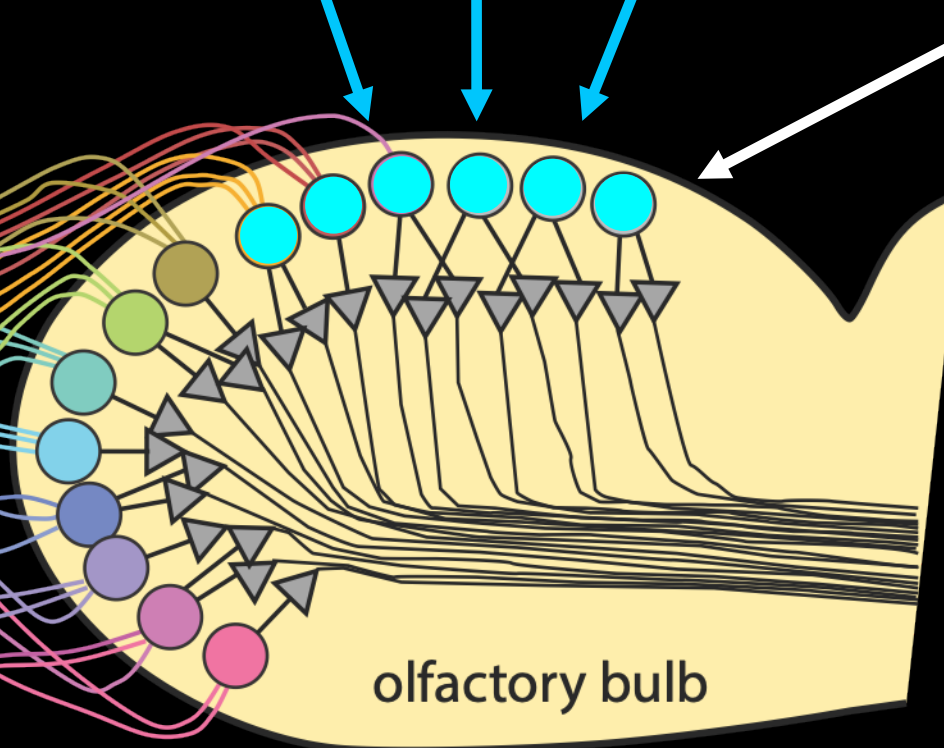
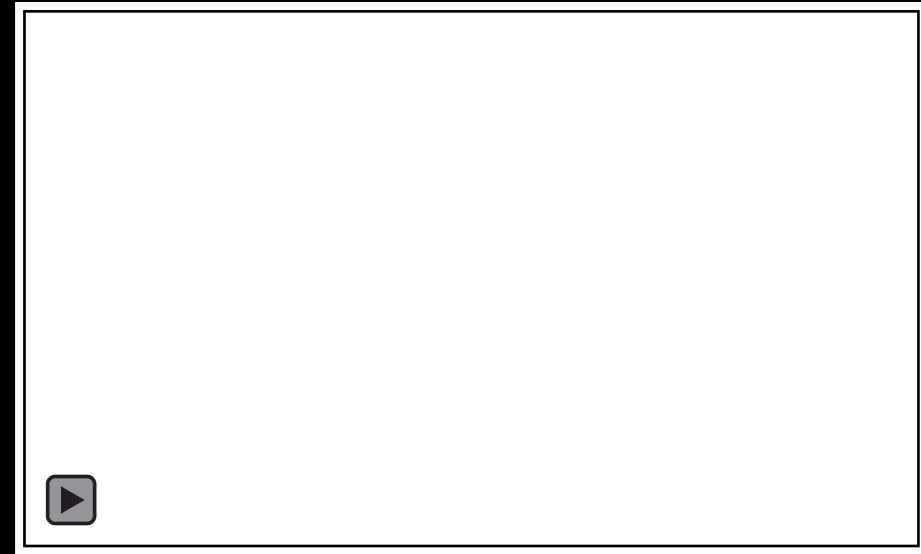
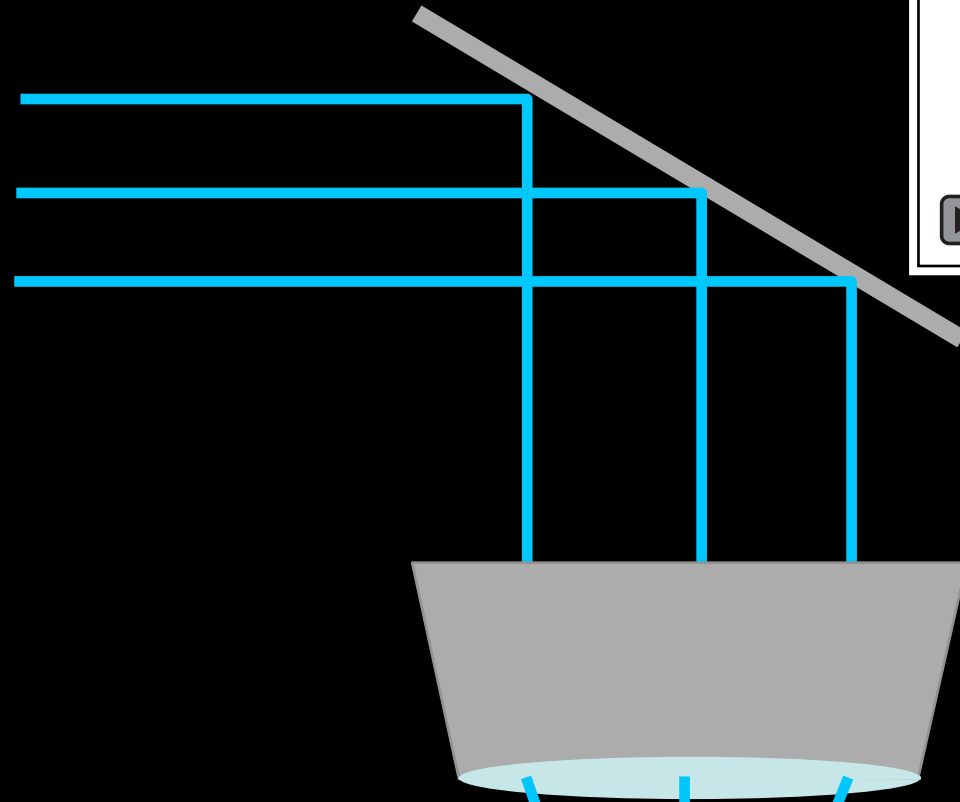
B



glomeruli

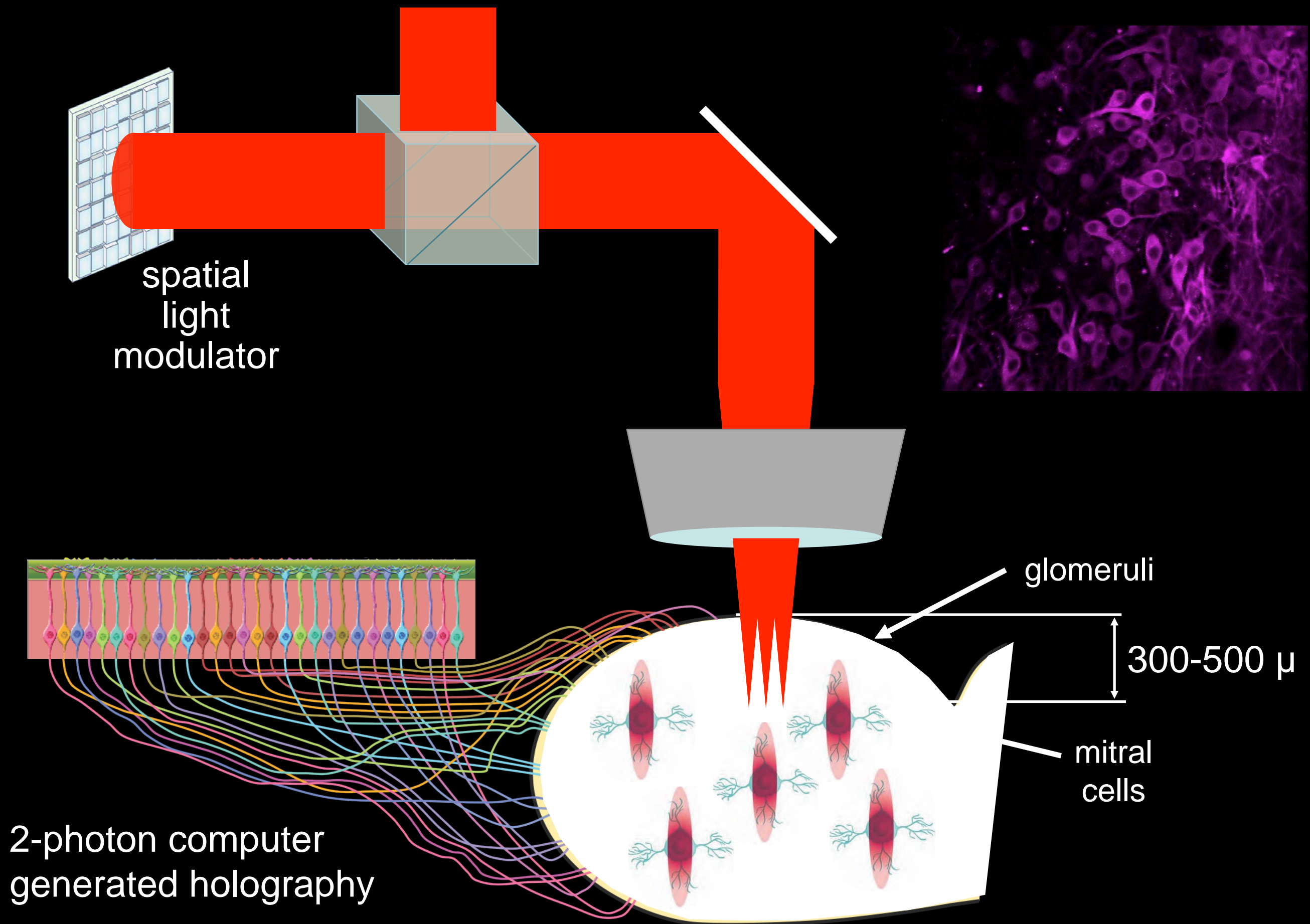
mitral cells

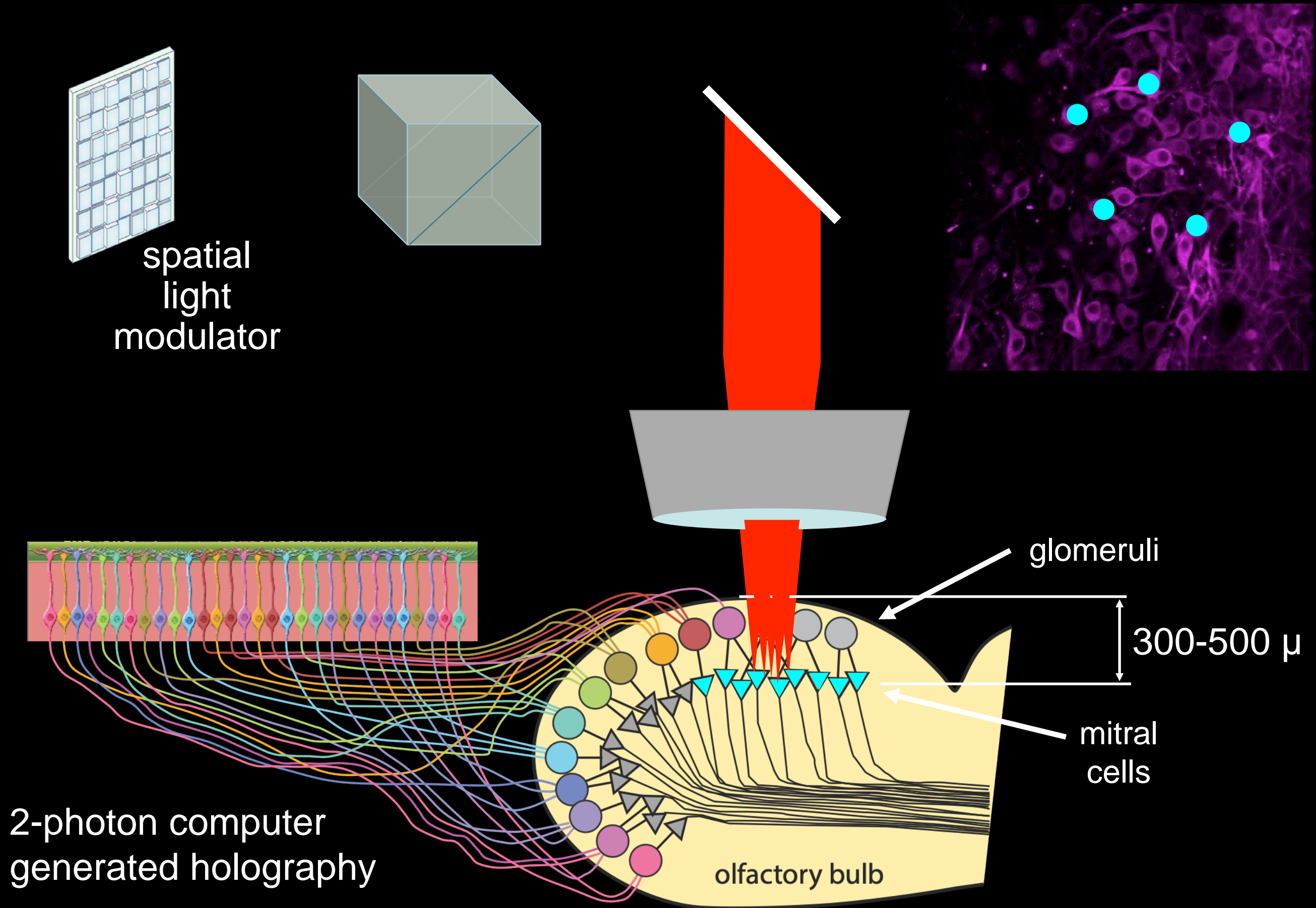
olfactory bulb

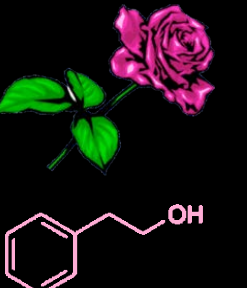
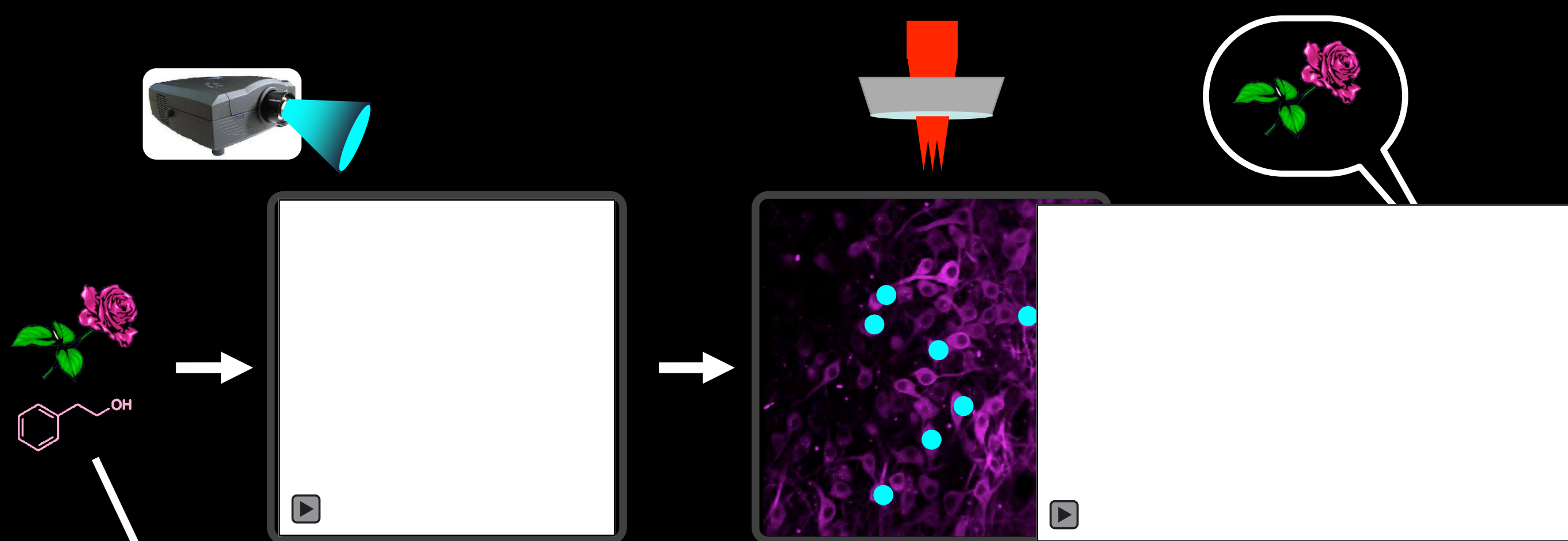


glomeruli

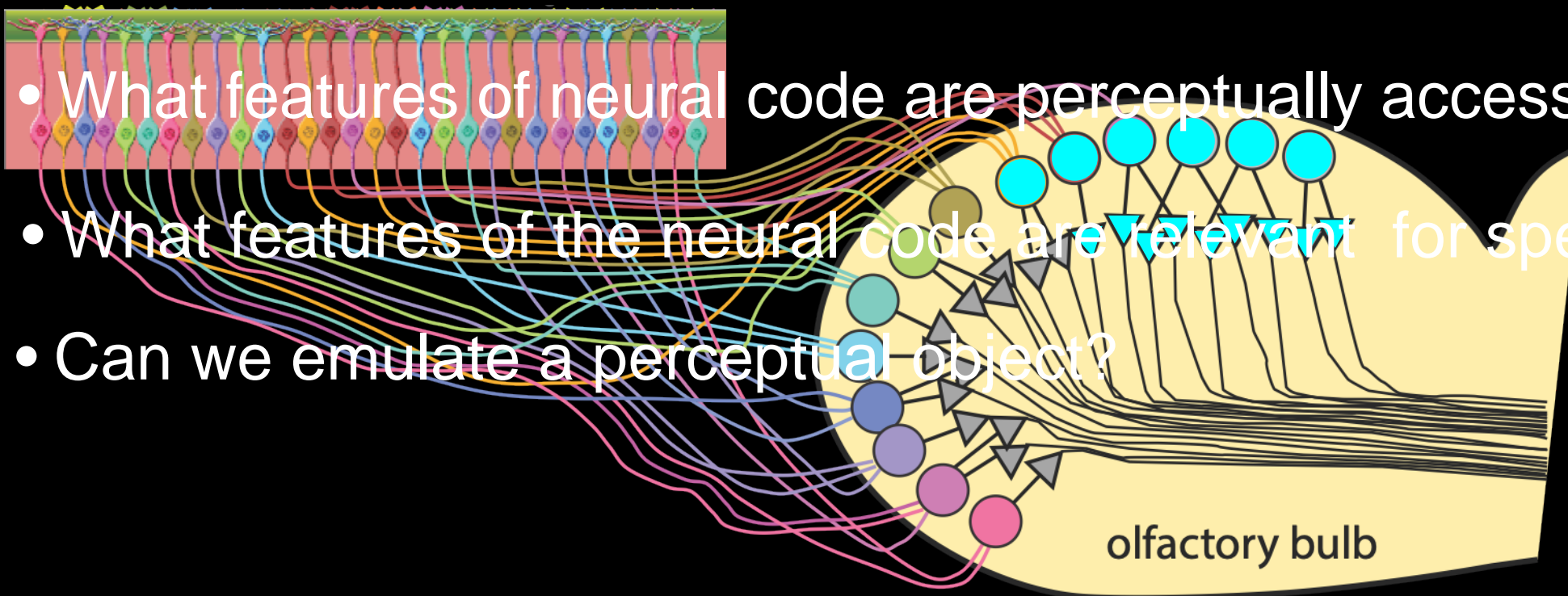
olfactory bulb



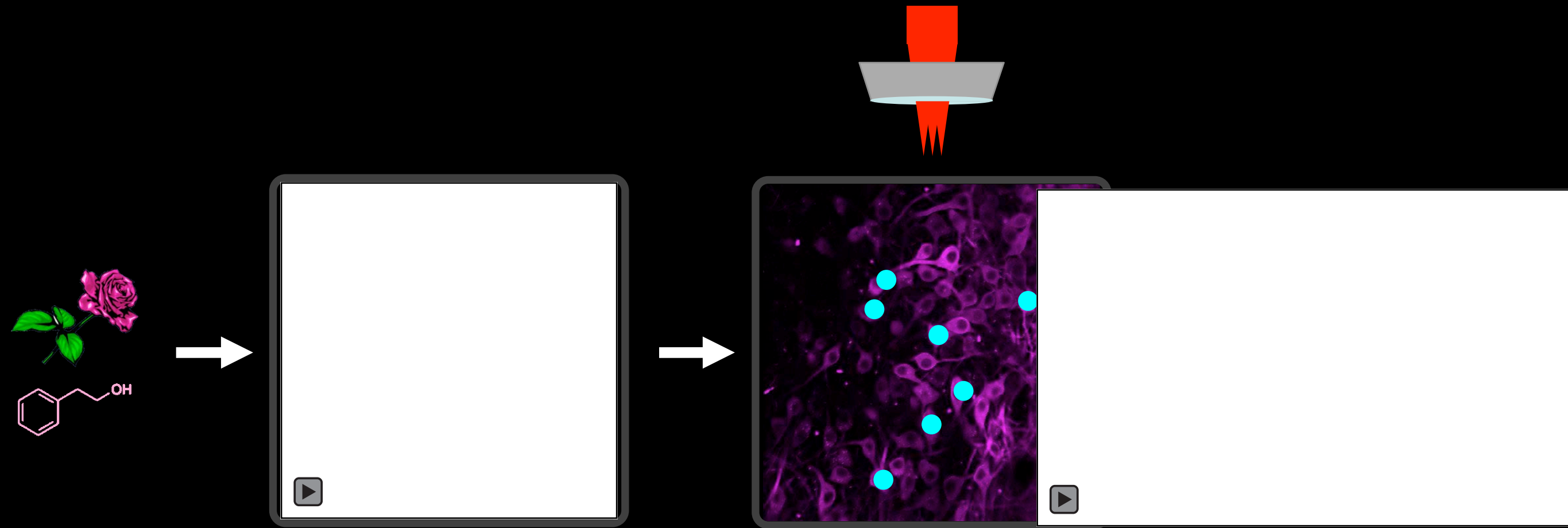




- What features of neural code are perceptually accessible?
- What features of the neural code are relevant for specific behaviors?
- Can we emulate a perceptual object?

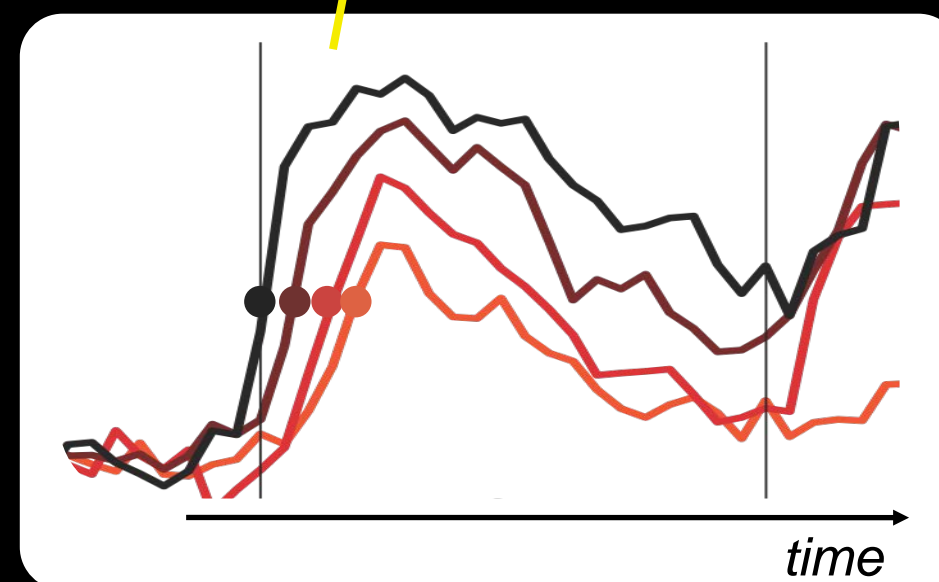
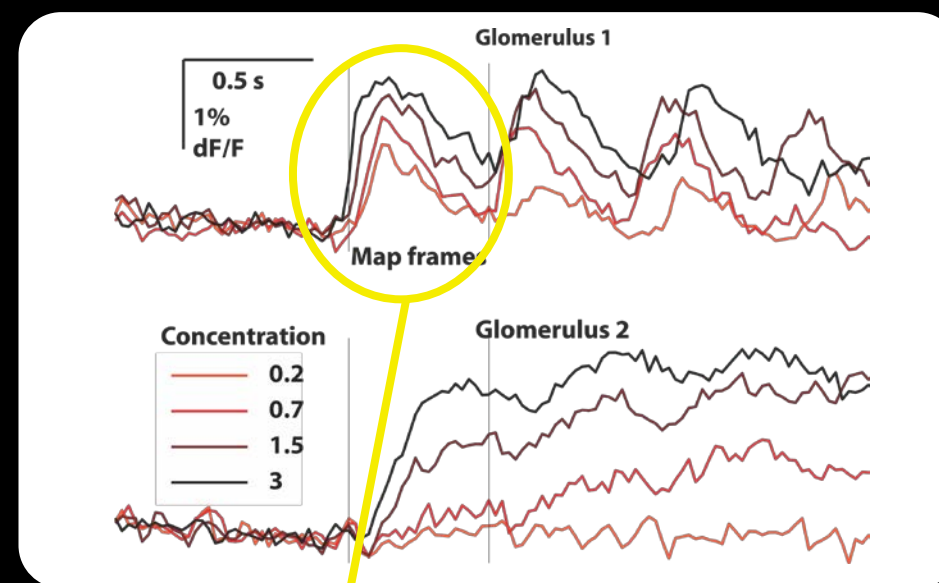
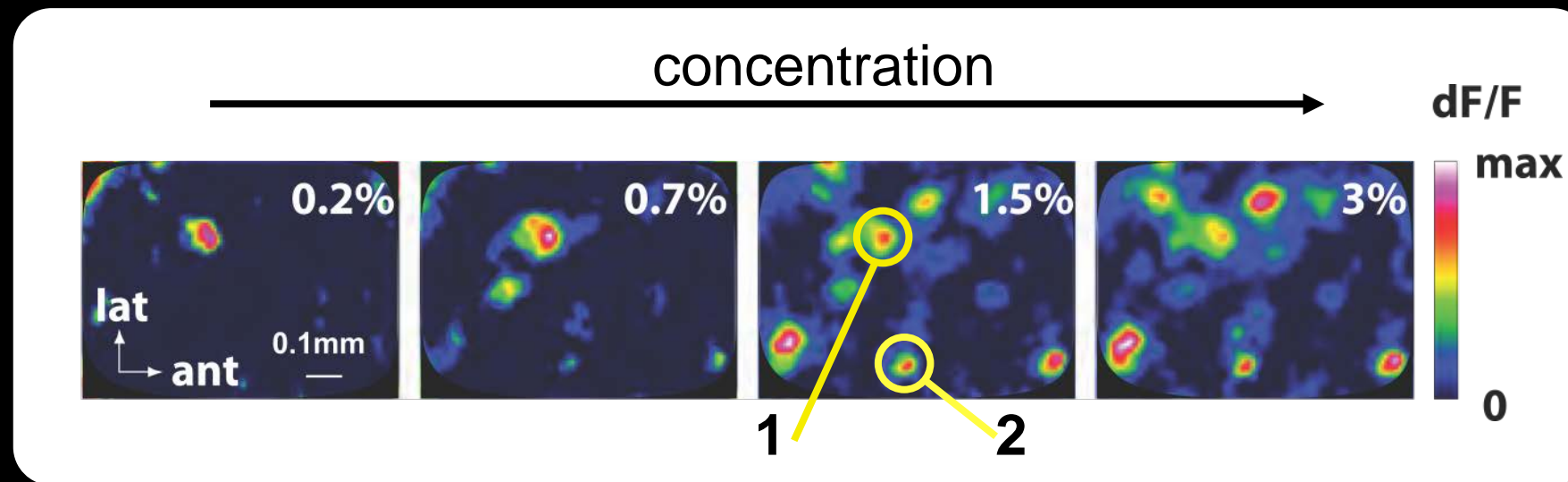


olfactory bulb



- What features of neural code are perceptually accessible?
- What features of the neural code are relevant for specific behaviors?
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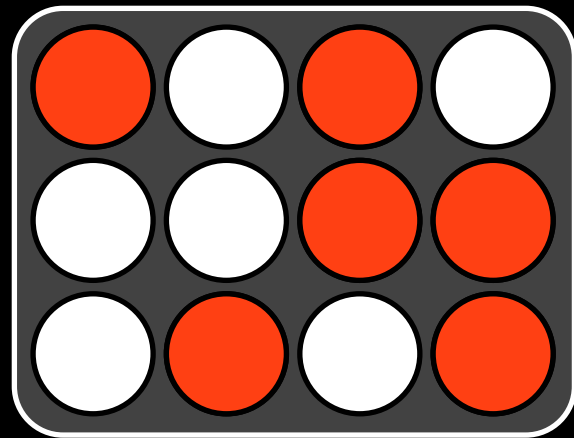
olfactory bulb



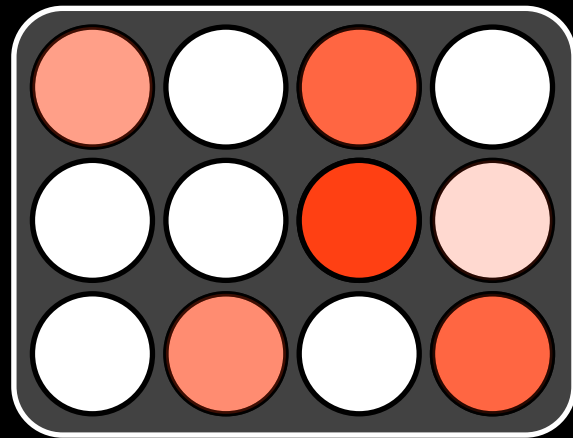
H. Spors, M. Wachowiak, L.B. Cohen, & R.W. Friedrich. **Temporal dynamics and latency patterns of receptor neuron input to the olfactory bulb.** *J Neurosci* **26**, 1247–1259 (2006).

olfactory coding schemes

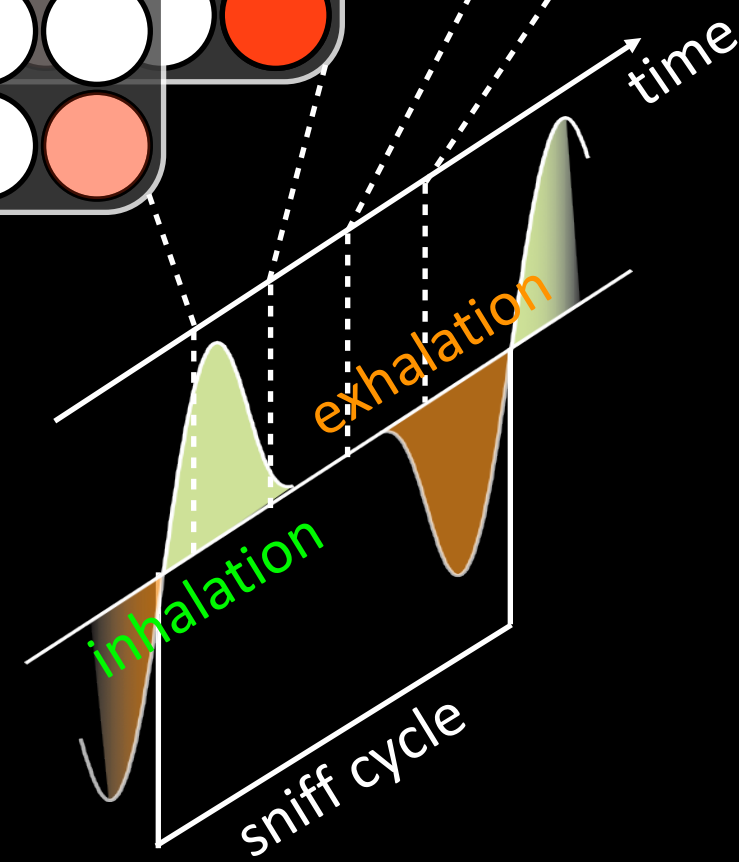
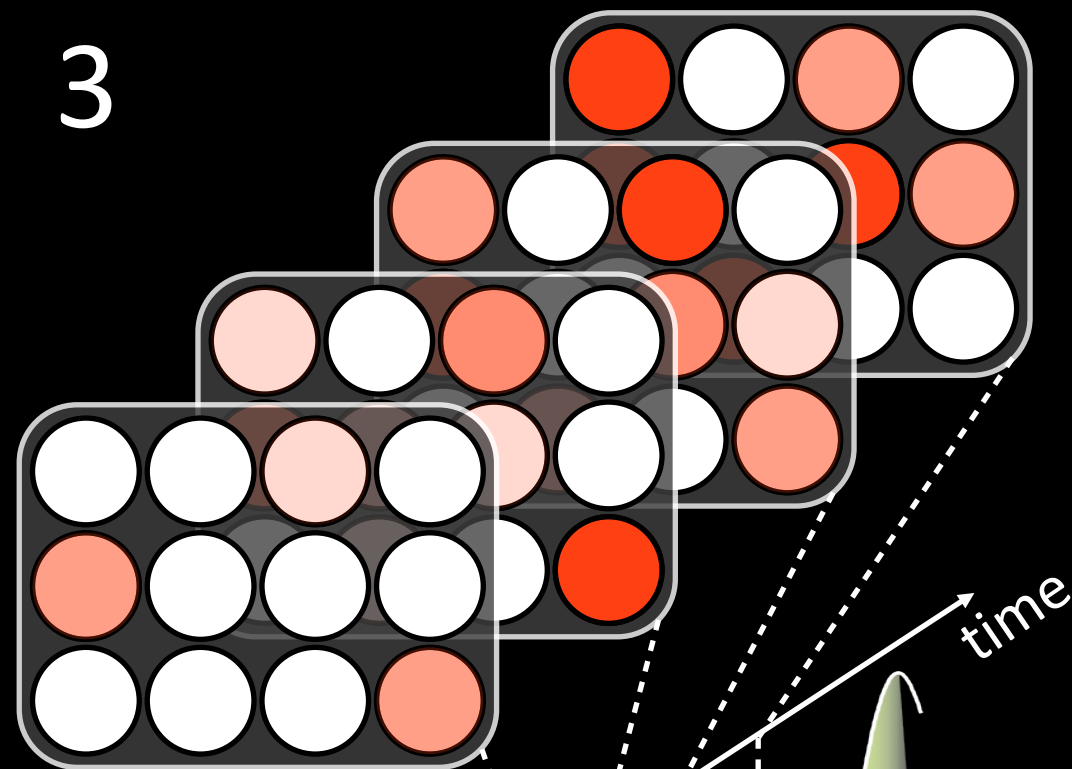
1



2

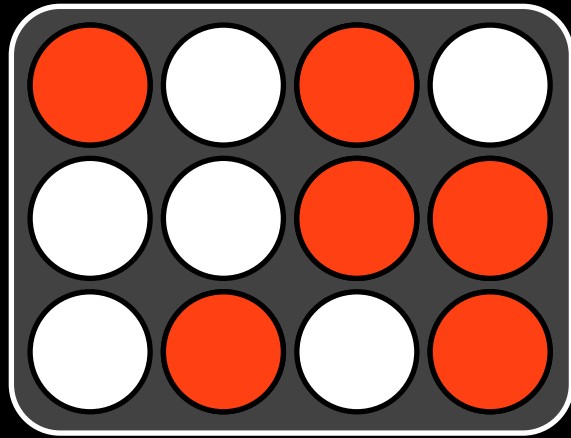


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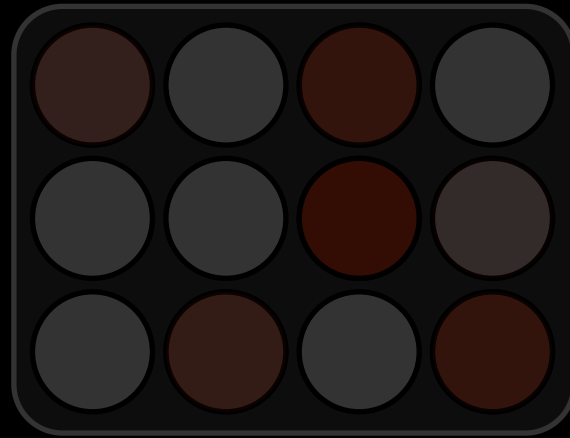


olfactory coding schemes

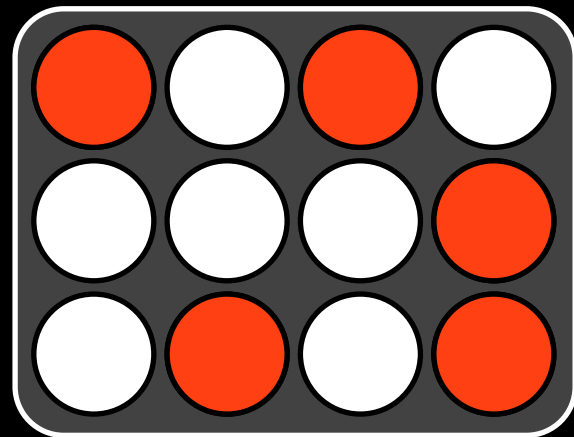
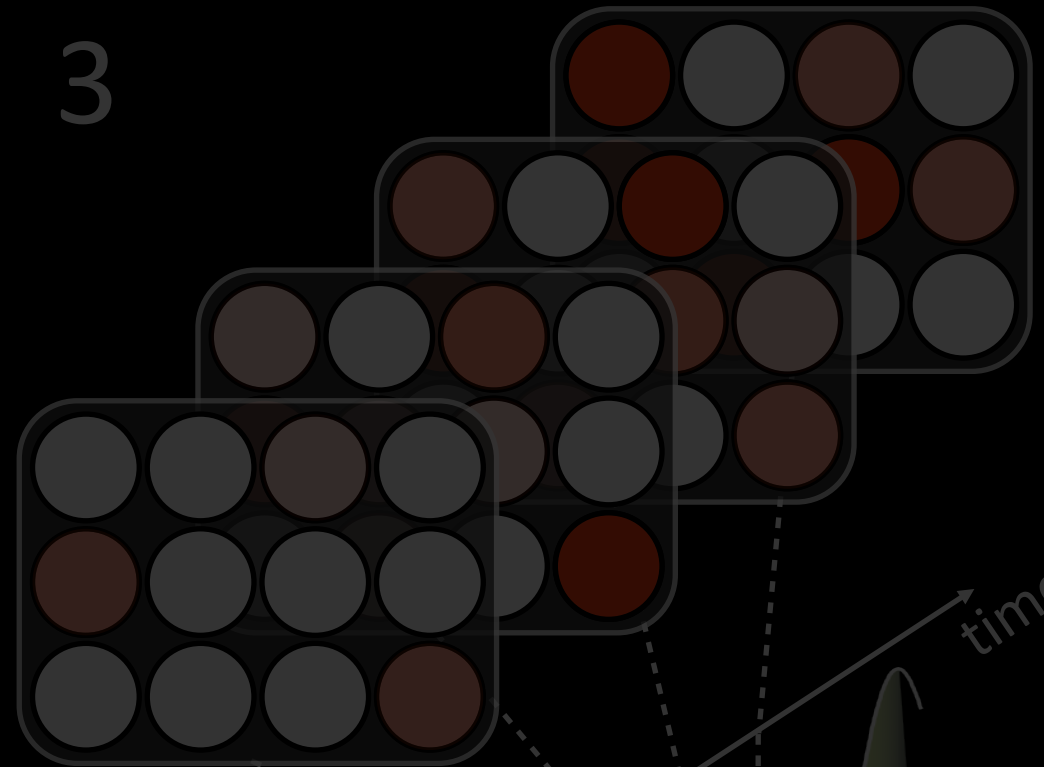
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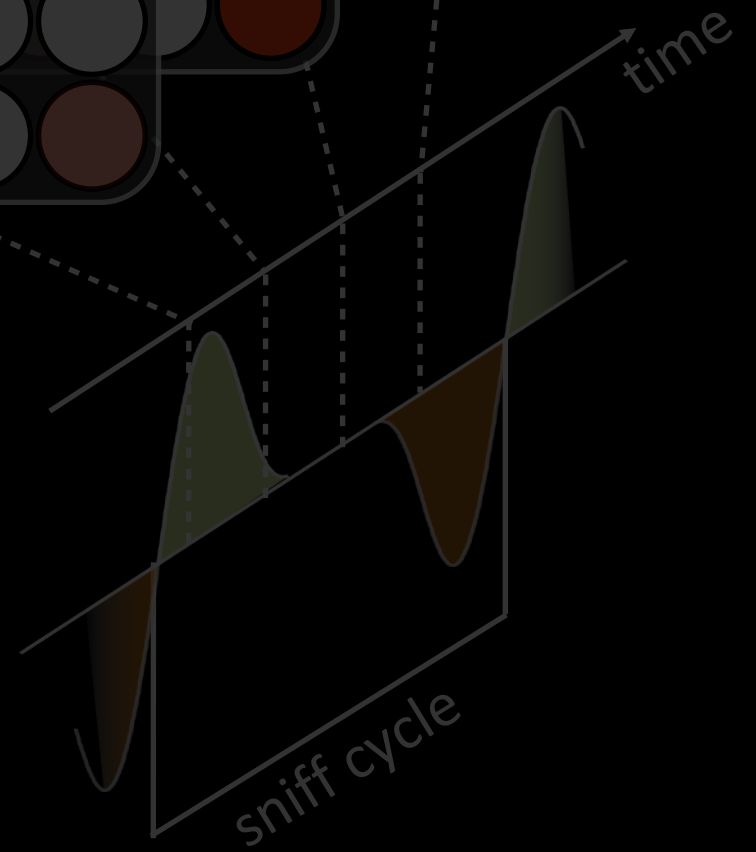
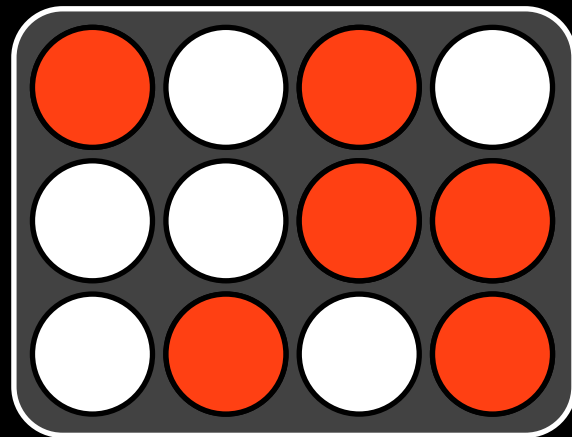
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3

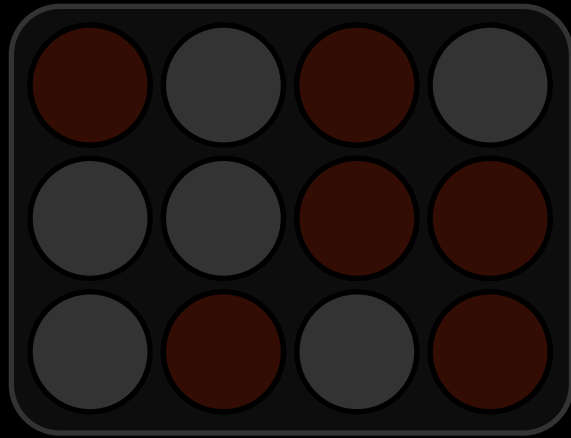


VS

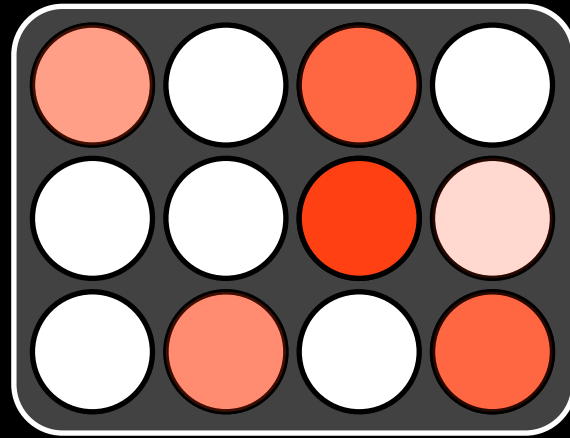


olfactory coding schemes

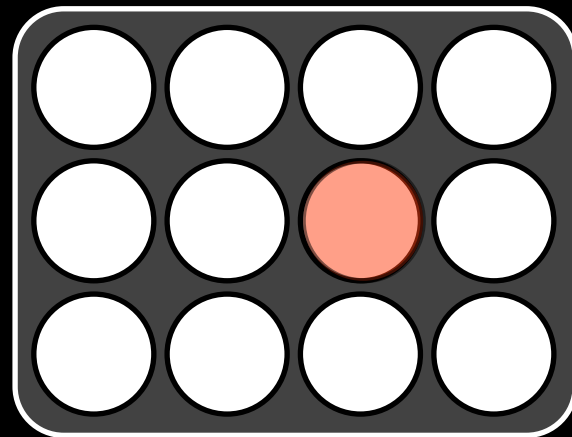
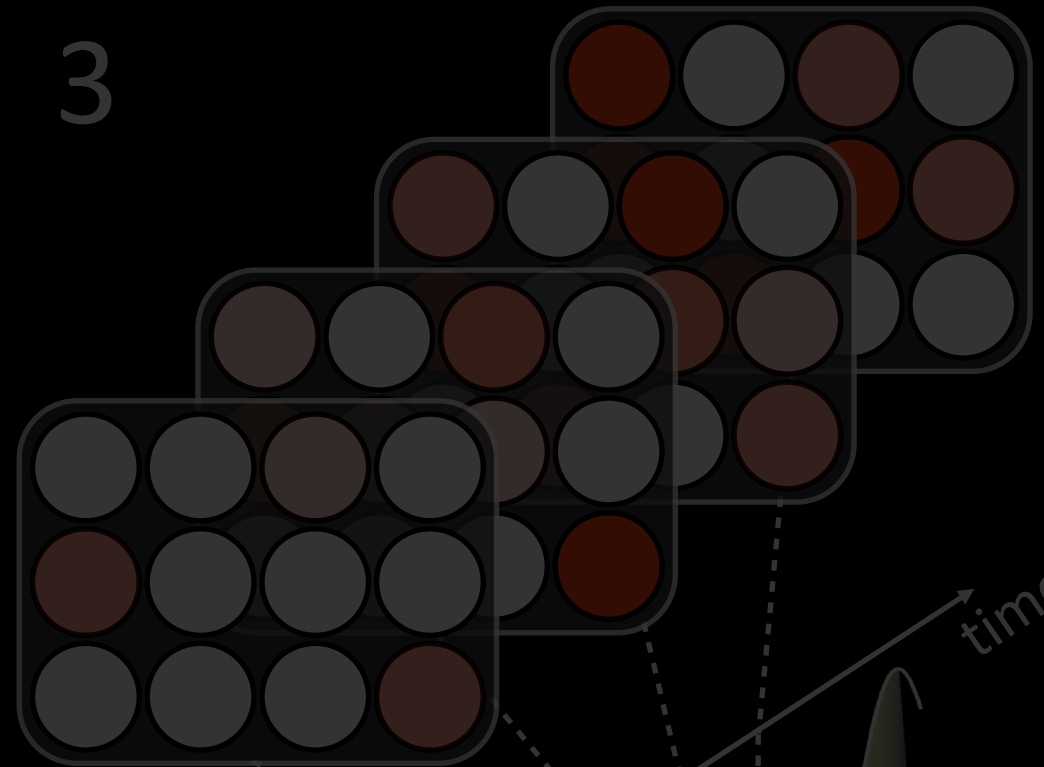
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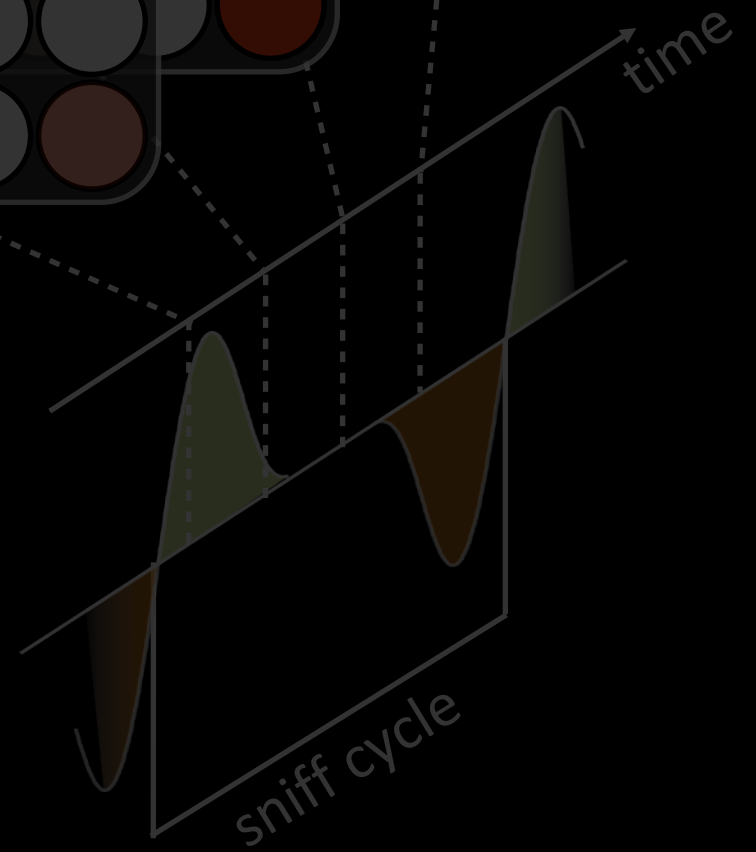
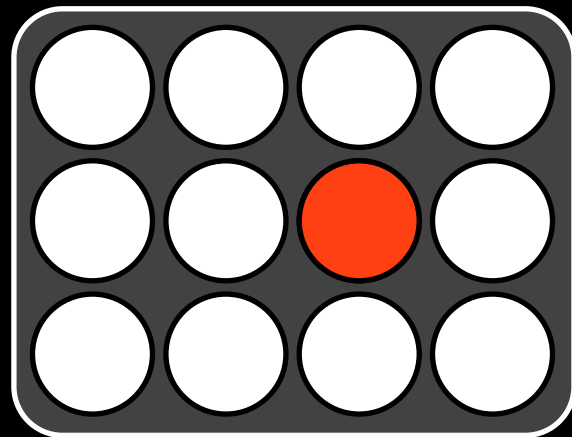
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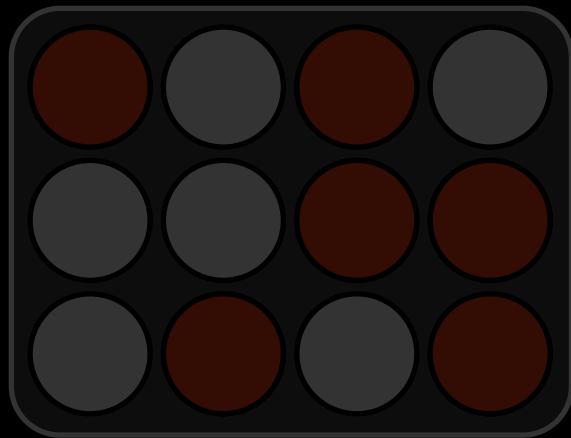


vs

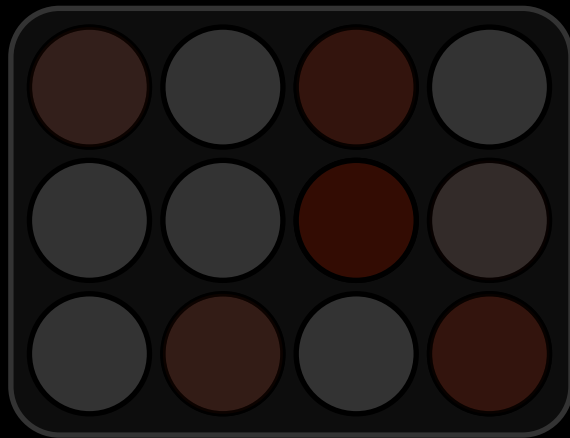


olfactory coding schemes

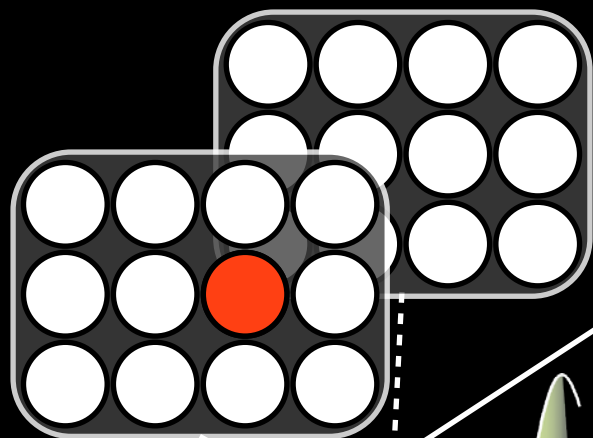
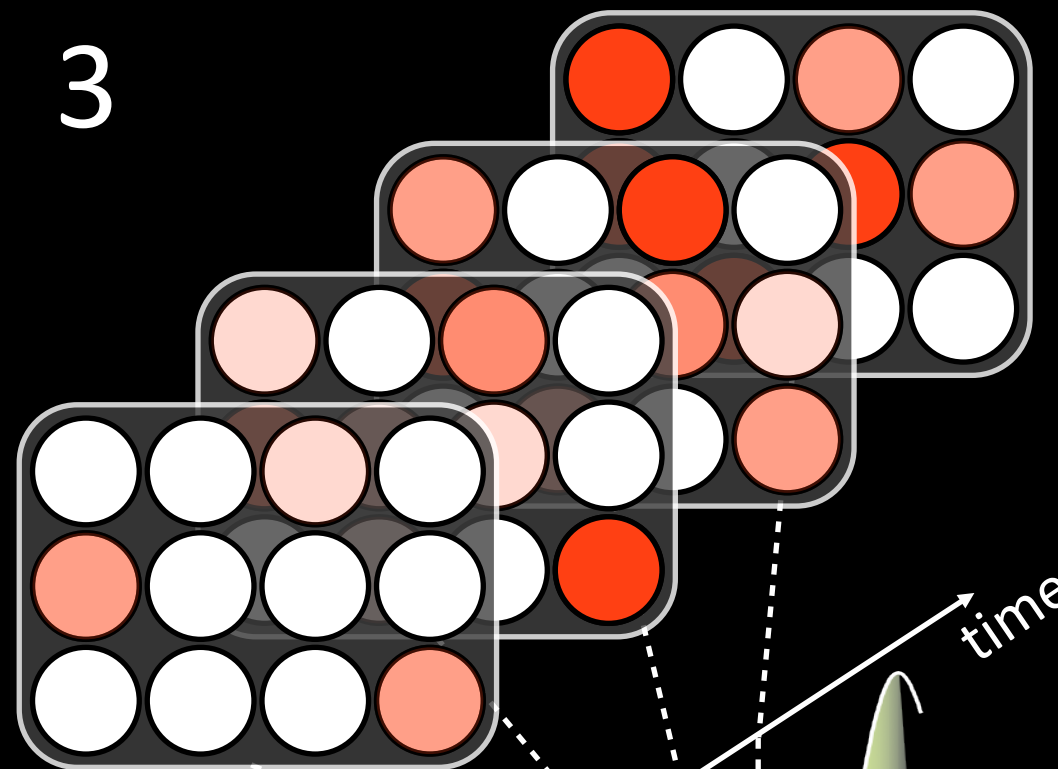
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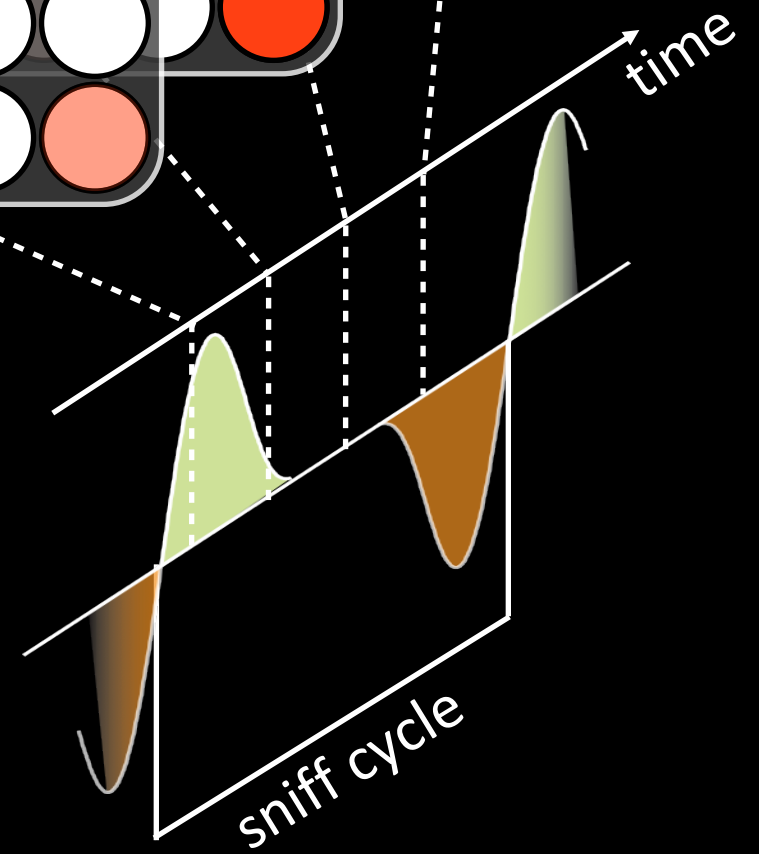
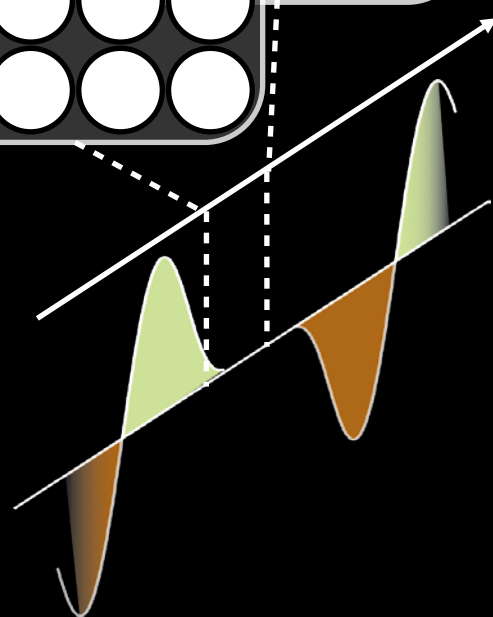
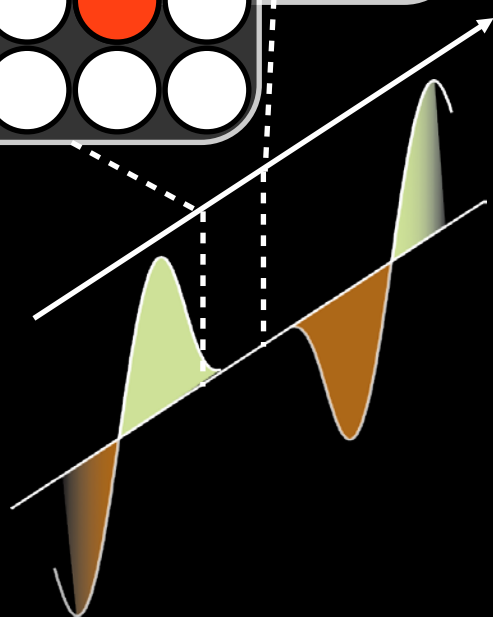
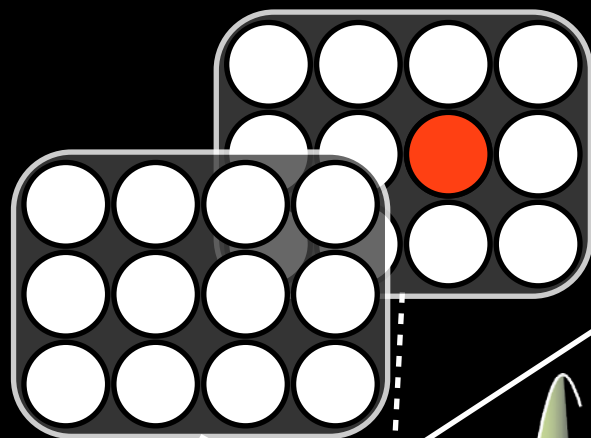
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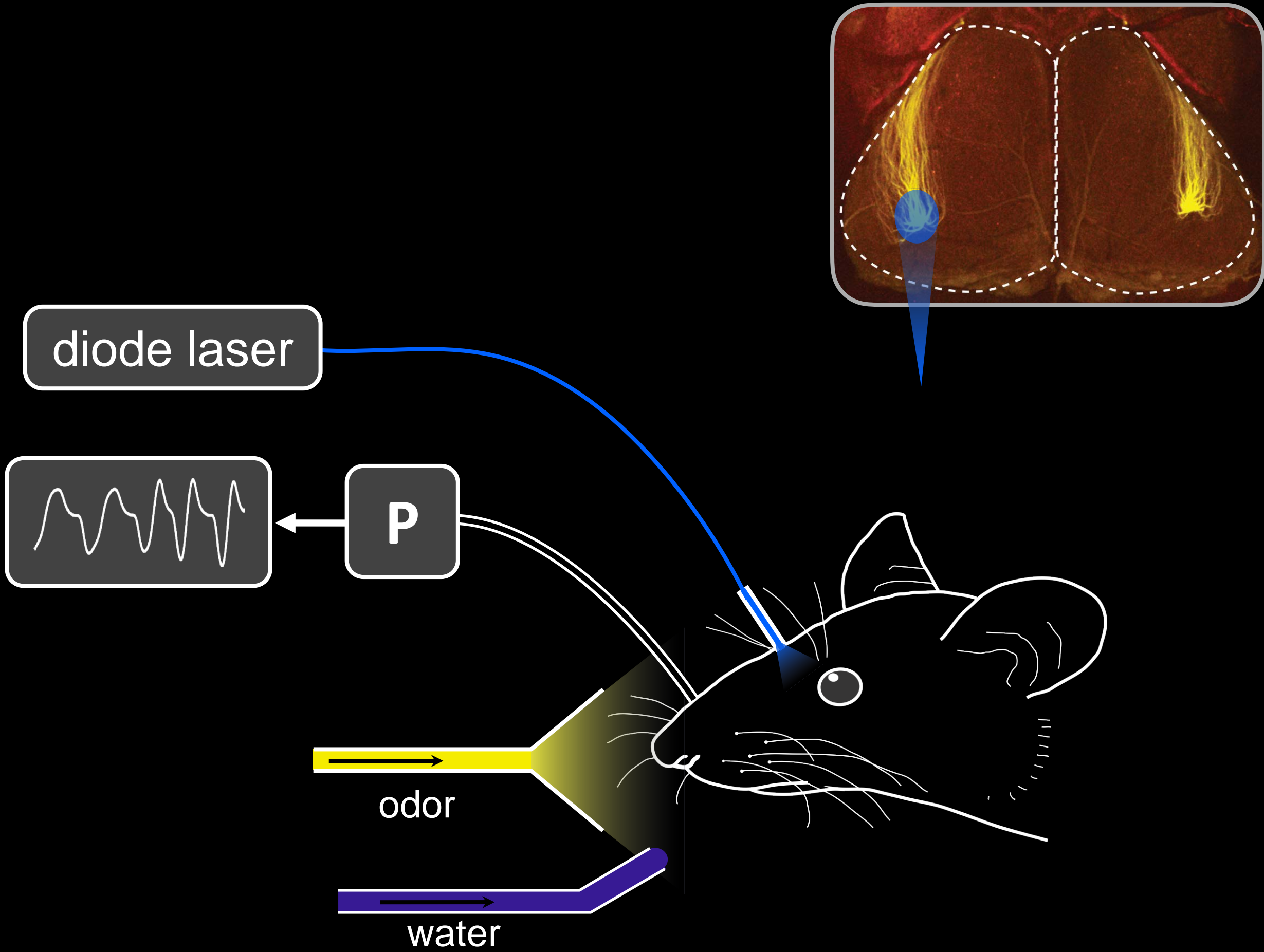
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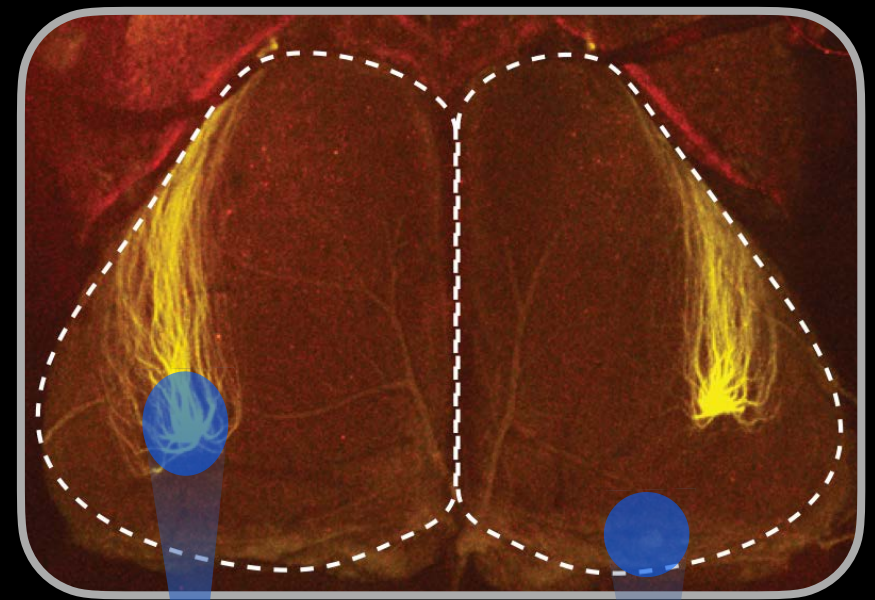
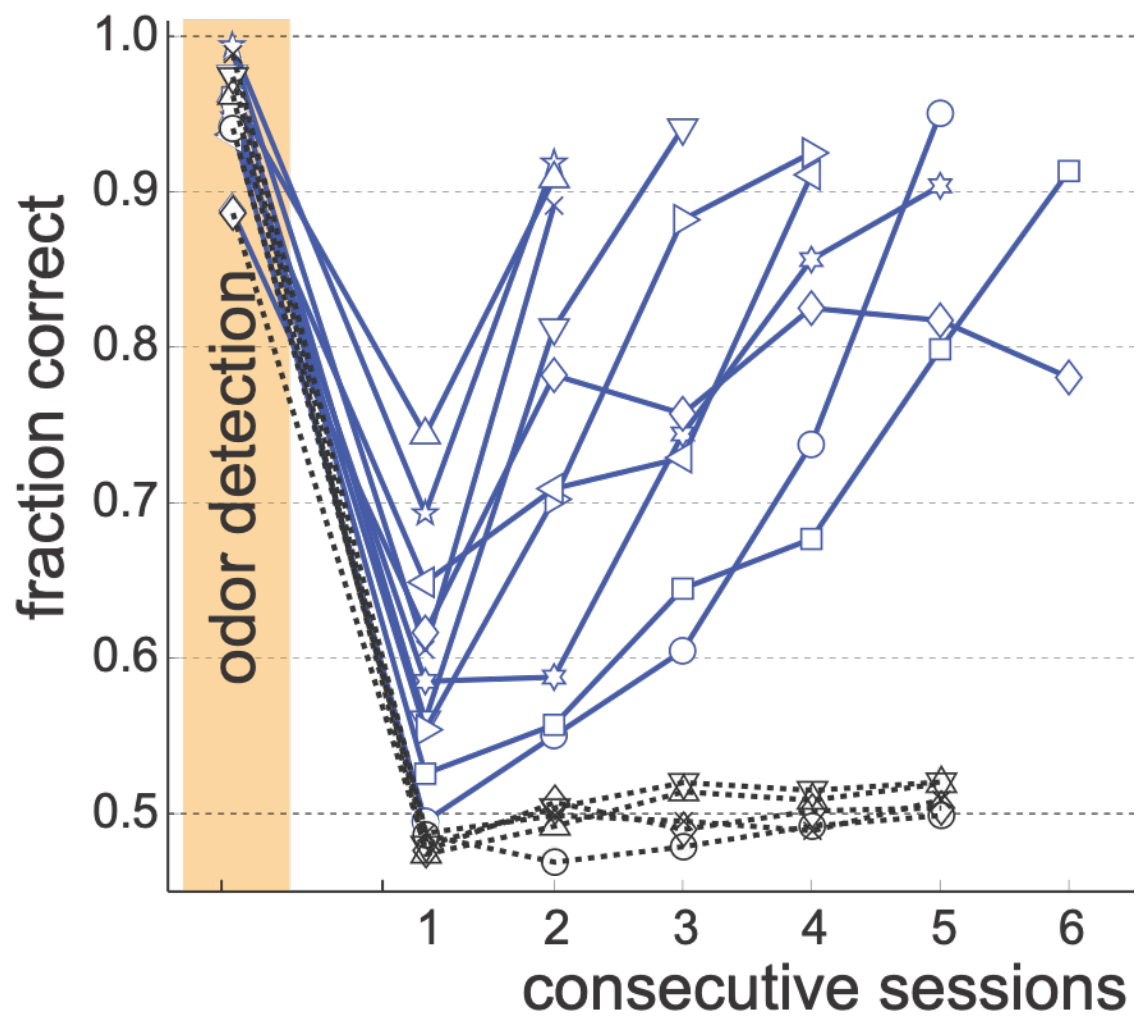
VS



sniff cycle



diode laser



ChR2
stimulation

control
stimulation

laser pulse:
40 mW - 1 ms

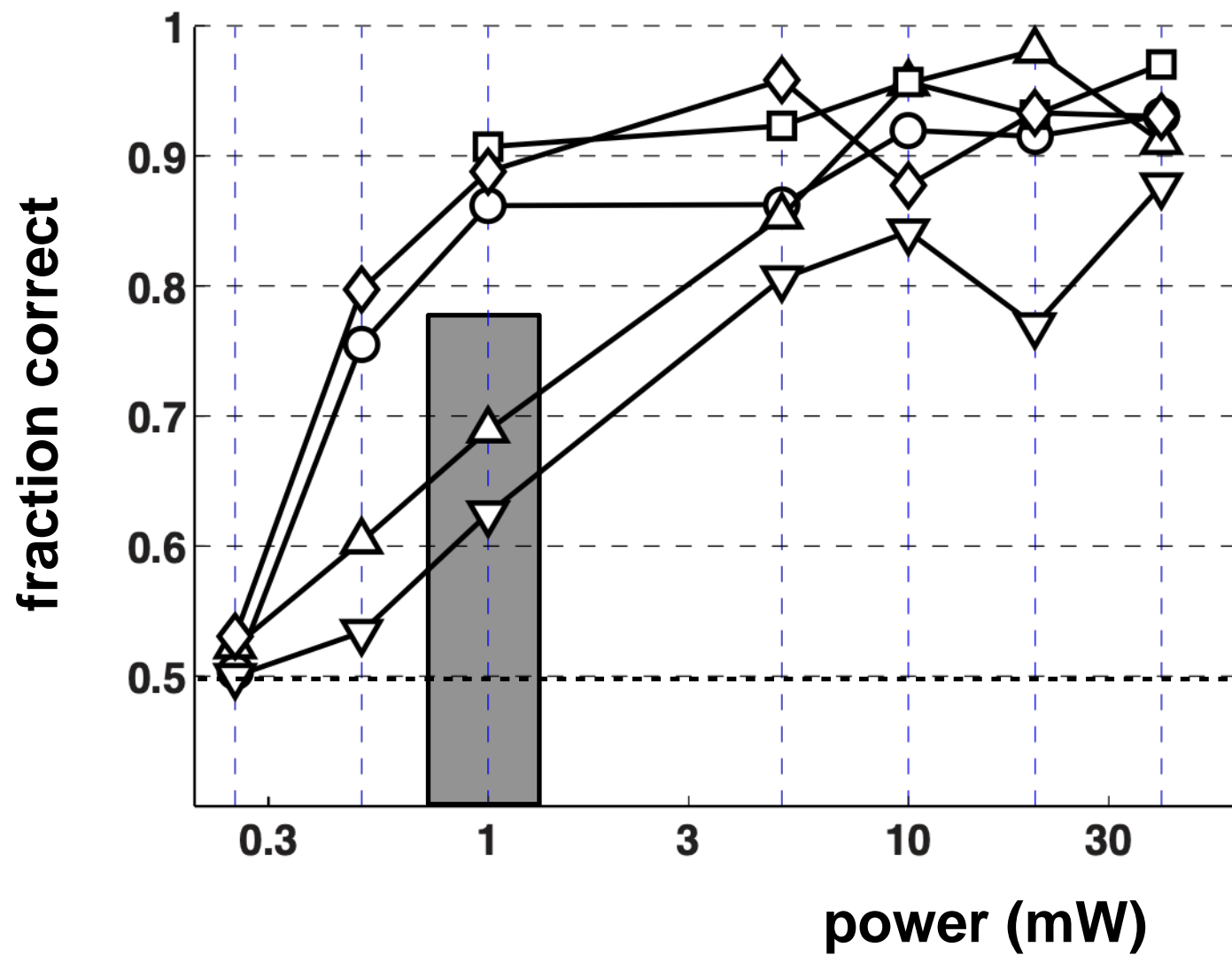
light pulse:
1 ms

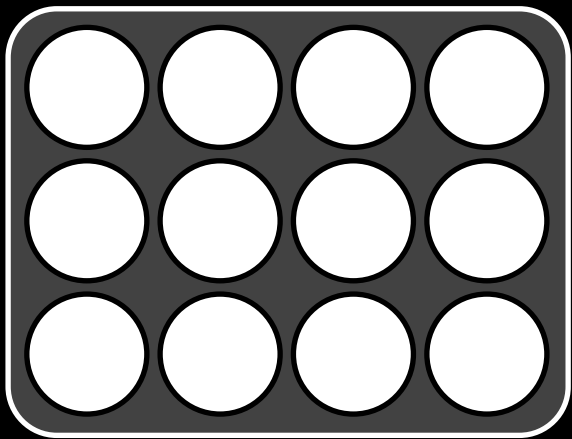
0.3 mW

3 mW

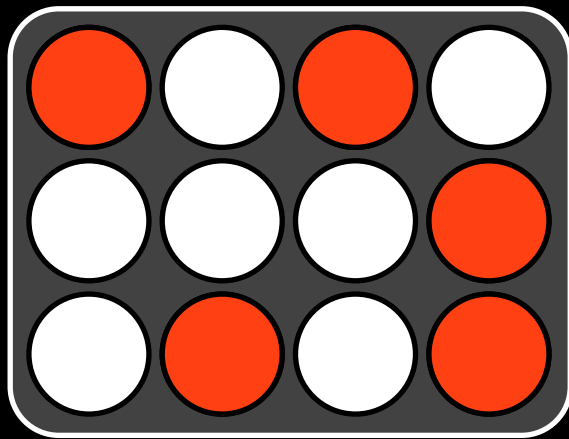
30 mW

go
no-go

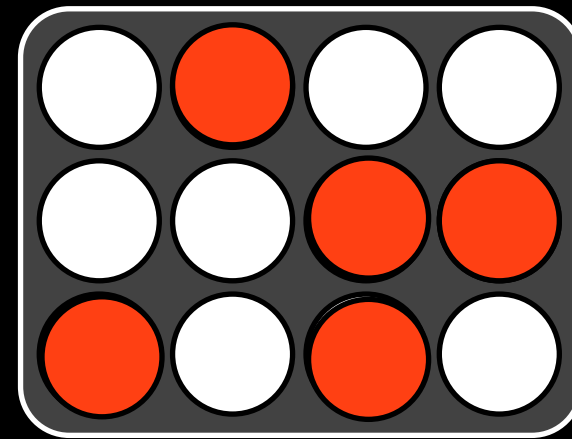




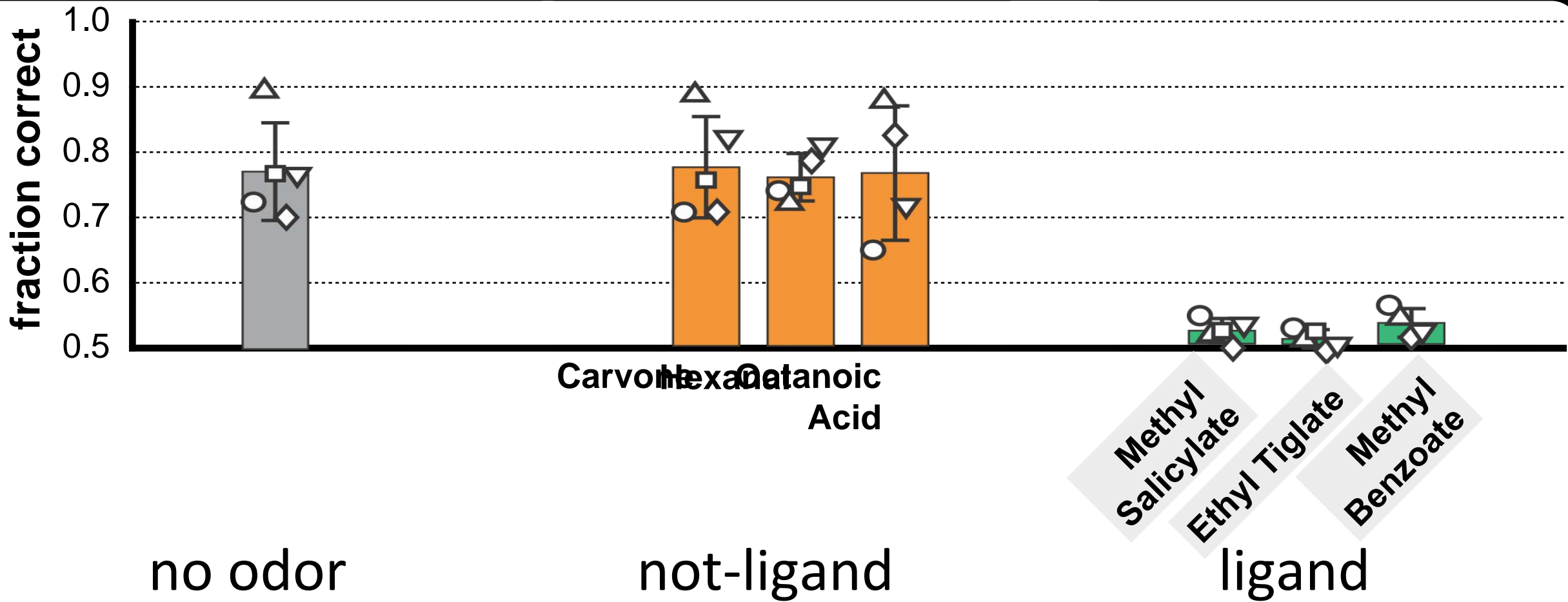
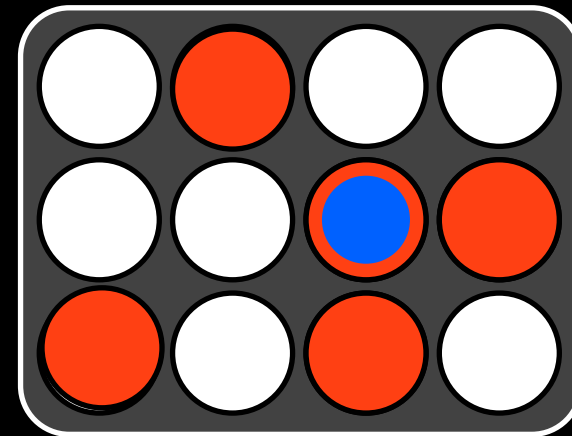
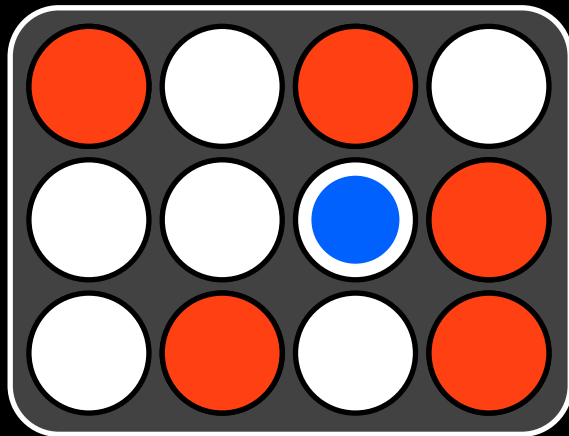
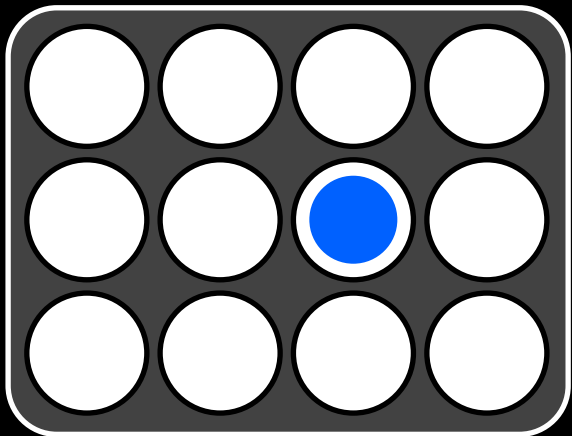
VS

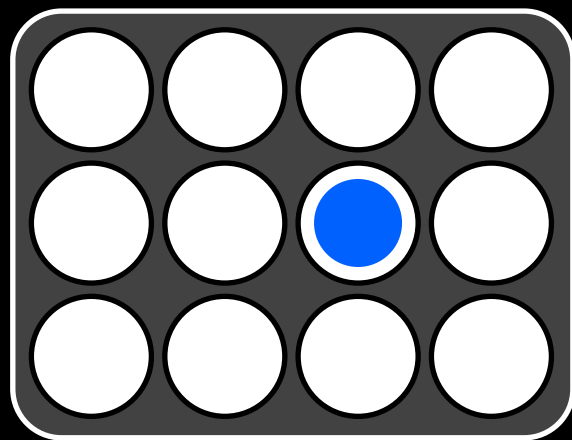


VS

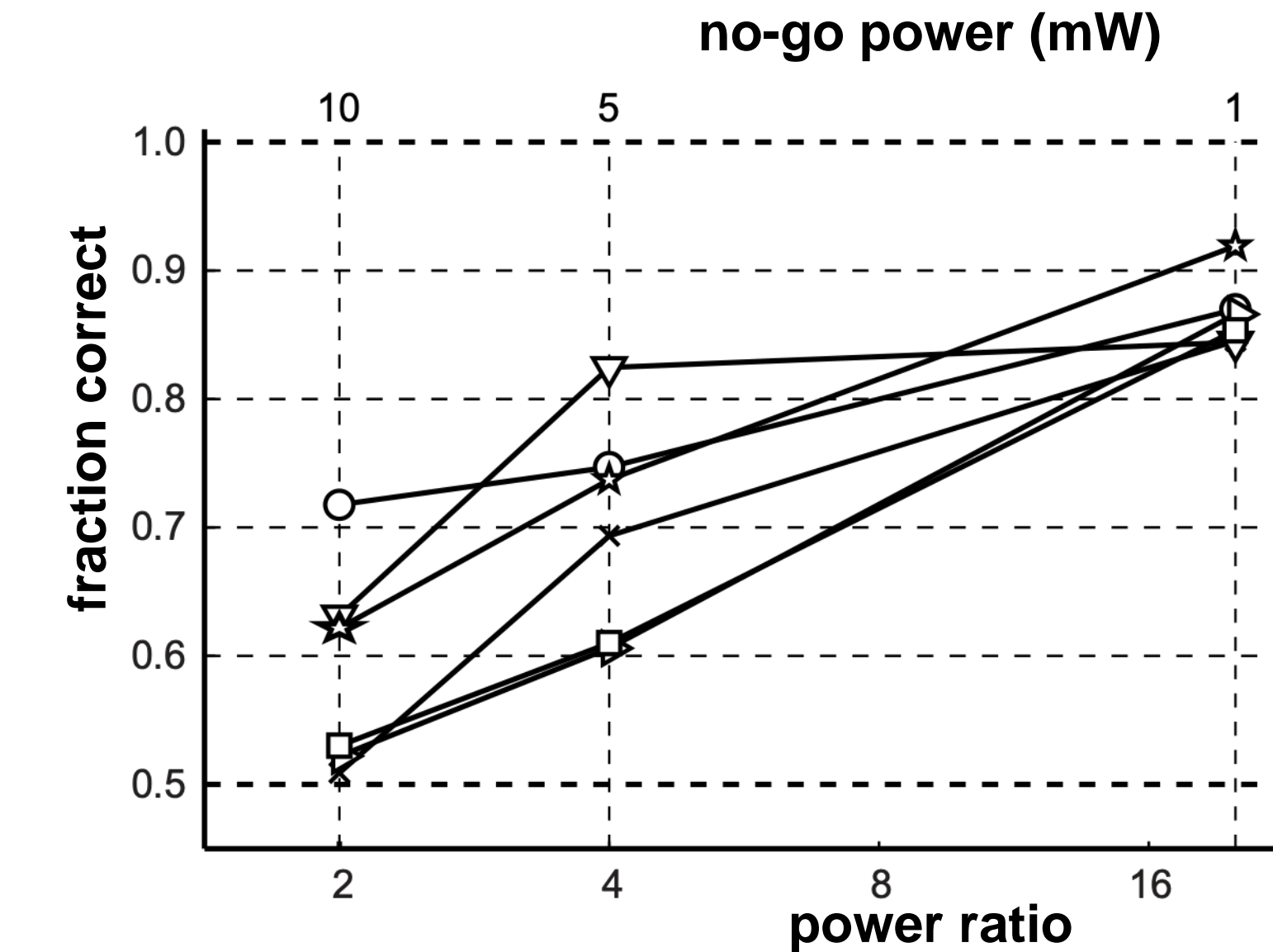
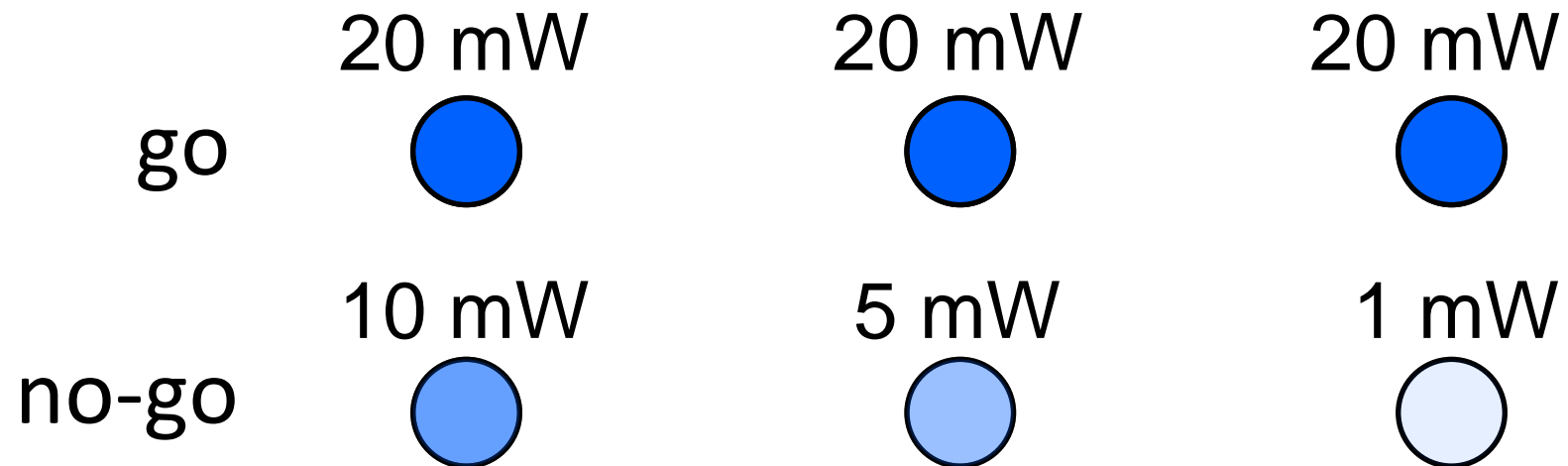
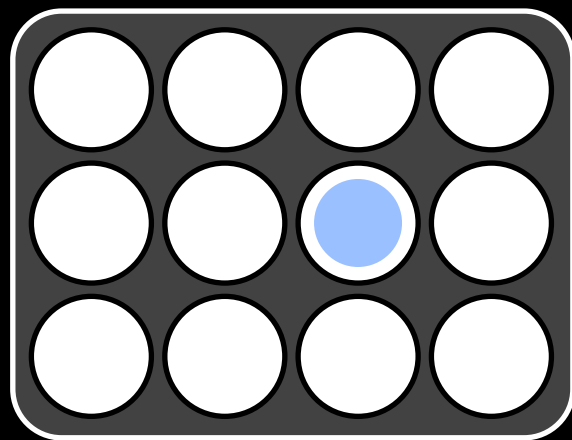


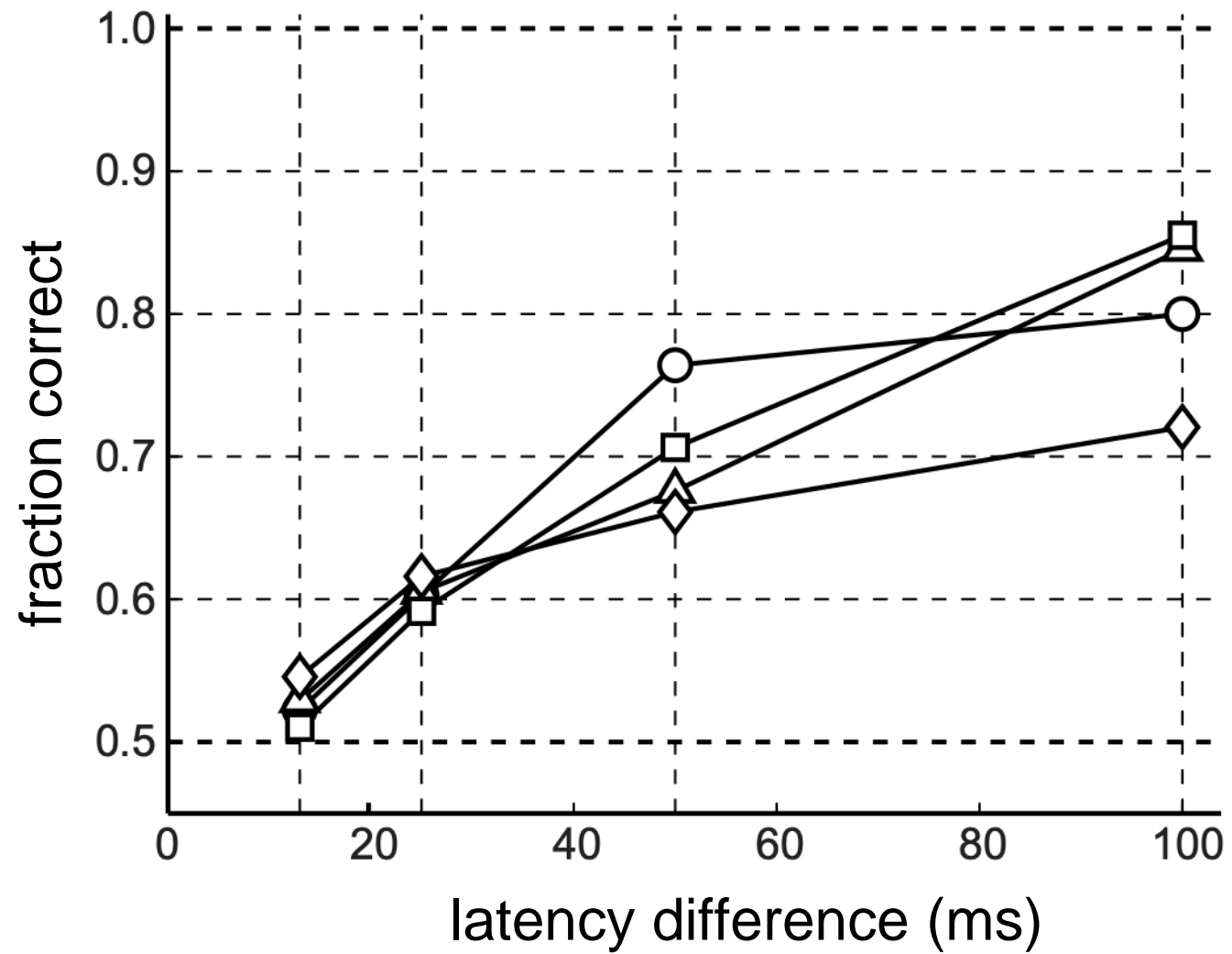
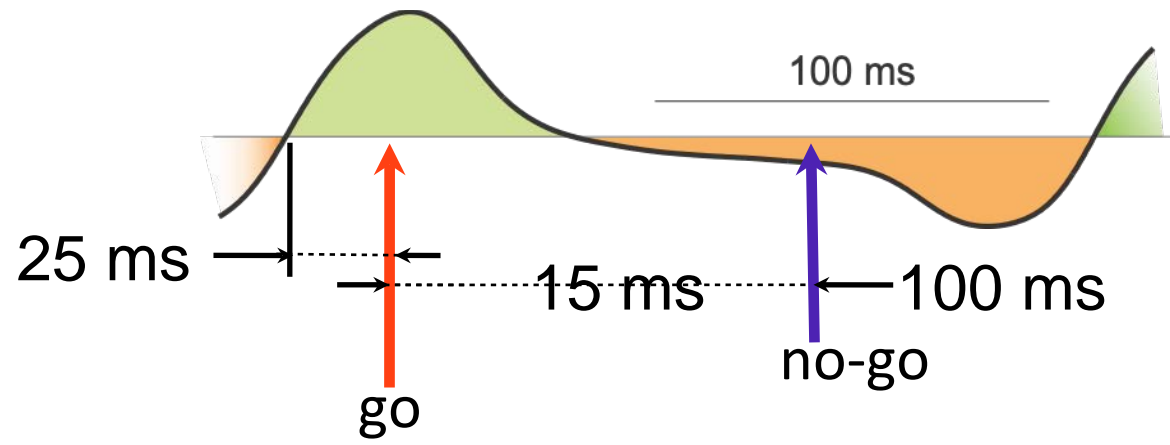
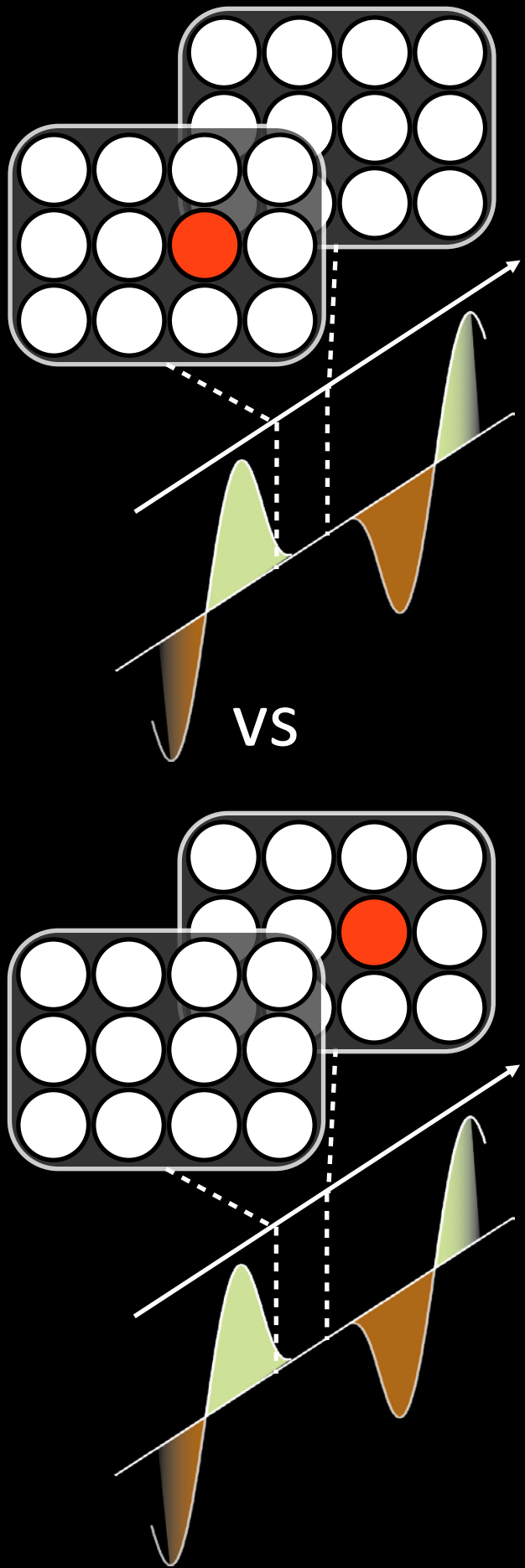
VS

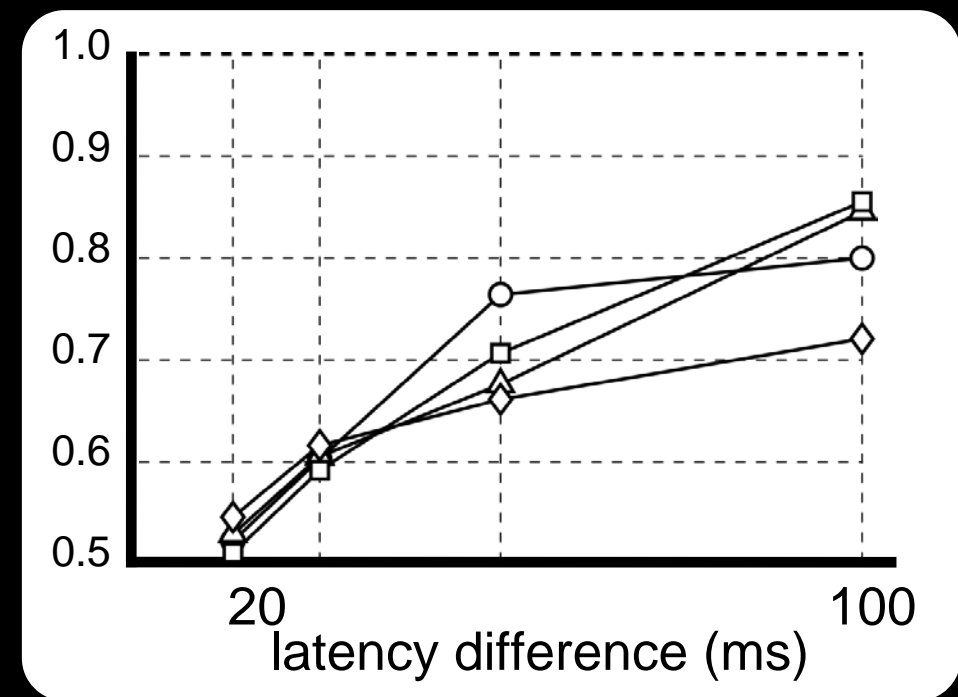
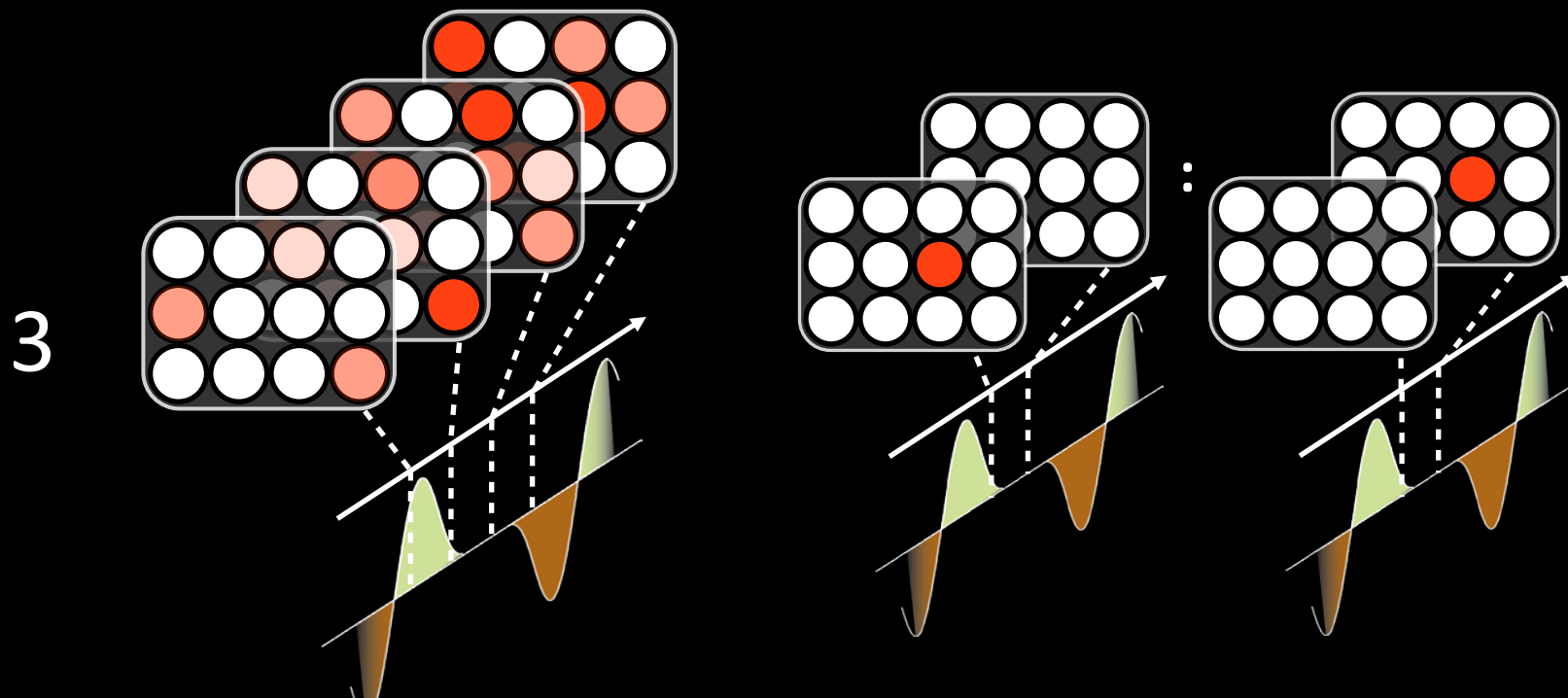
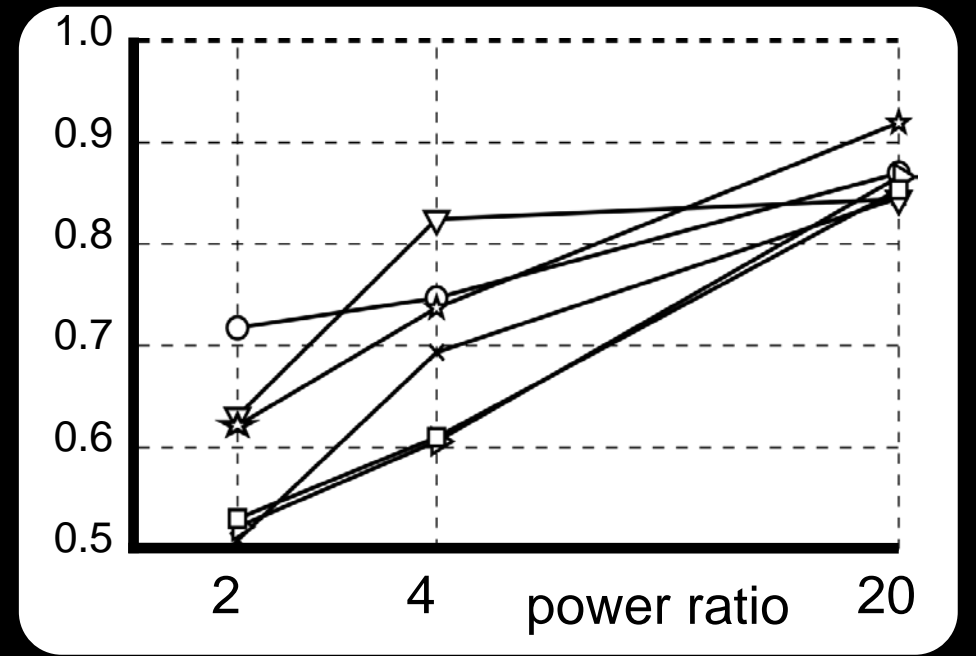
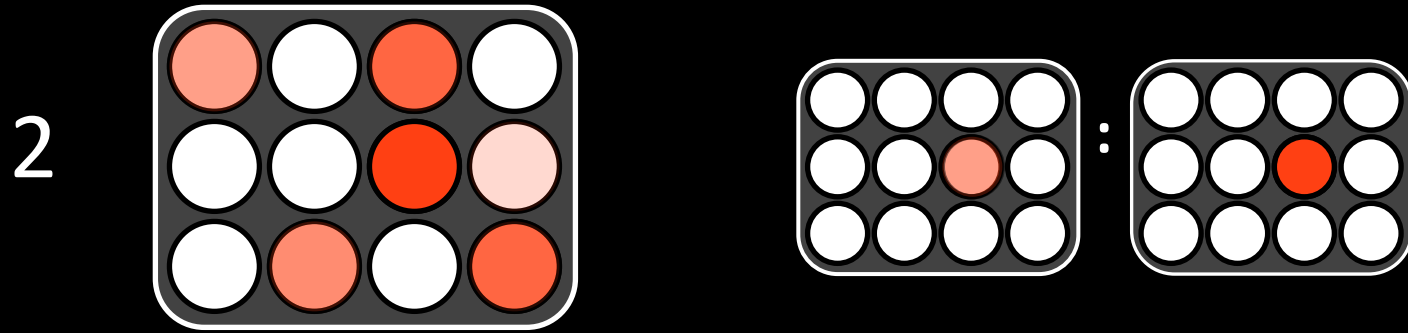
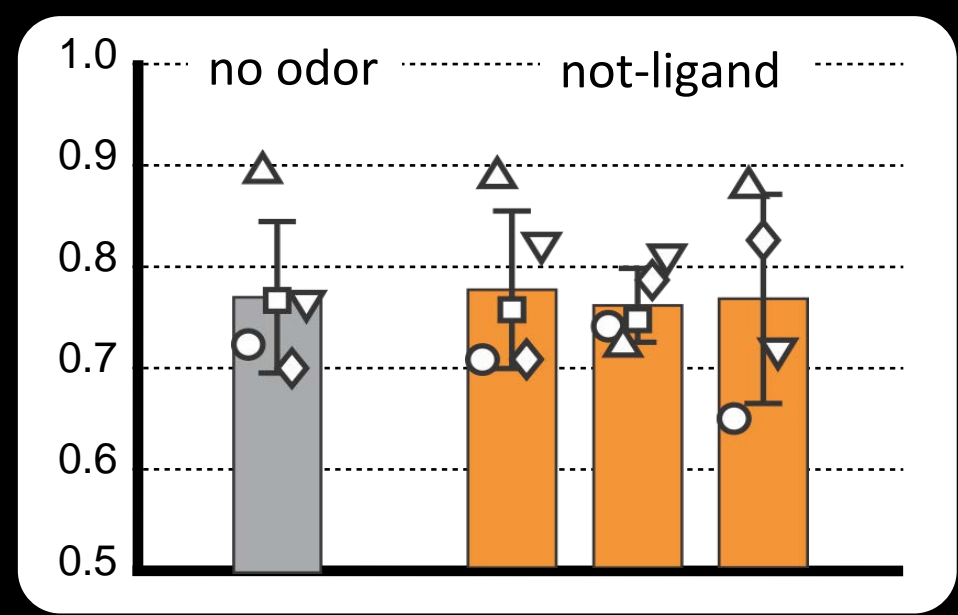
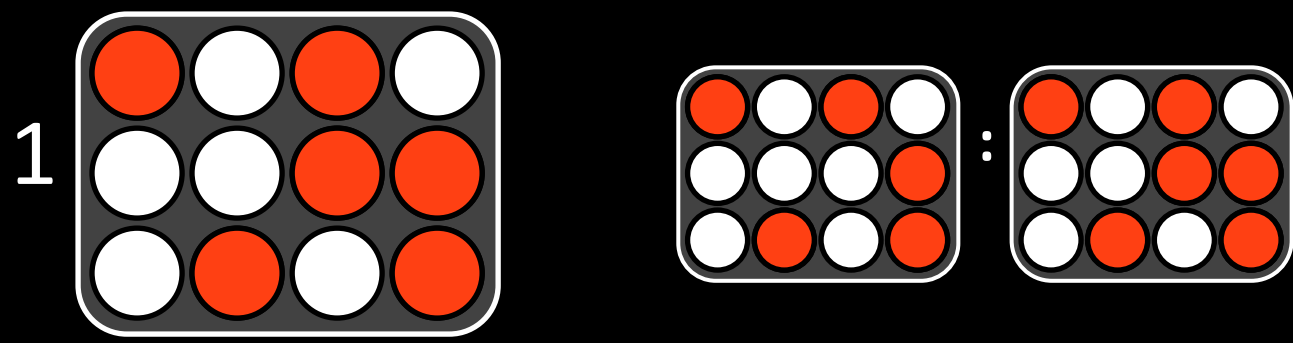


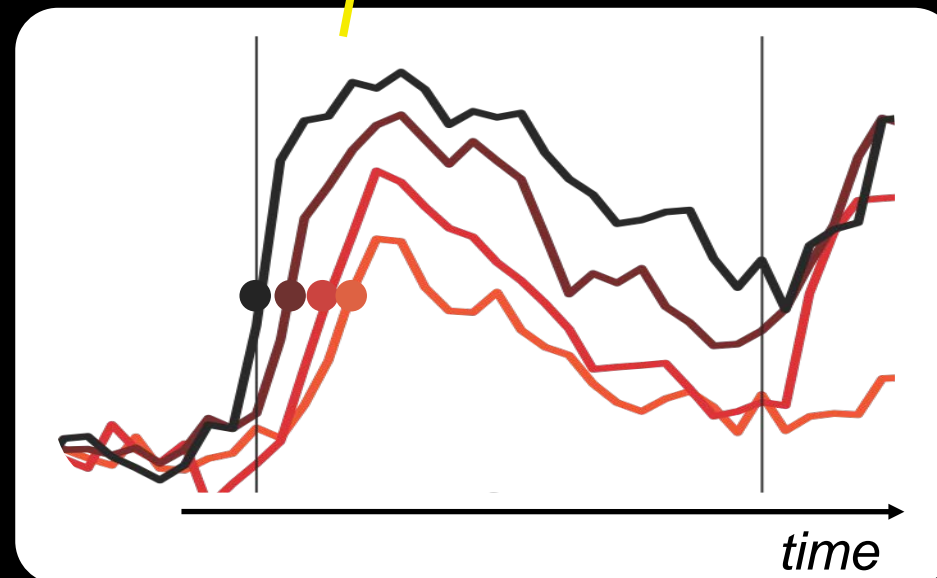
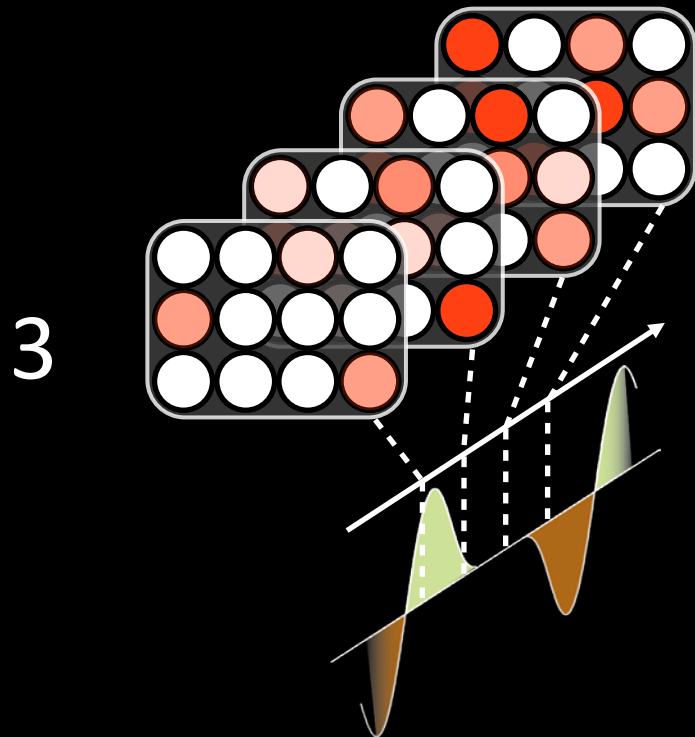
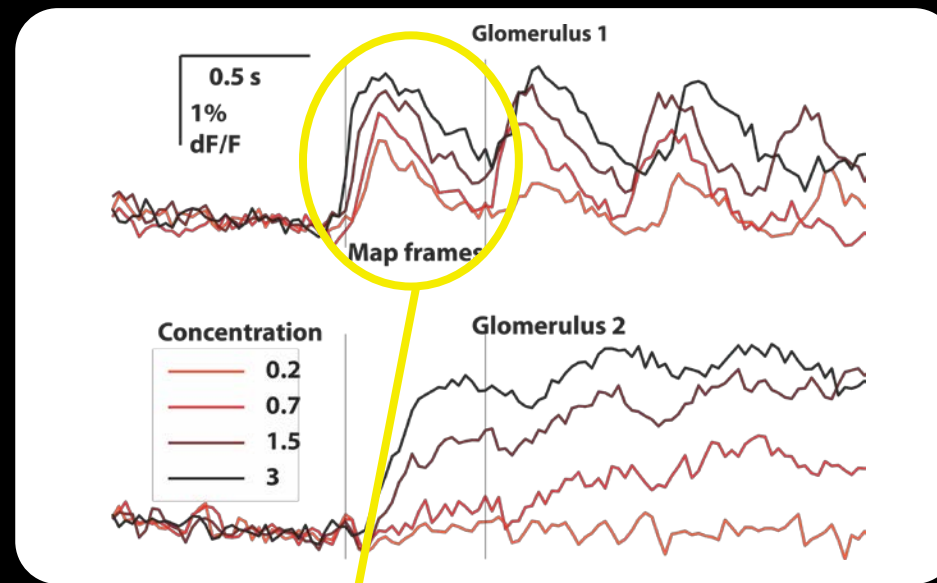
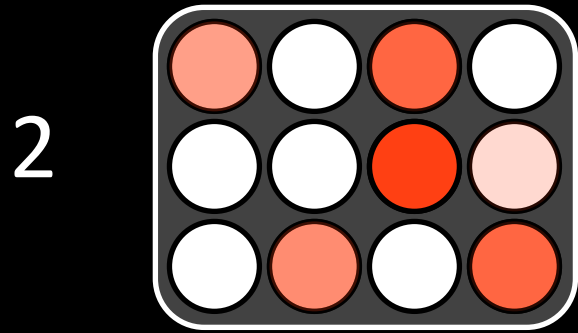
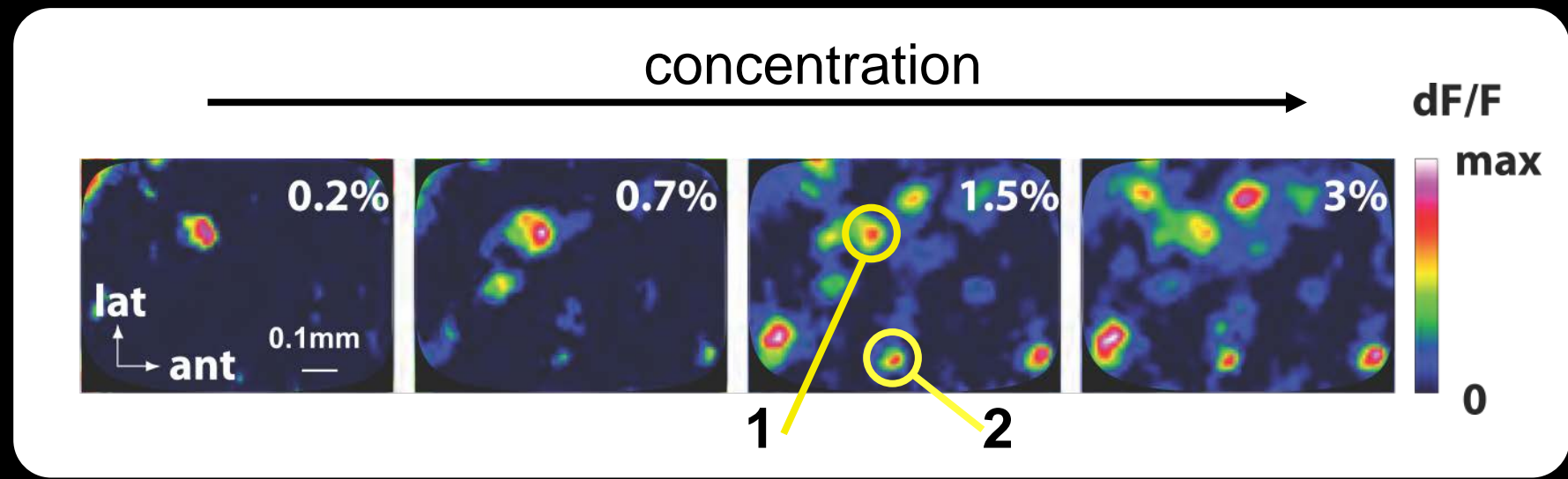
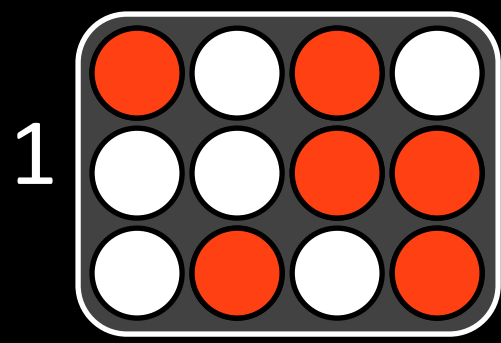


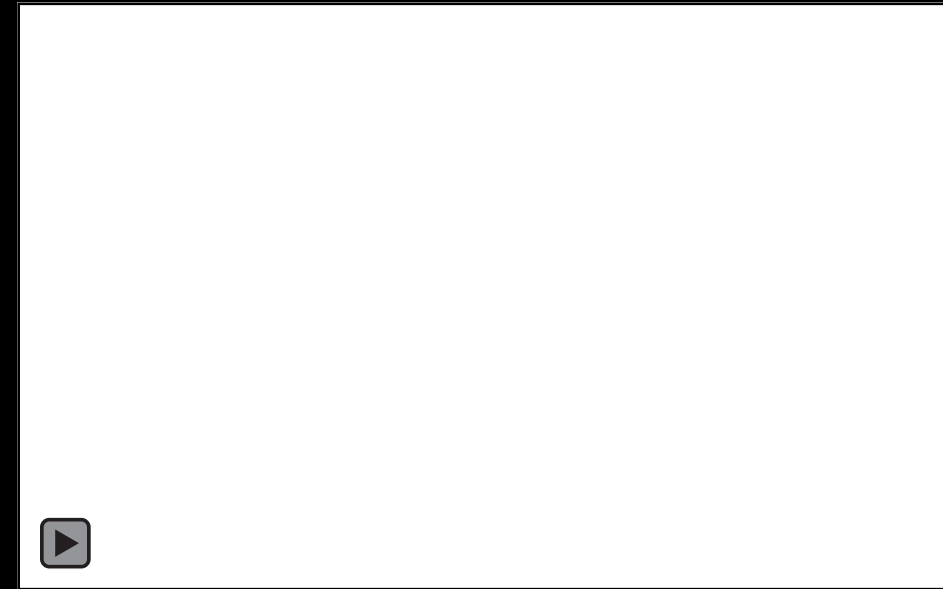
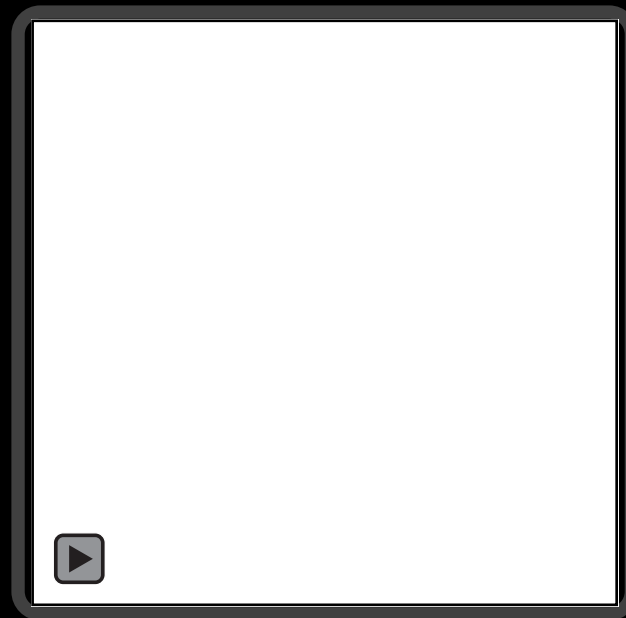
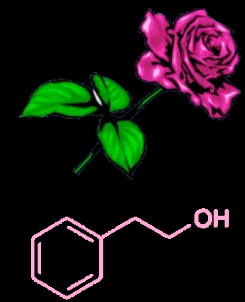
VS





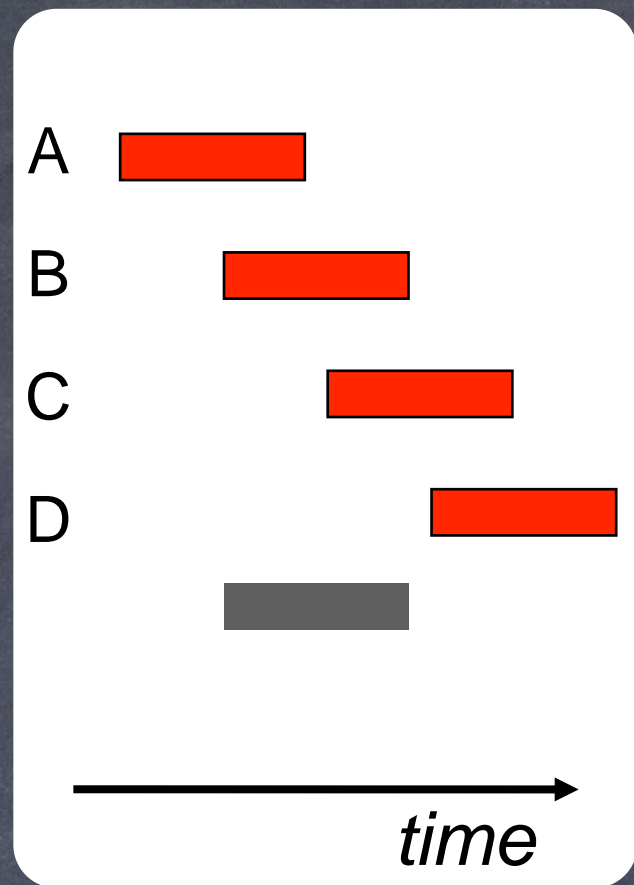
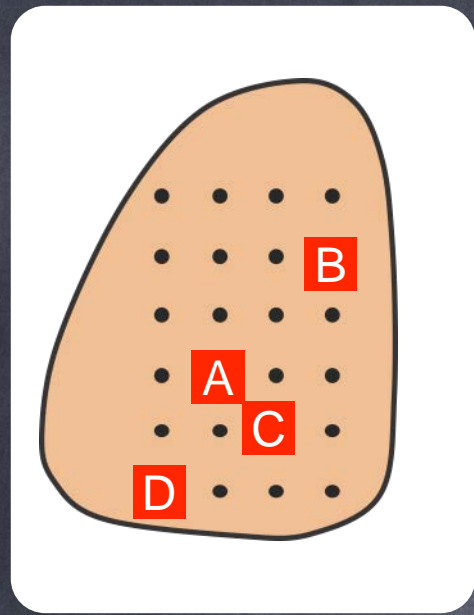






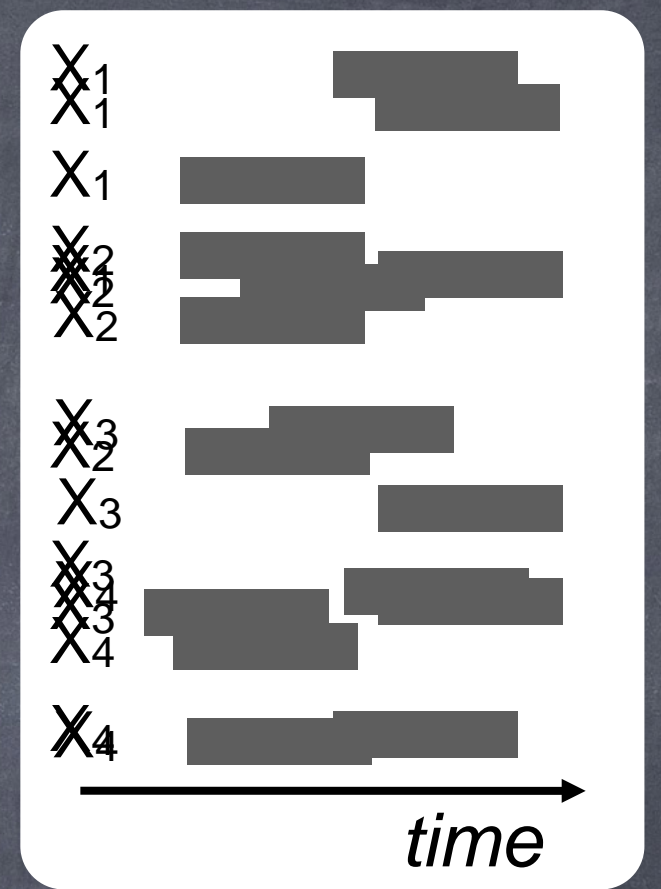
- What features of neural code are perceptually accessible?
- What features of the neural code are relevant for specific behaviors?
- Can we emulate a perceptual object?

olfactory bulb

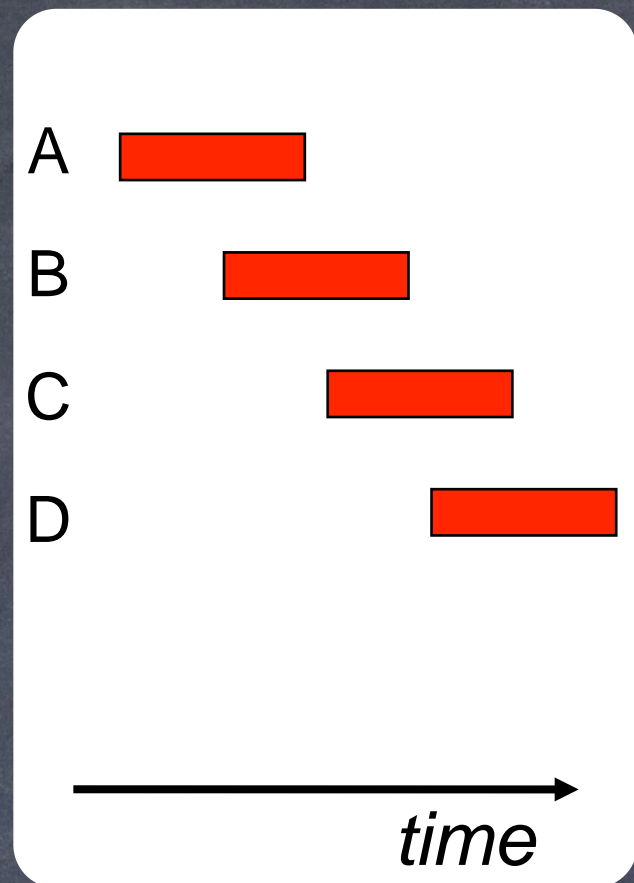
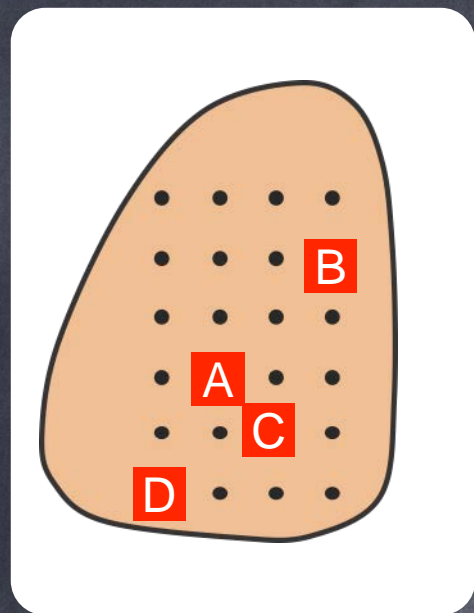


target

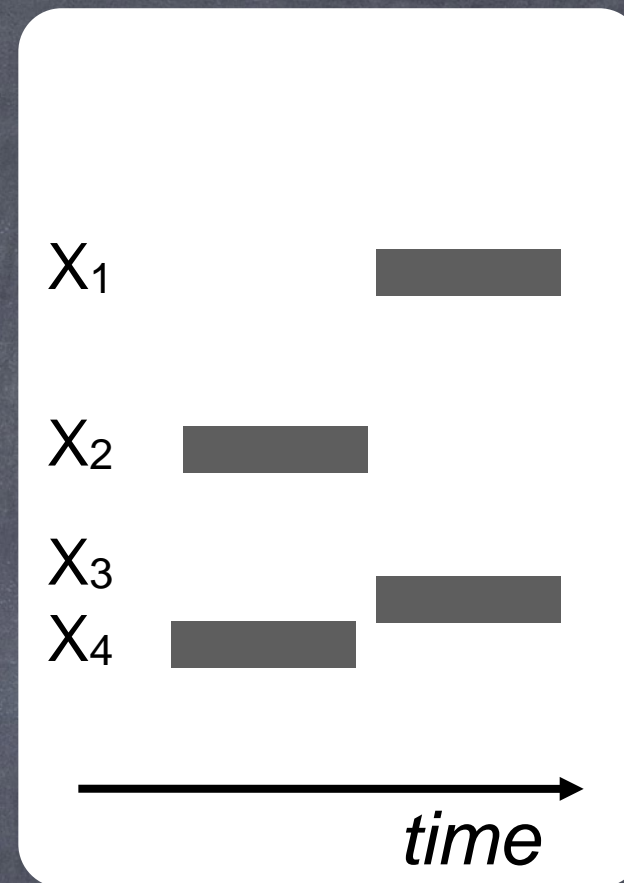
VS



non-target

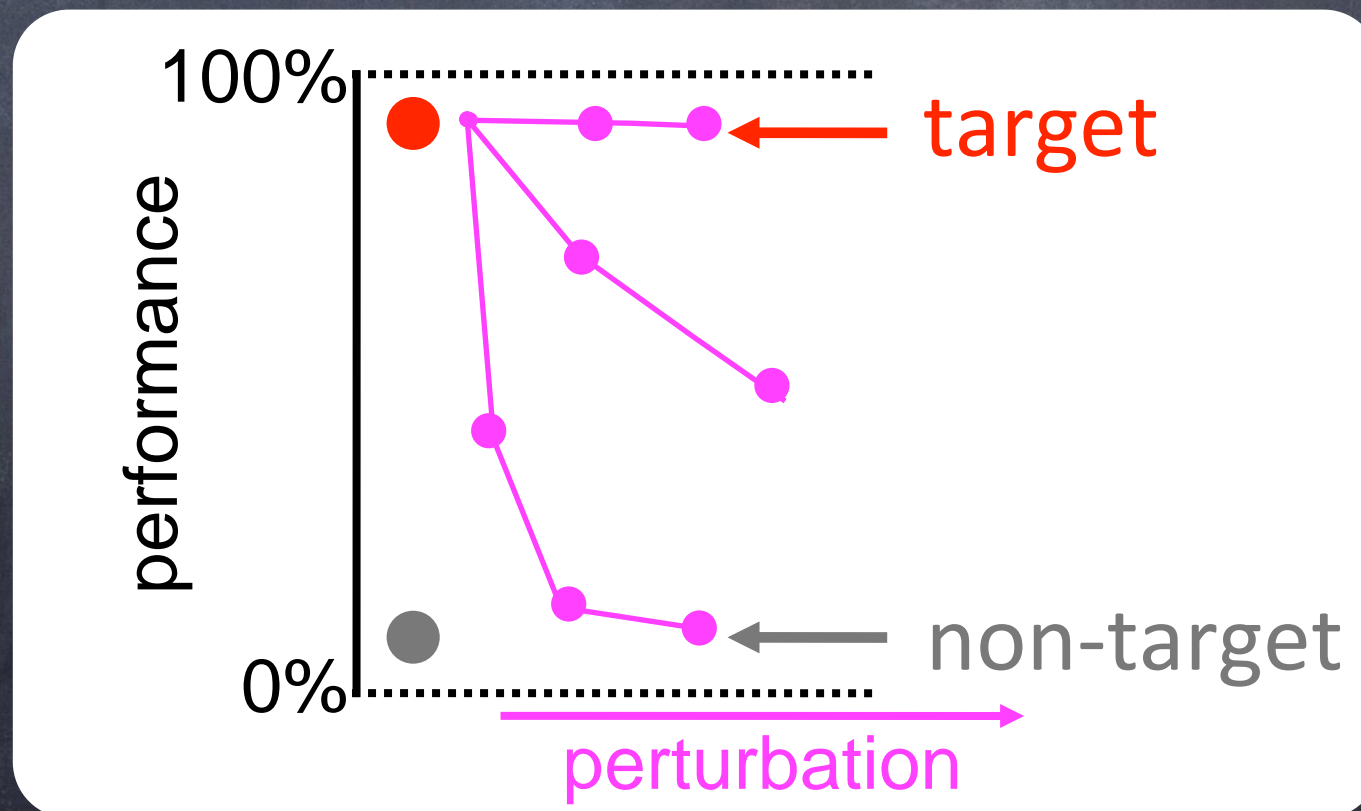


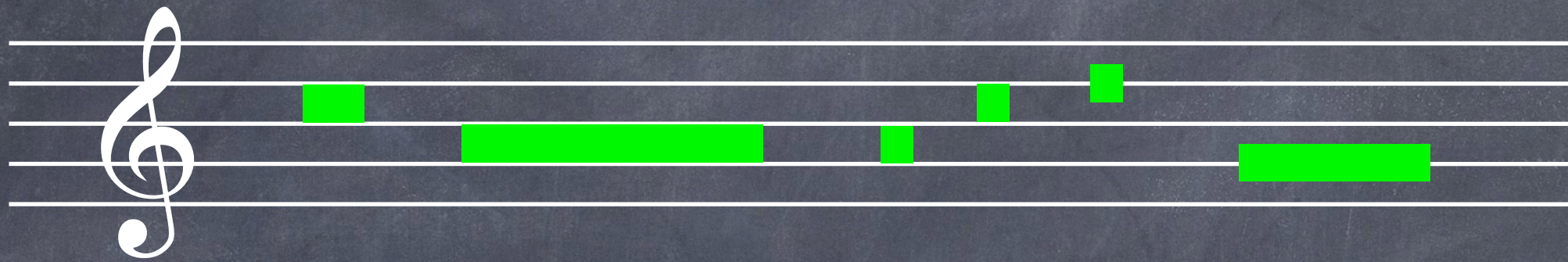
VS



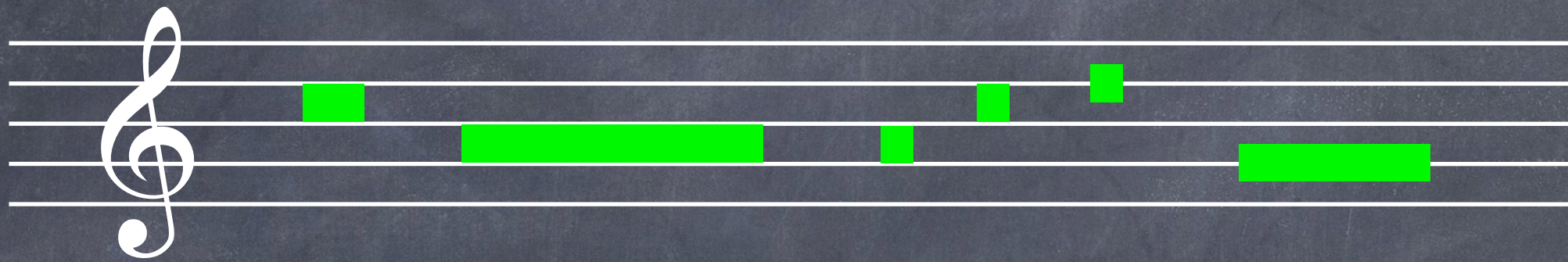
target

non-target

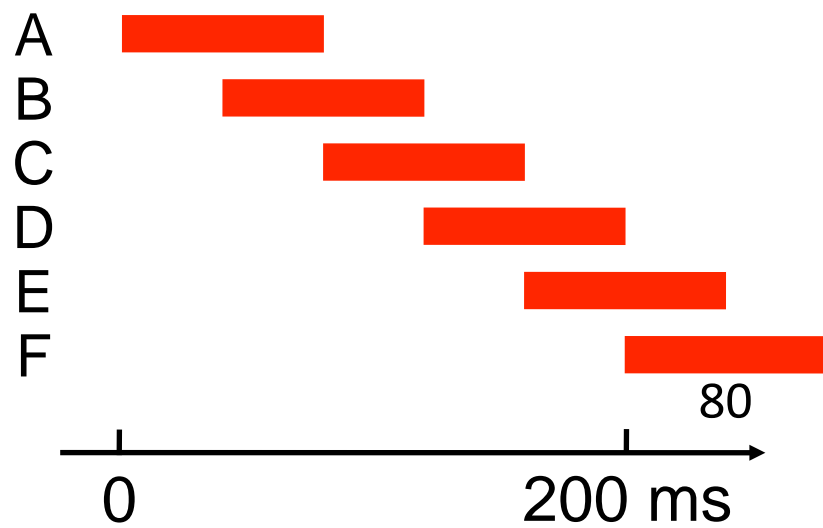
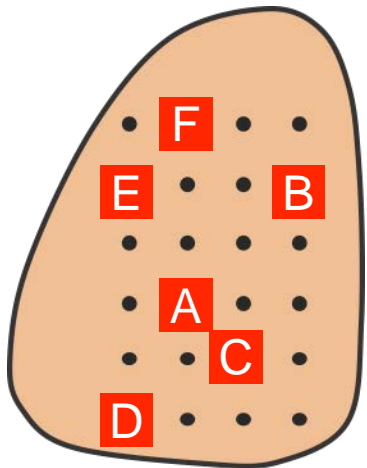




"Hey Jude"

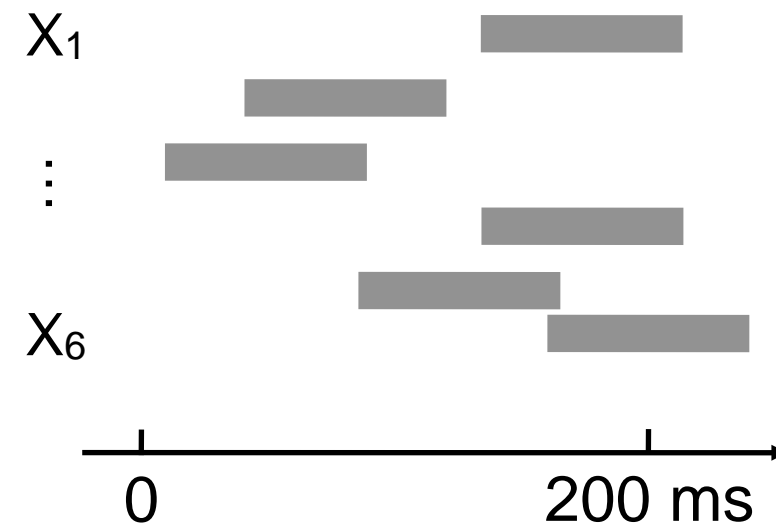


"Hey Jude"



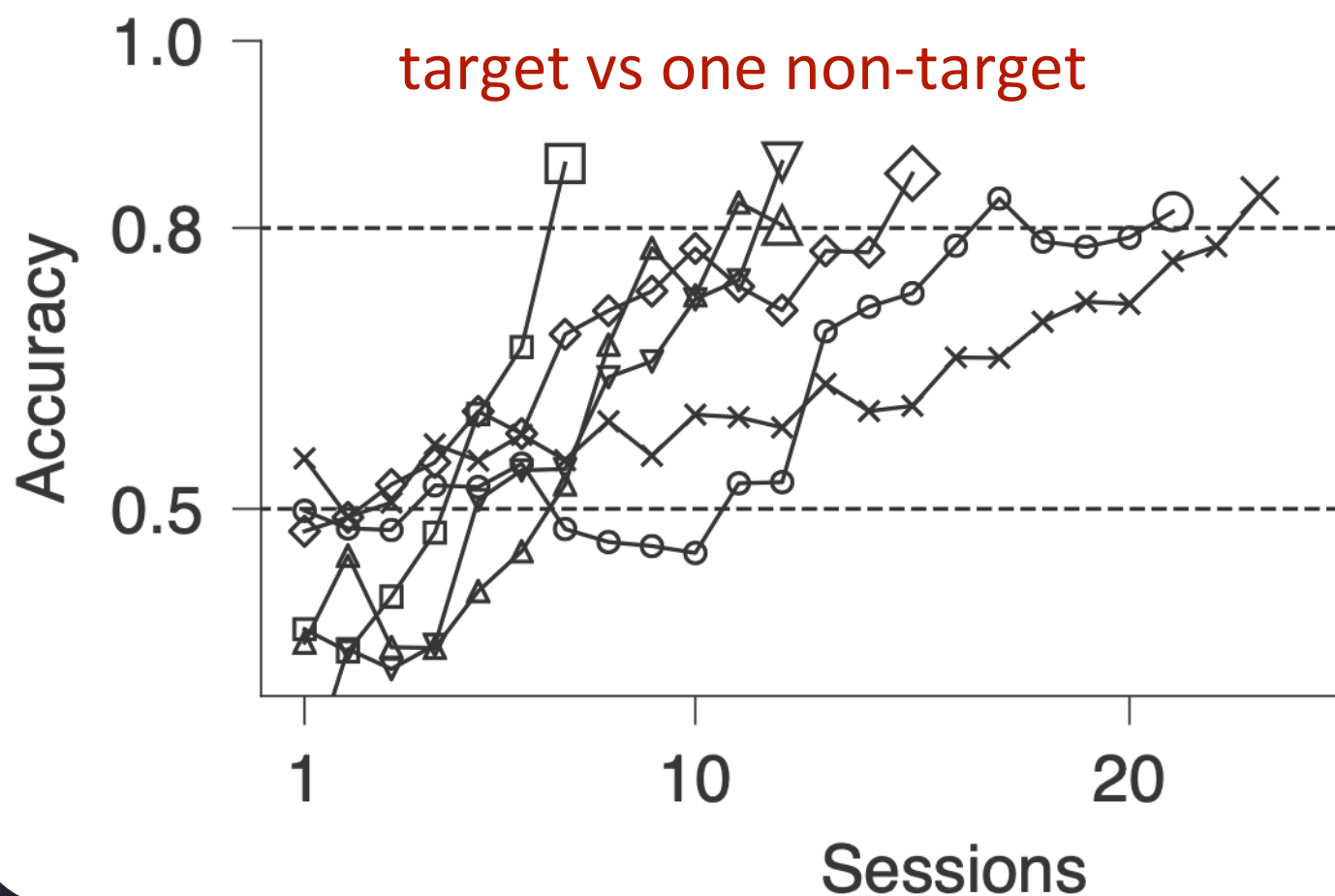
target

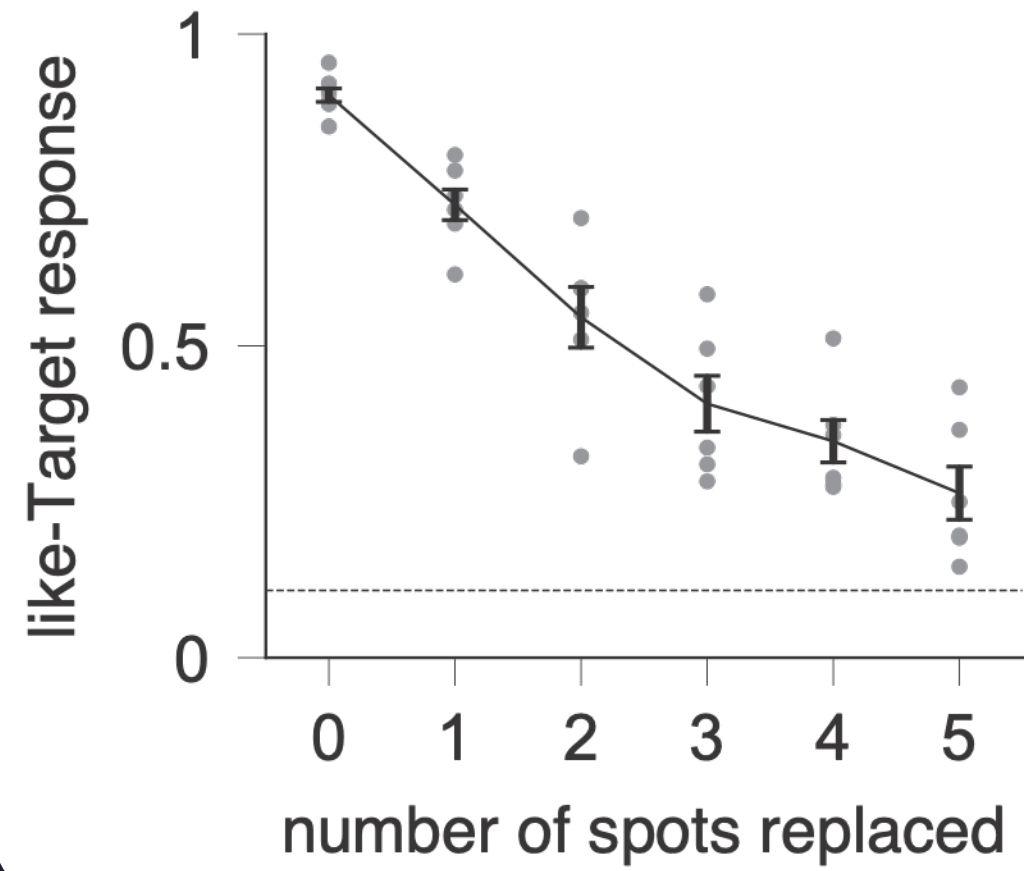
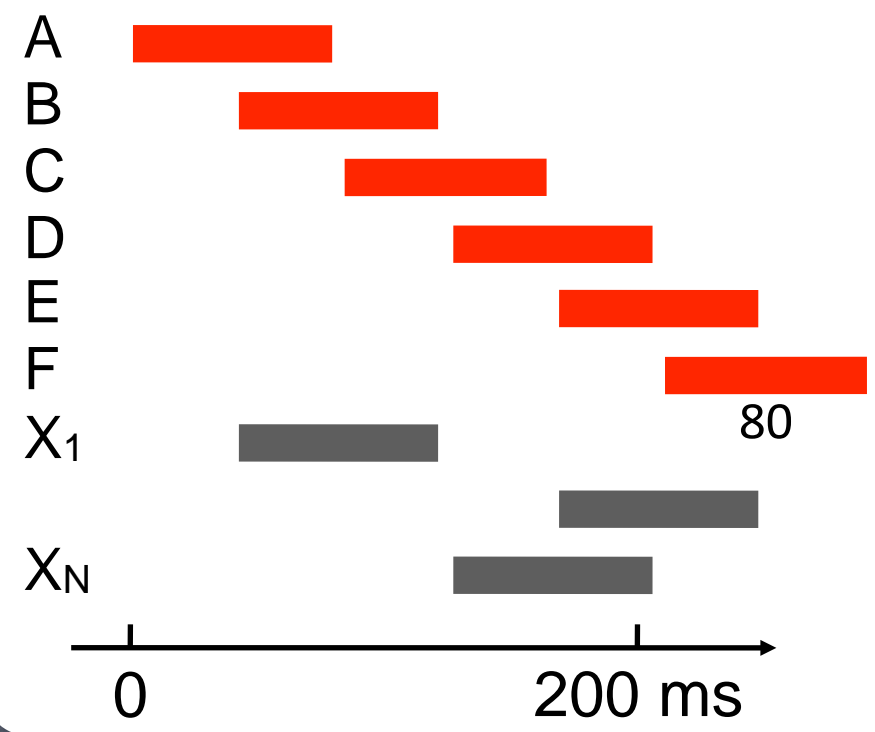
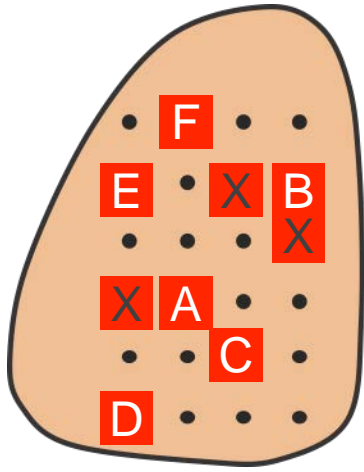
VS

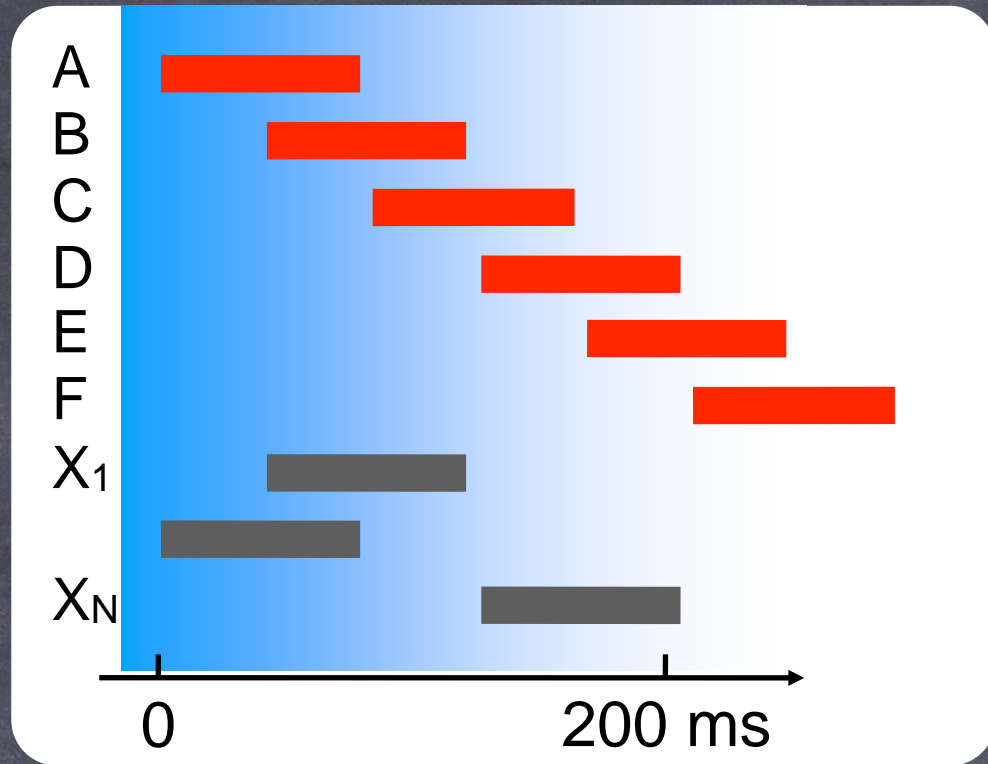
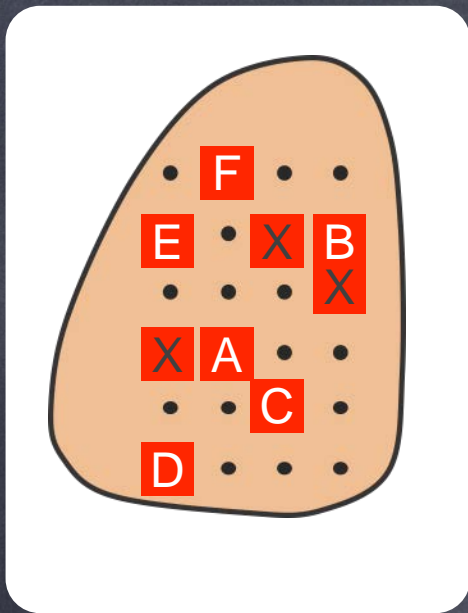


non-targets

learning curves

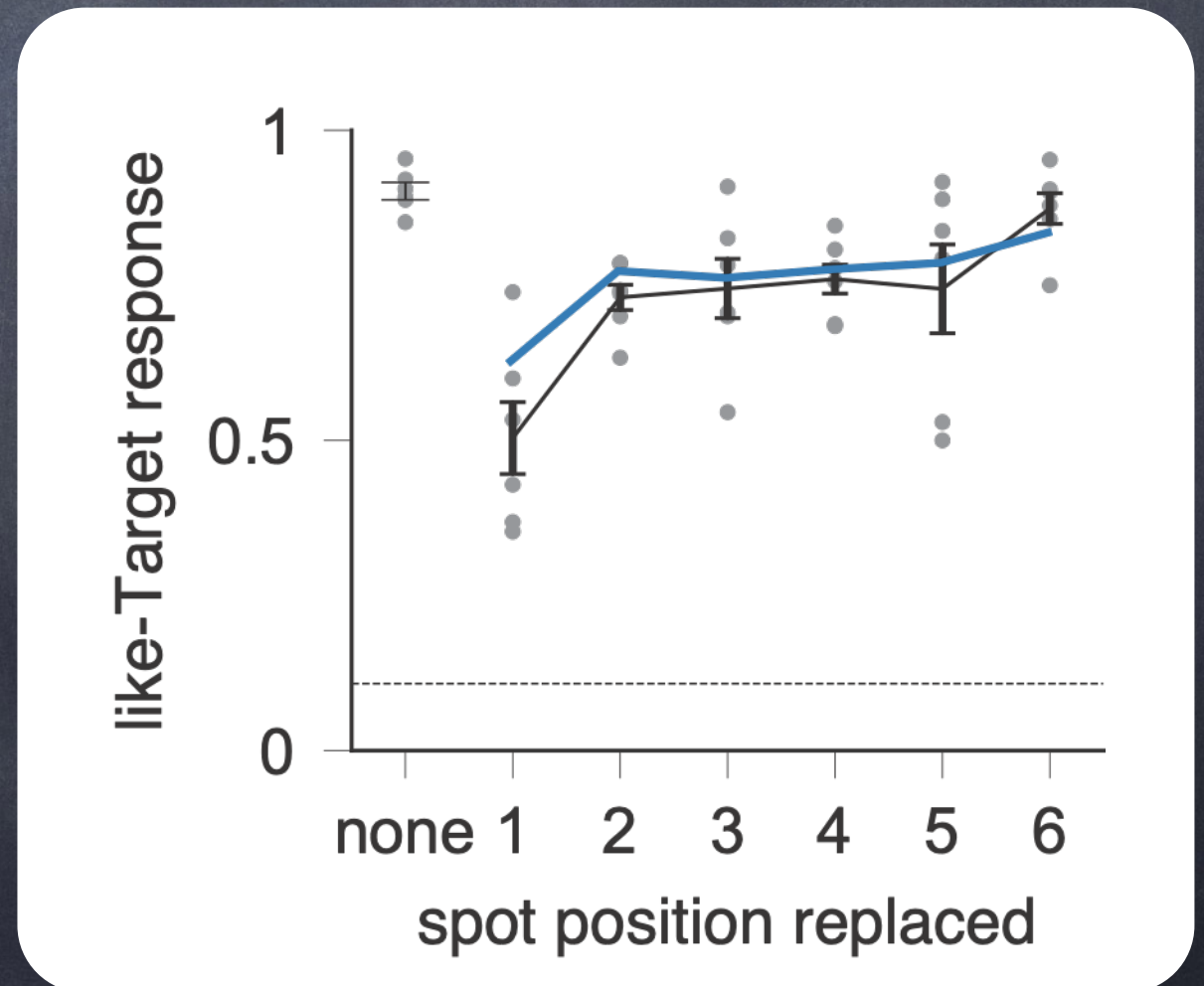
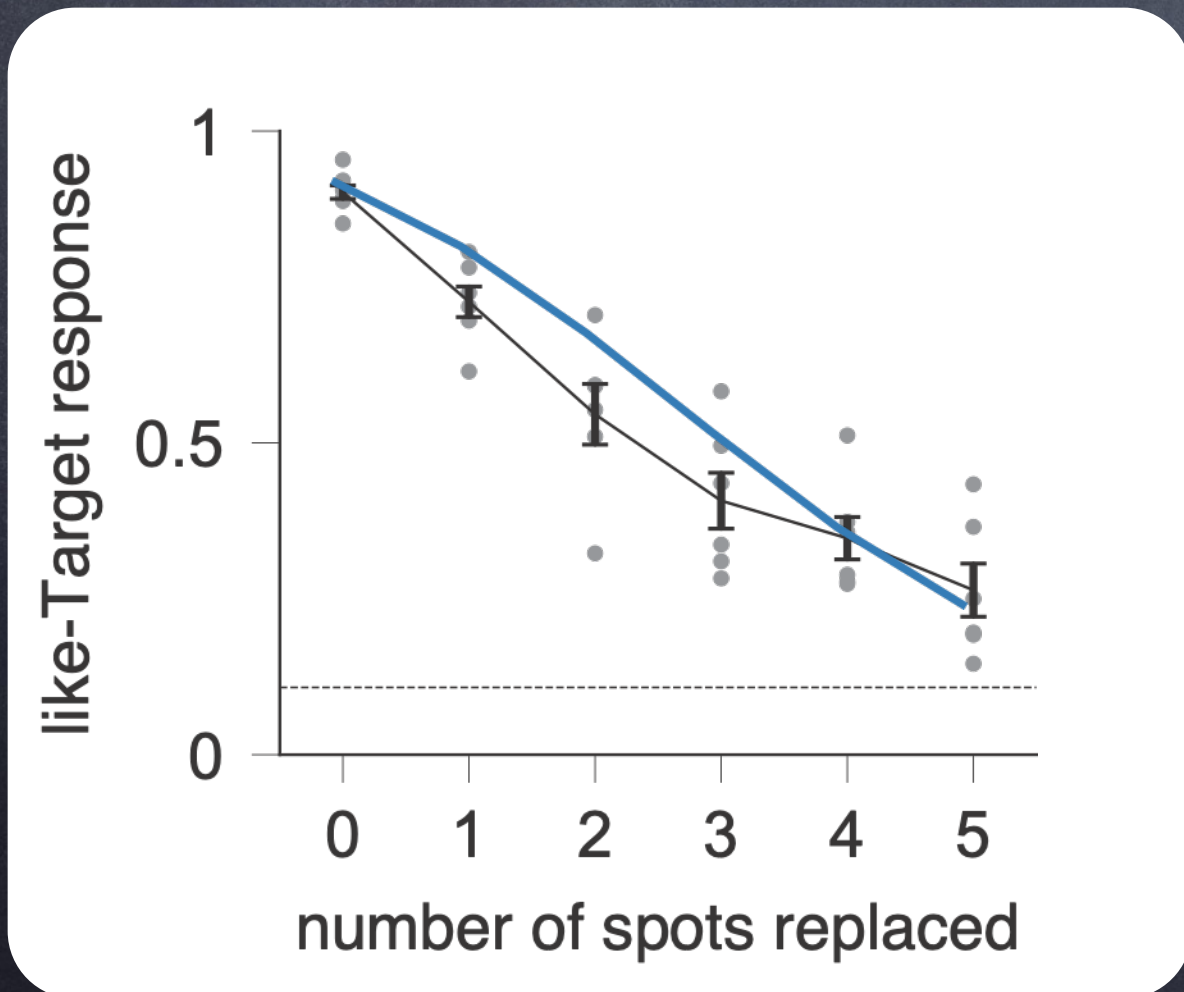


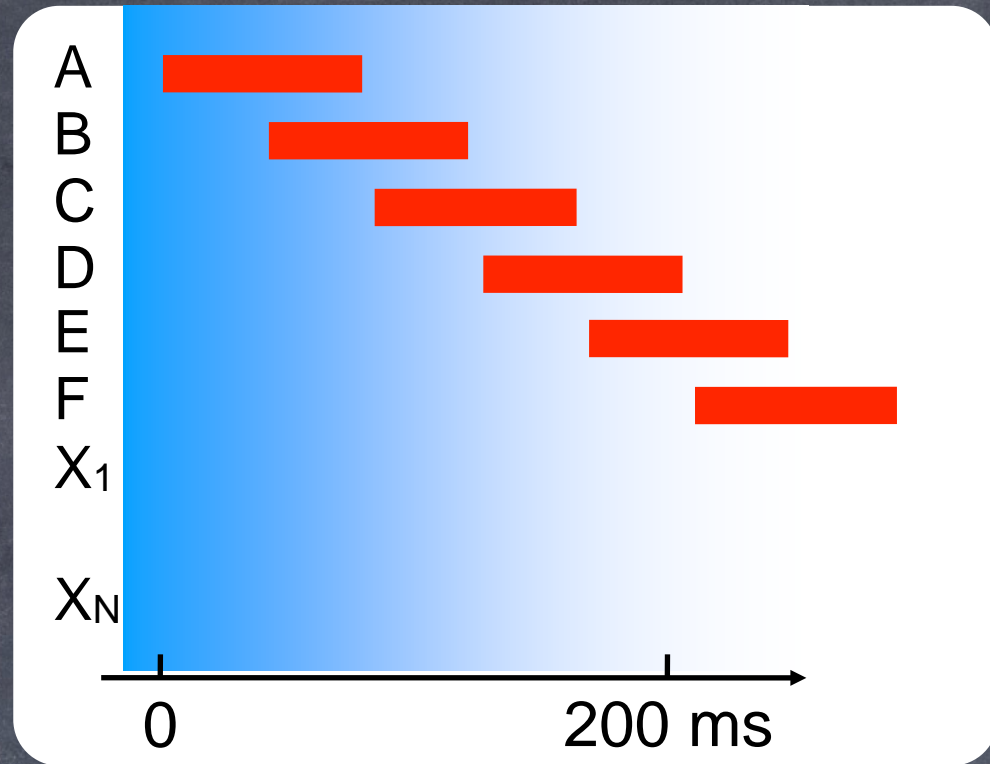
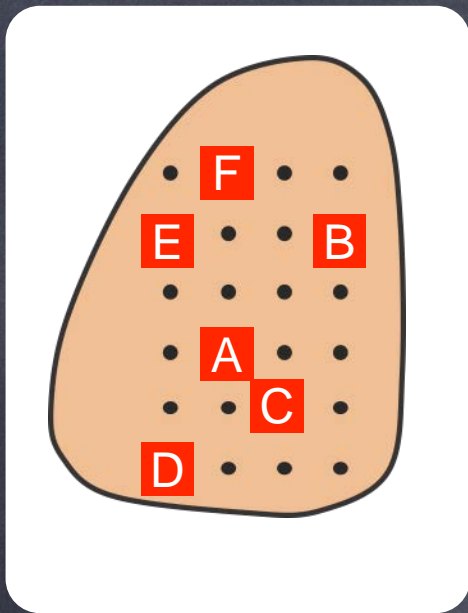




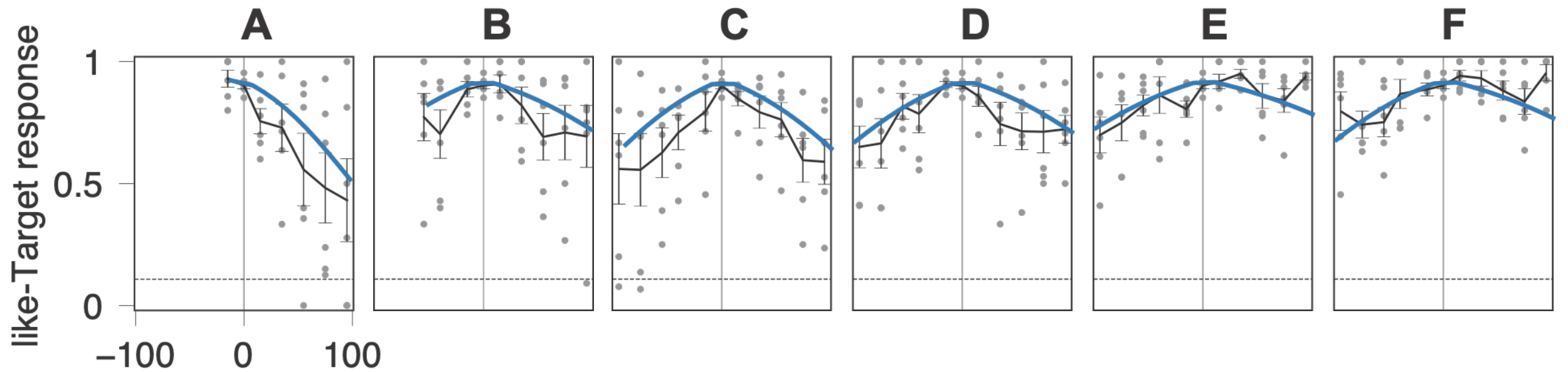
$$x_i = \begin{cases} 1, & \text{replace} \\ 0, & \text{same} \end{cases}$$

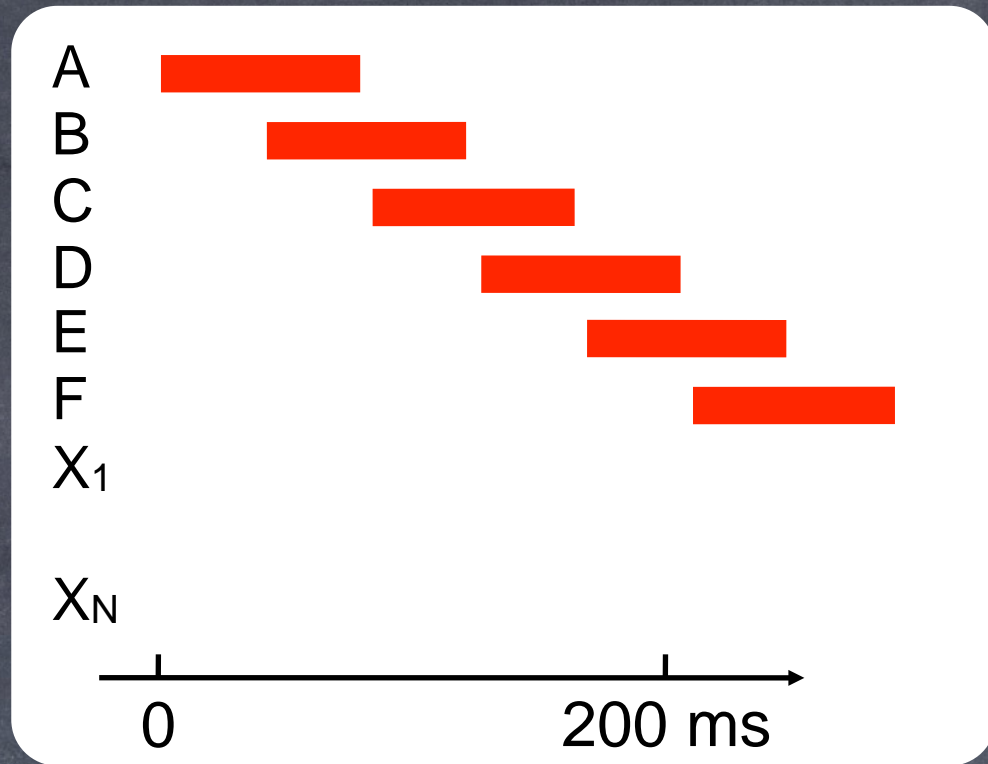
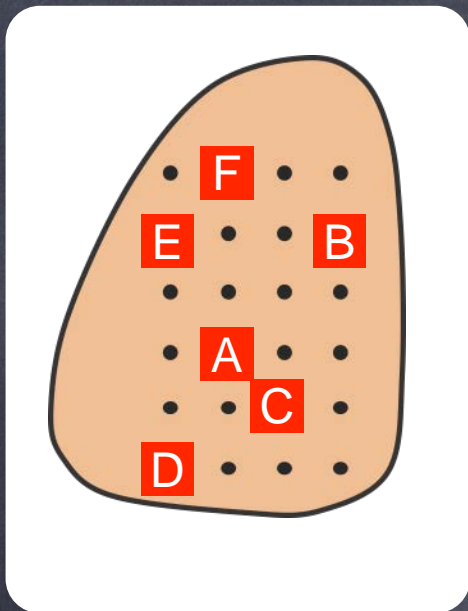
$$\text{logit}(p) = \beta_0 + \sum_i \beta_i x_i + \cancel{\sum_{i,j} \gamma_{ij} x_i x_j}$$



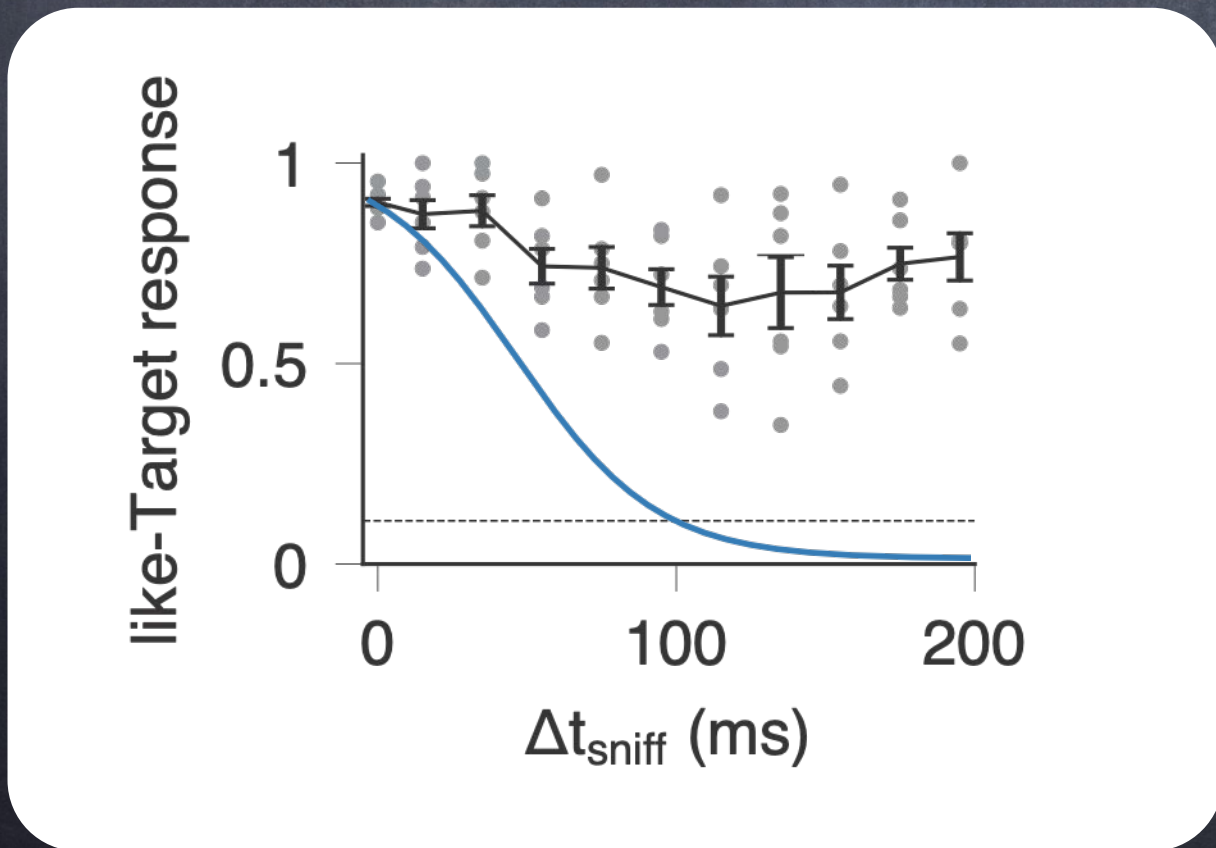


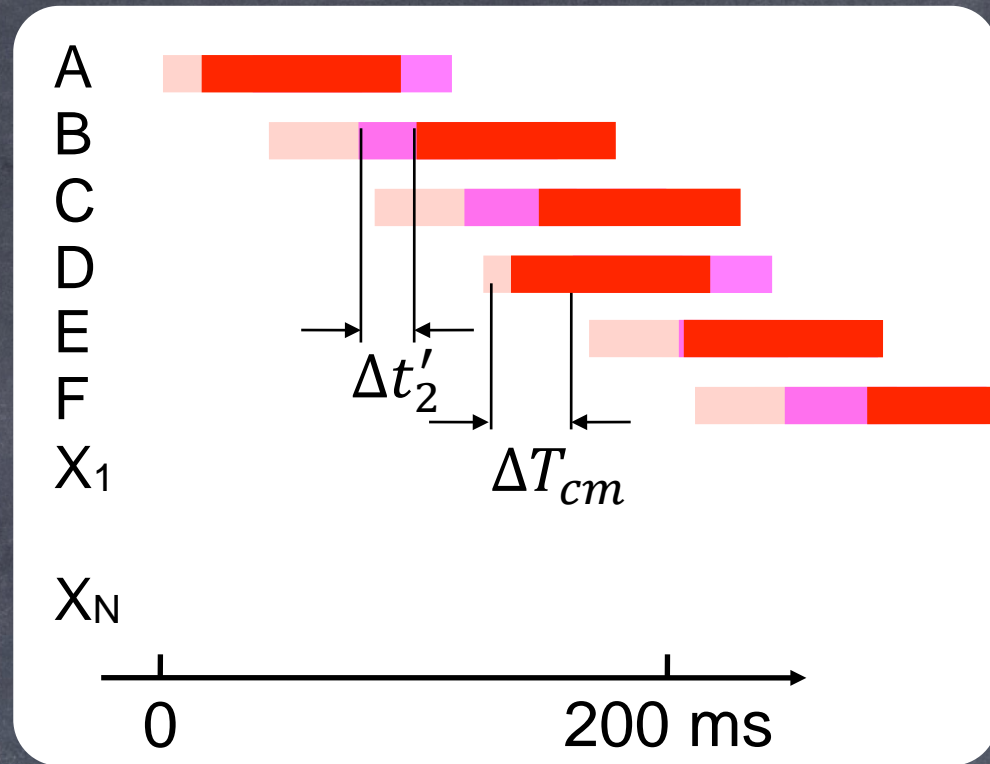
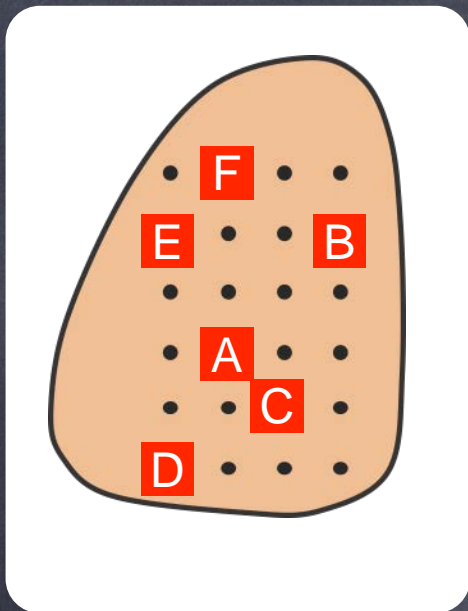
$$\log_{it}(p) = \beta_0 + \sum_{i, \Delta t_i > 0} \beta_i^+ |\Delta t_i| + \sum_{i, \Delta t_i < 0} \beta_i^- |\Delta t_i|$$





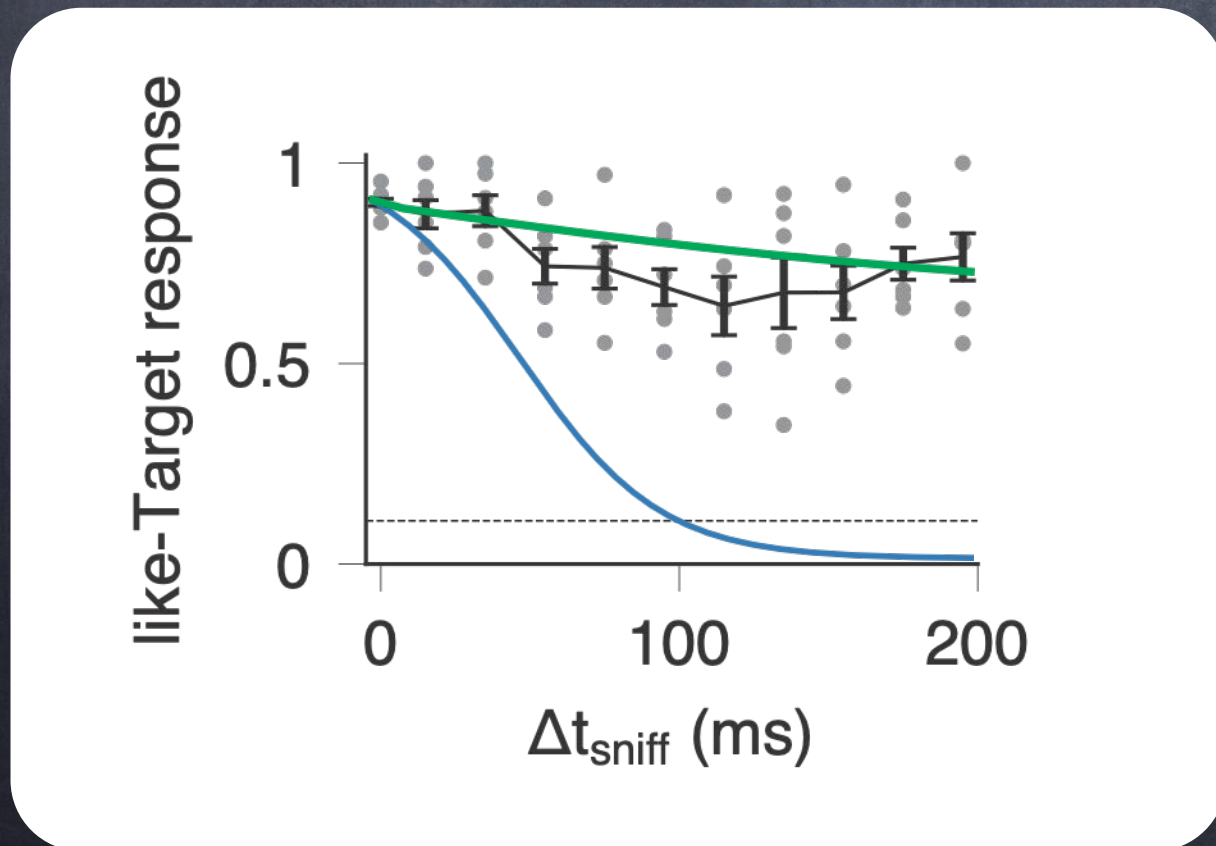
$$\log_{it}(p) = \beta_0 + \sum_{i, \Delta t_i > 0} \beta_i^+ |\Delta t_i| + \sum_{i, \Delta t_i < 0} \beta_i^- |\Delta t_i|$$

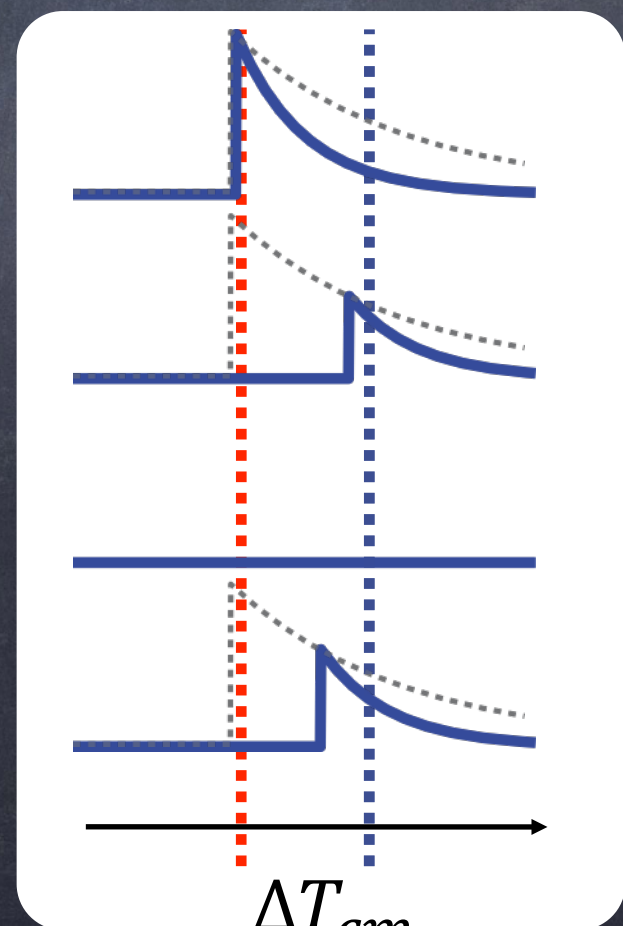
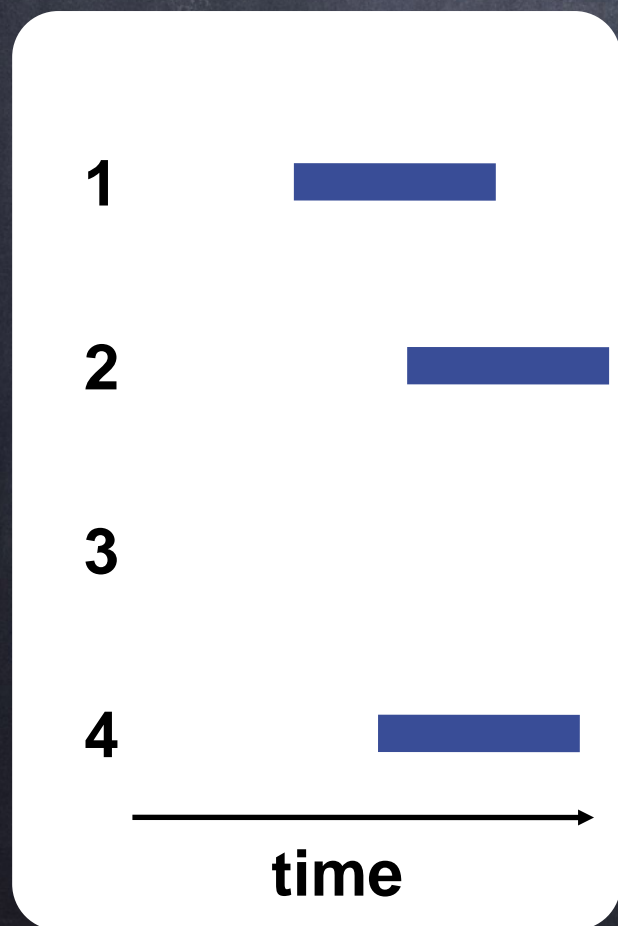
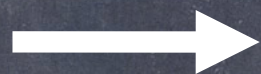
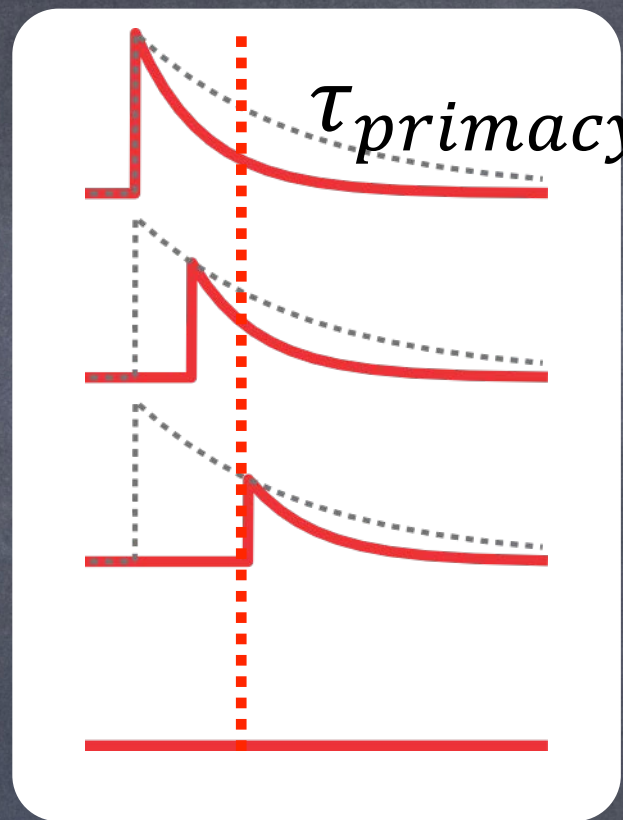




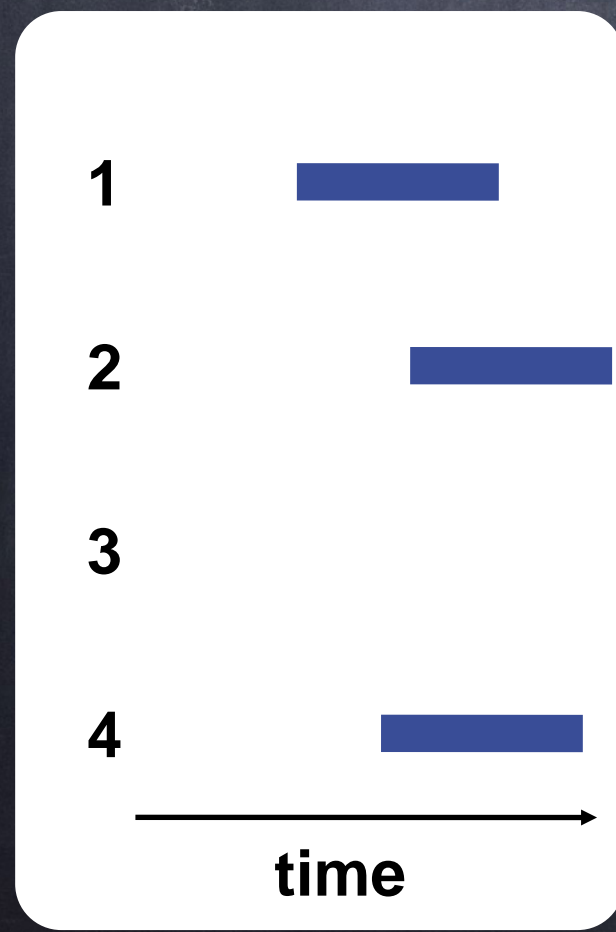
$$\Delta t_i = \Delta T_{cm} + \Delta t'_i$$

$$\log_{it}(p) = \beta_0 + \beta_{cm} \Delta T_{cm} + \sum_{i, \Delta t'_i > 0} \beta_i^+ |\Delta t'_i| + \sum_{i, \Delta t'_i < 0} \beta_i^- |\Delta t'_i|$$

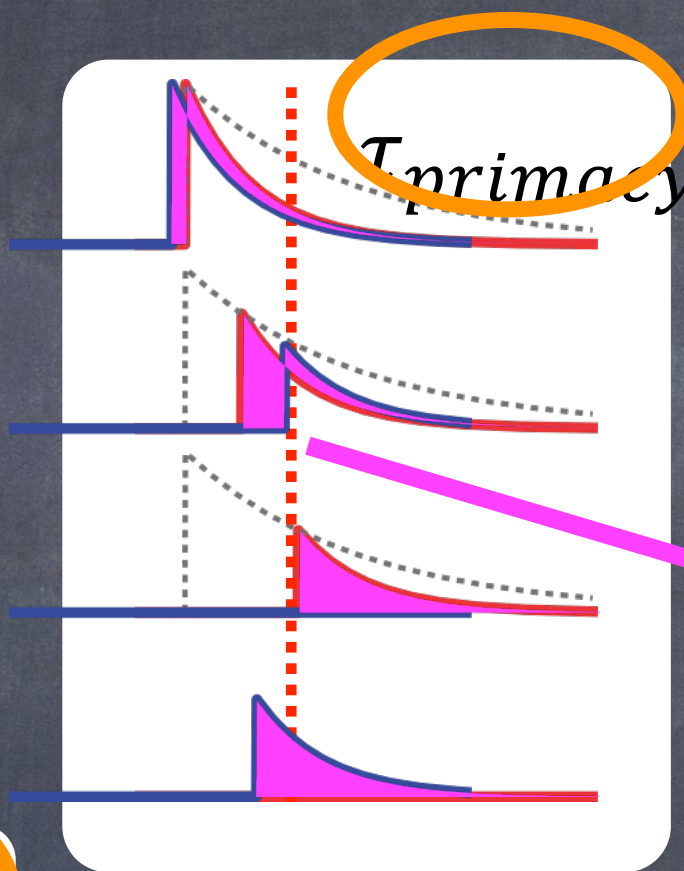




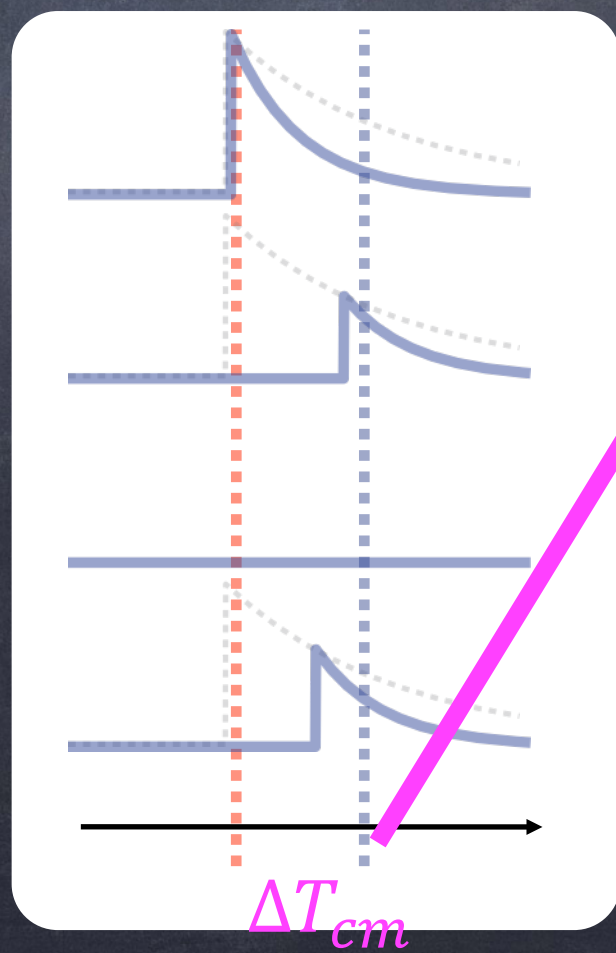
Spatio-Temporal Template Matching Model



τ_{act}



$$S \cdot \beta_S$$

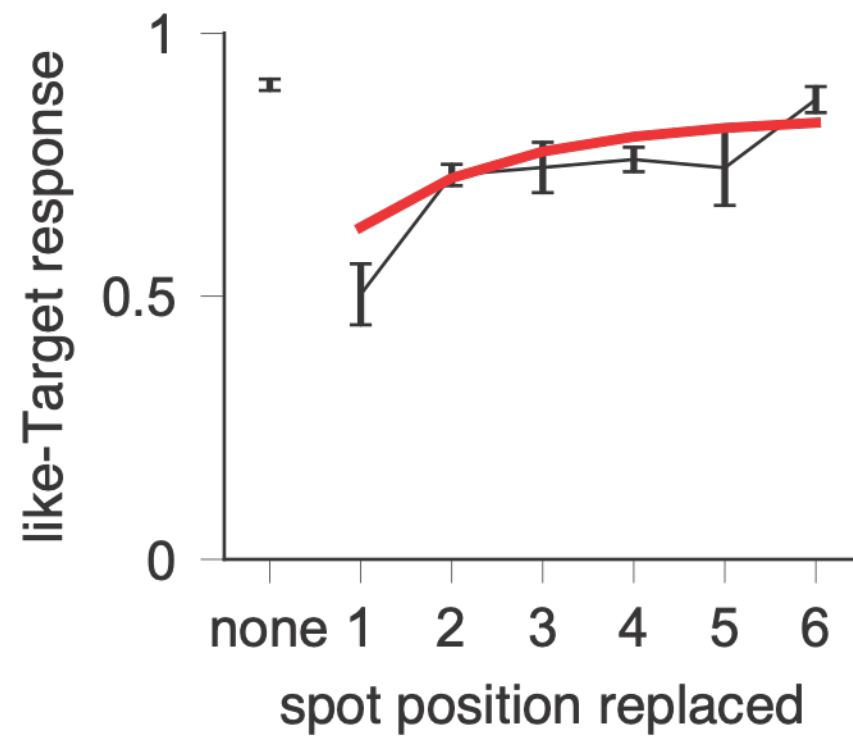
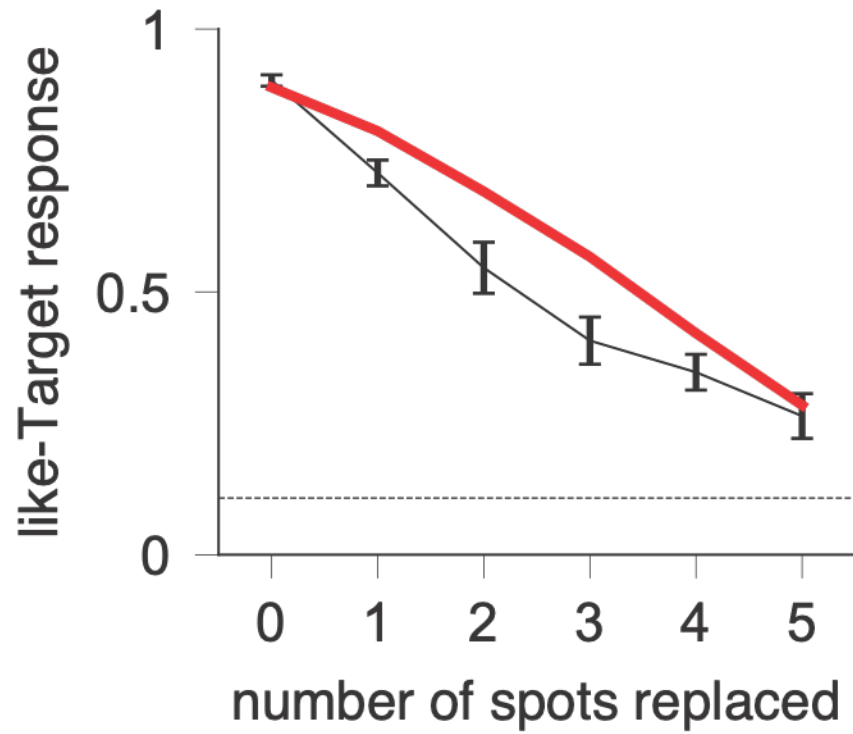


$$\exp\left(-\frac{\Delta T_{cm}}{\tau_{cm}}\right) \cdot \beta_{cm}$$

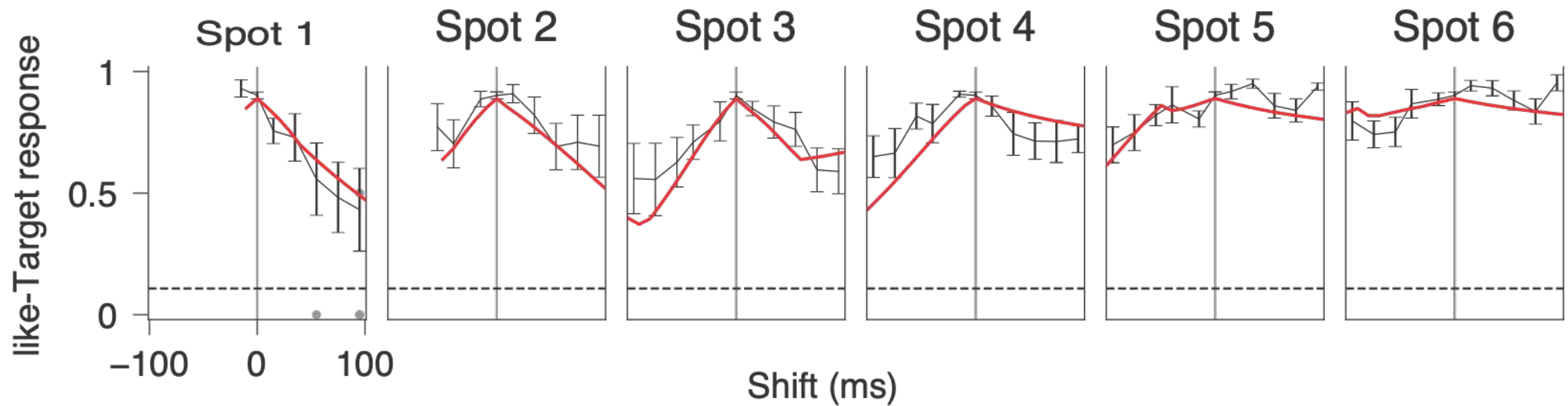
Σ

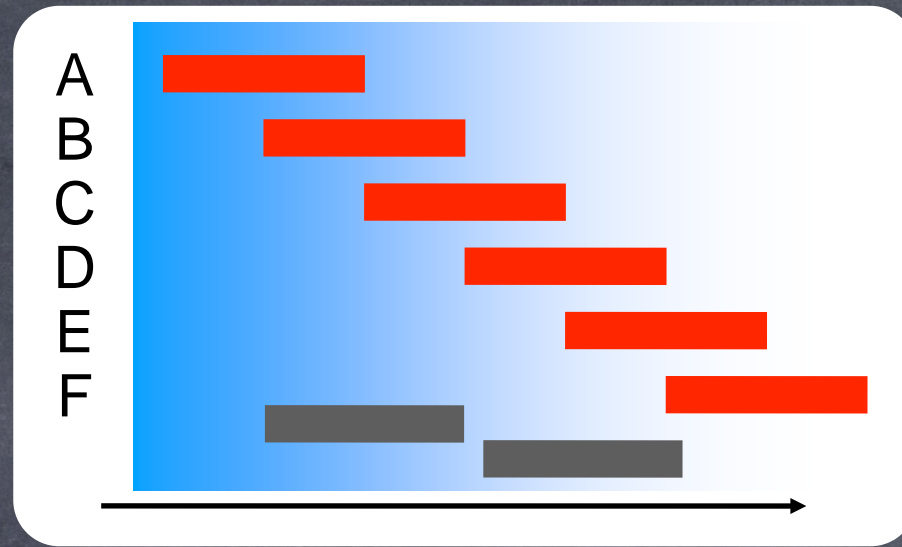
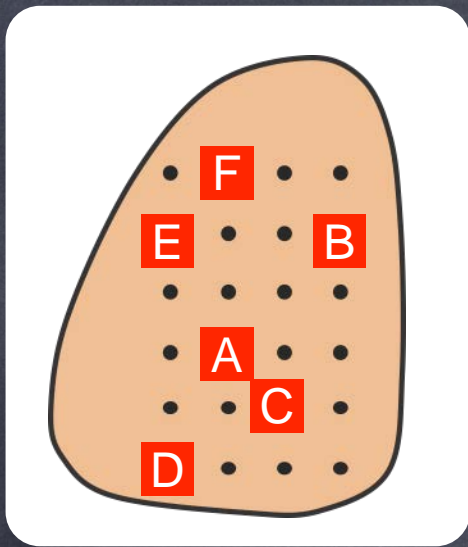
Perceptual distance

Spatial perturbations



Temporal perturbations

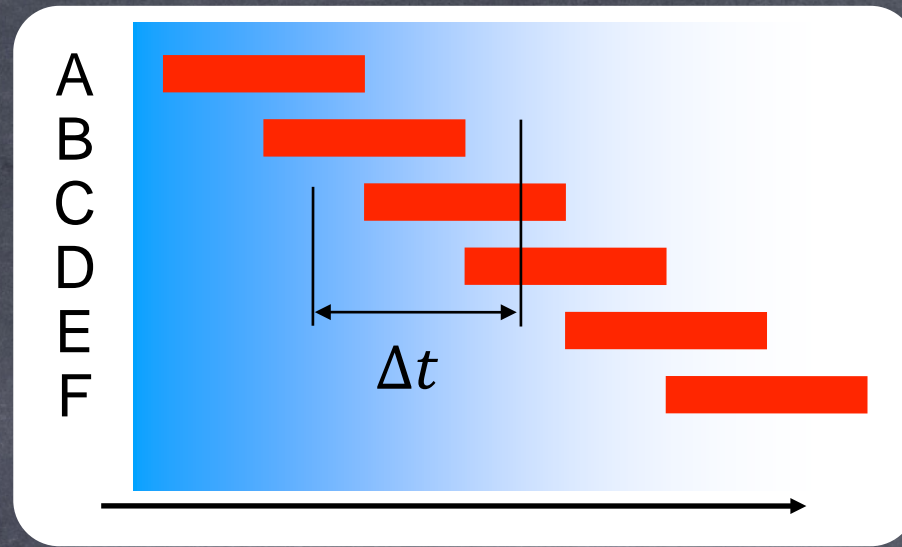
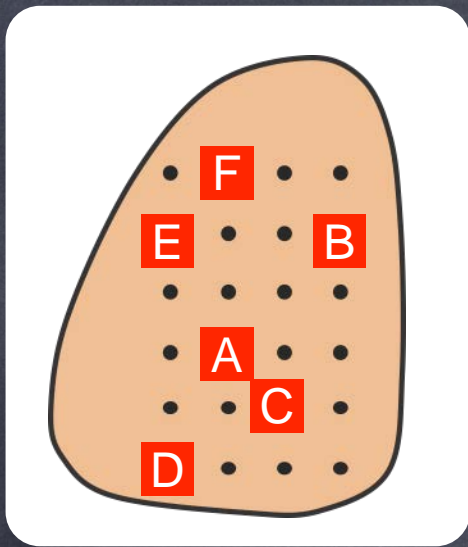




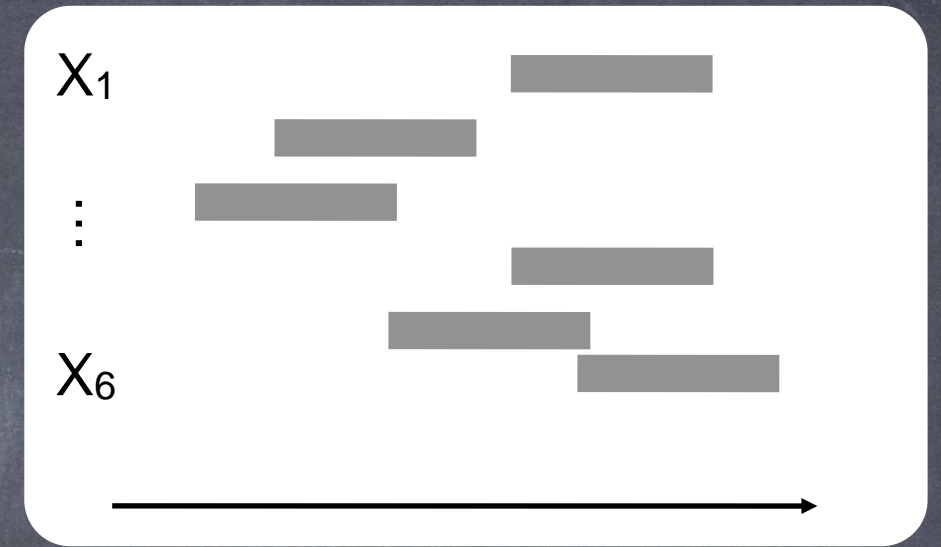
VS



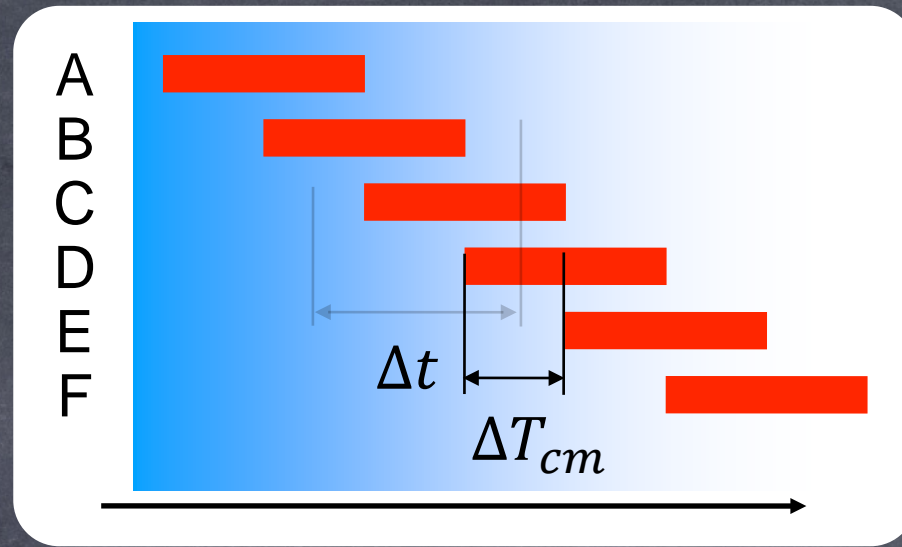
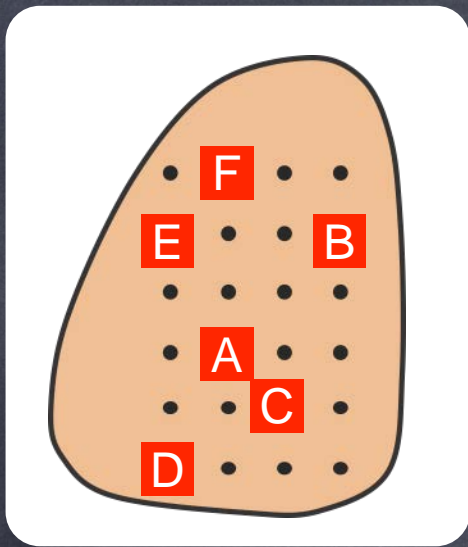
- Earlier spots are more relevant than later - Primacy effect
- Spatial channels are independent



VS



- Earlier spots are more relevant than later - Primacy effect
- Spatial channels are independent
- Strong sensitivity to relative timing

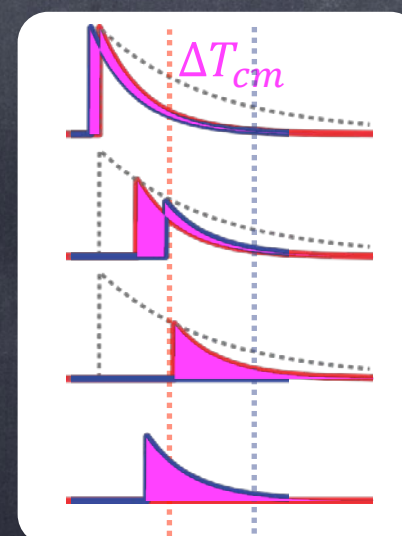


VS



- Earlier spots are more relevant than later - Primacy effect
- Spatial channels are independent
- Strong sensitivity to relative timing
- Weak sensitivity to the global shift relative to the sniff cycle

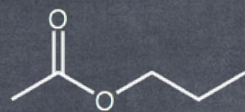
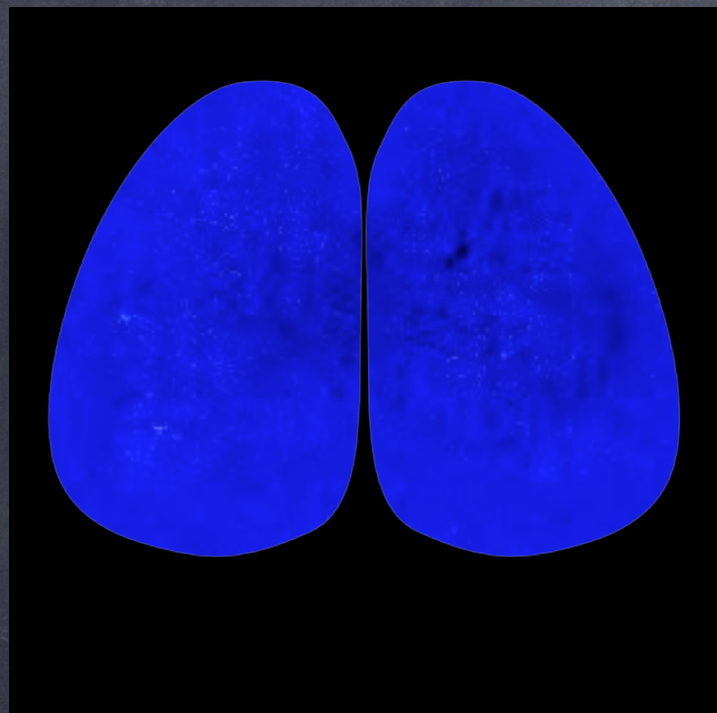
Spatio-Temporal
Template Matching
Model



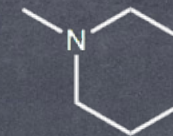
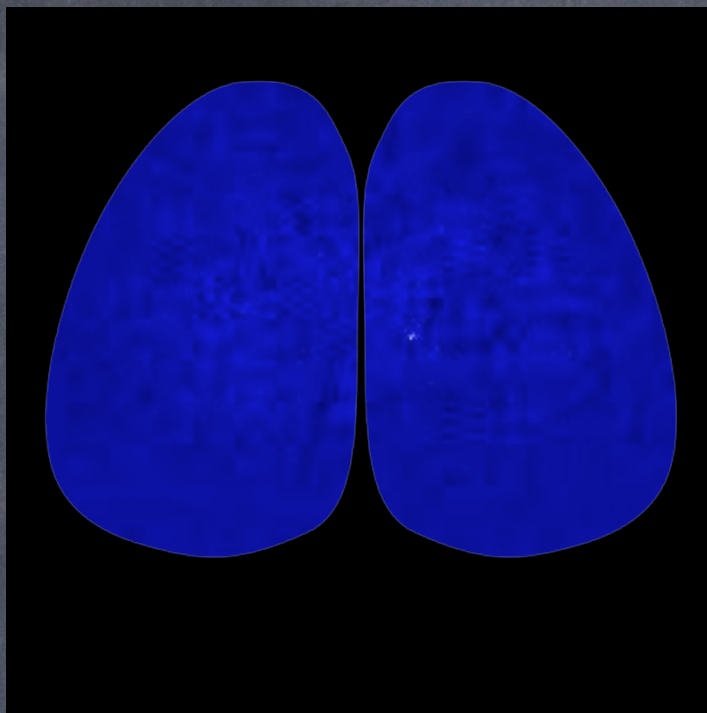
Perceptual
distance



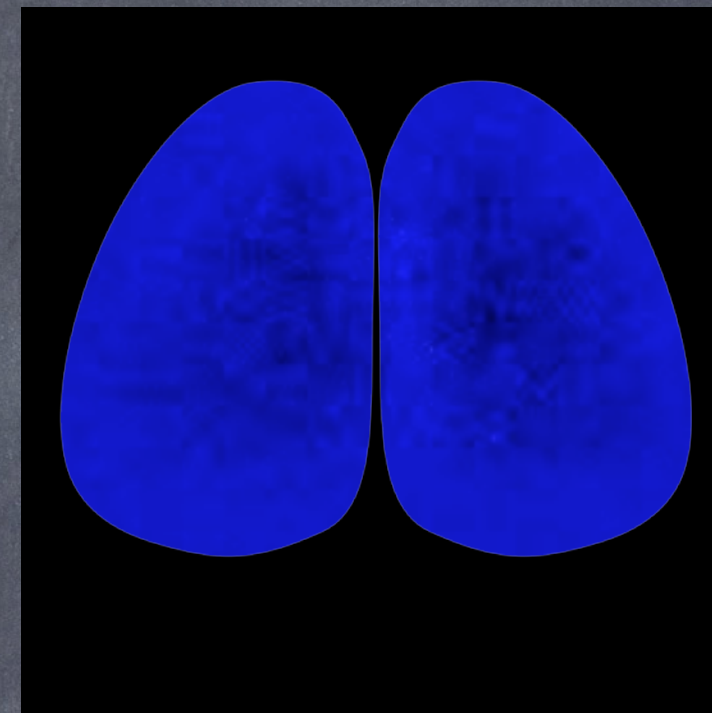
butanal



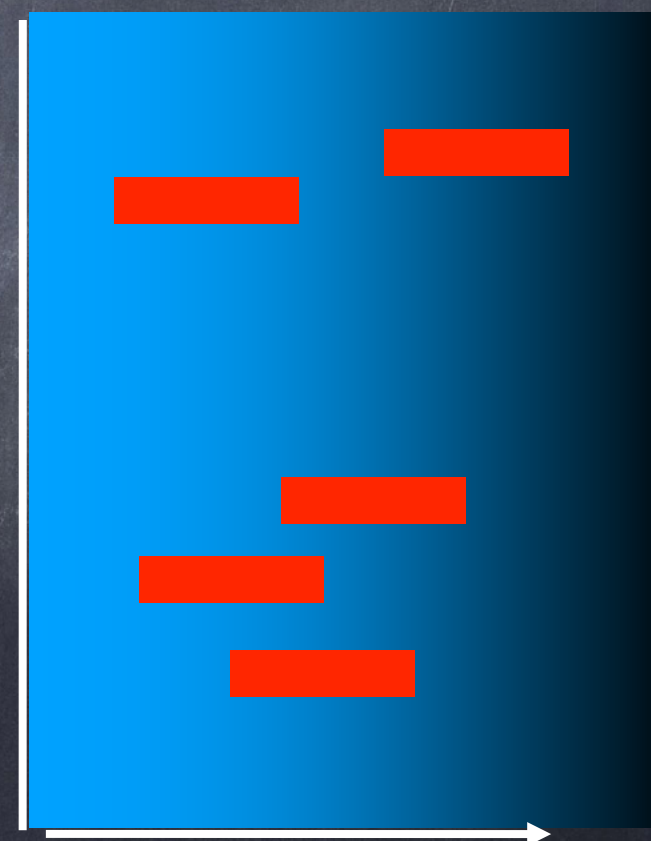
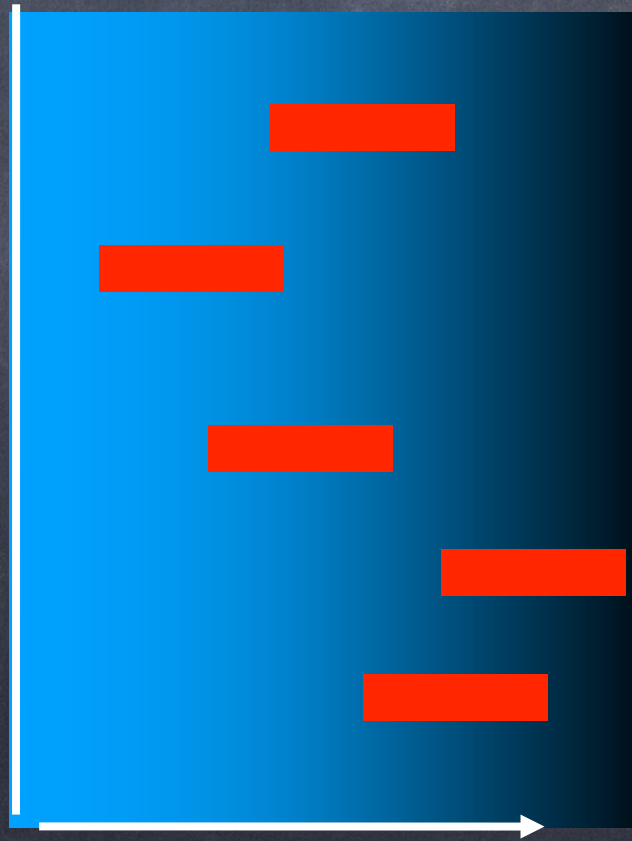
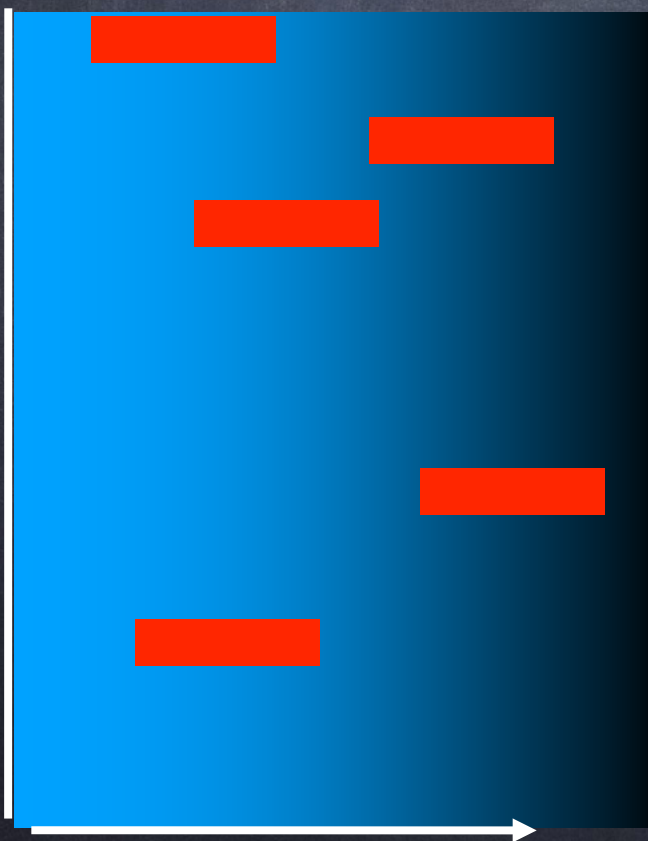
propylacetate



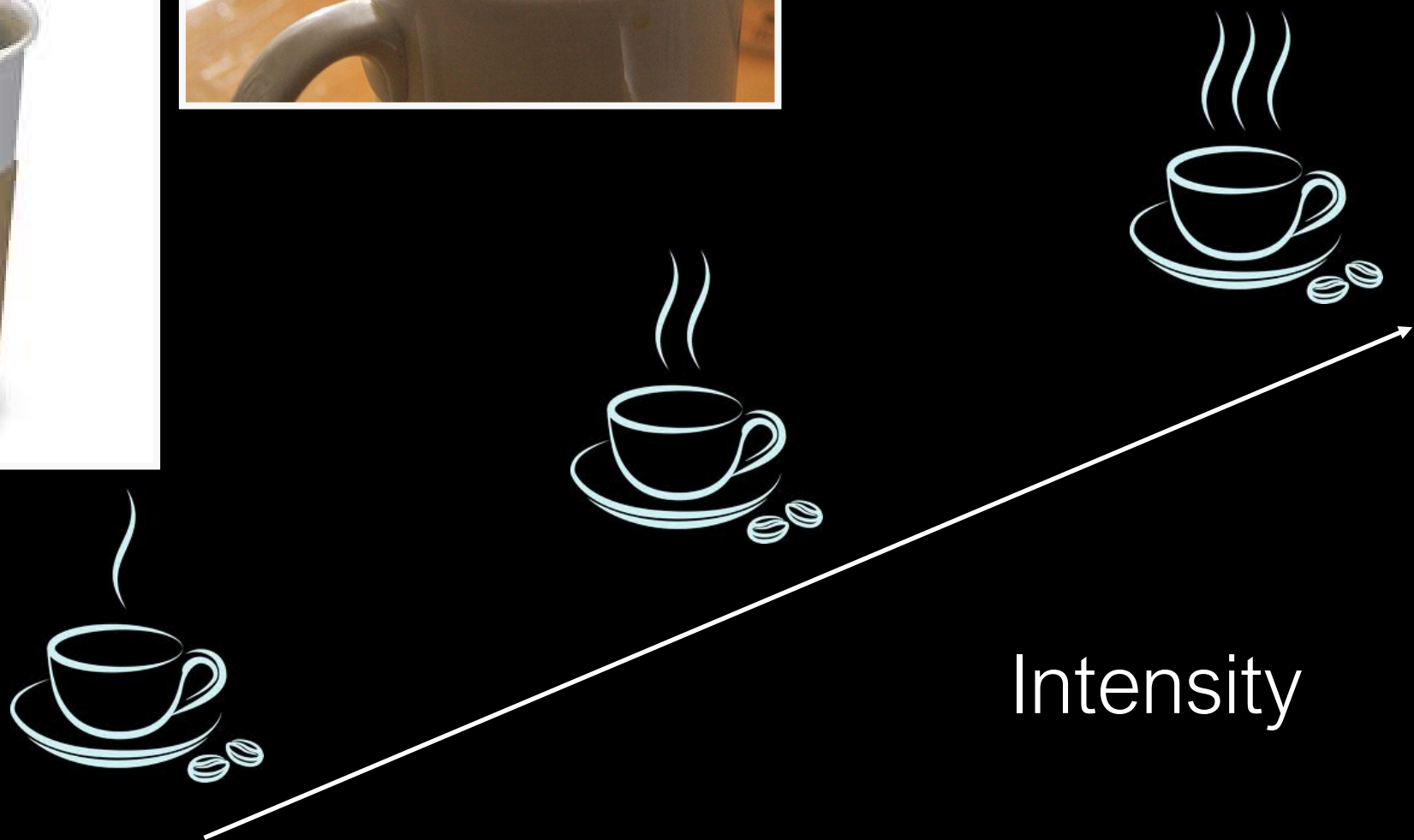
N-methylpiperidine



glomeruli

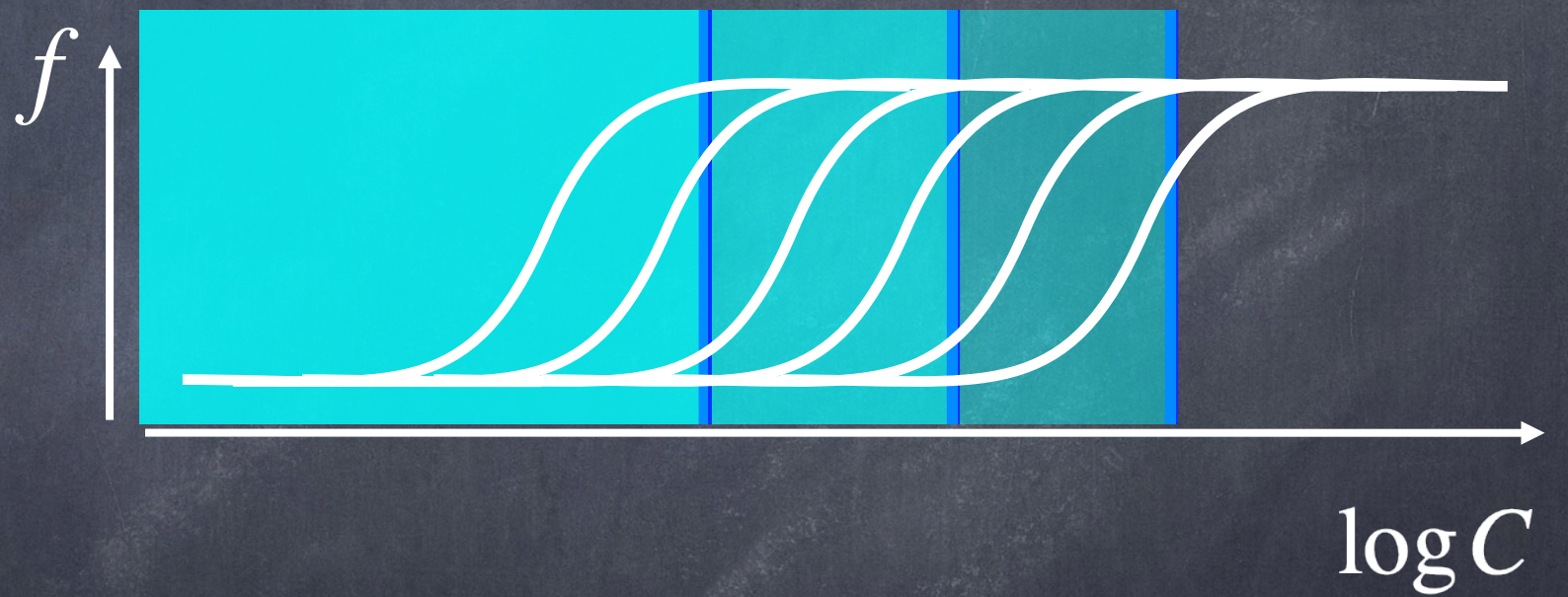
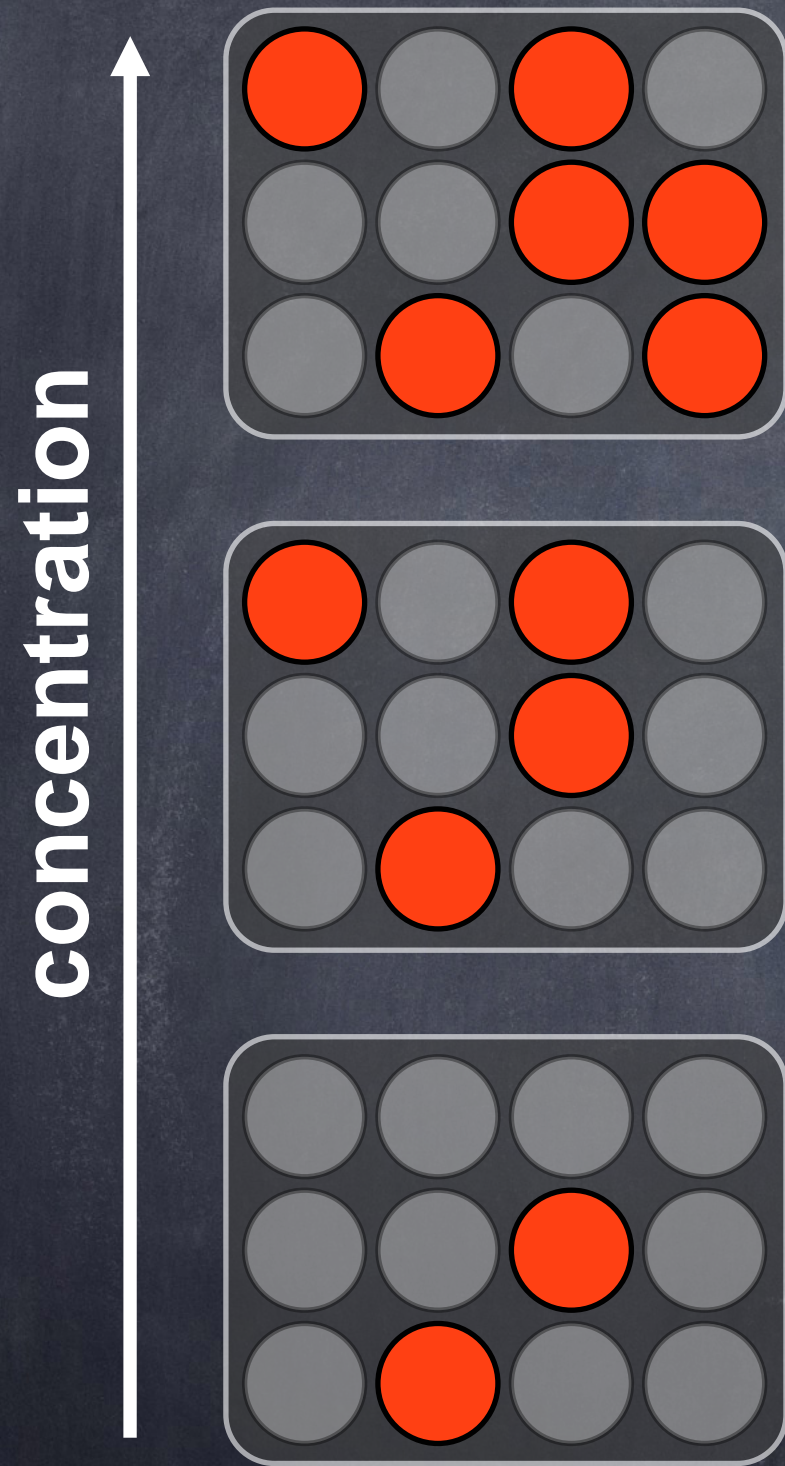


time

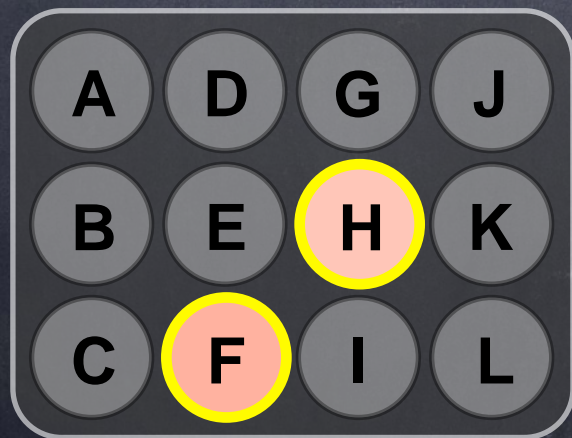
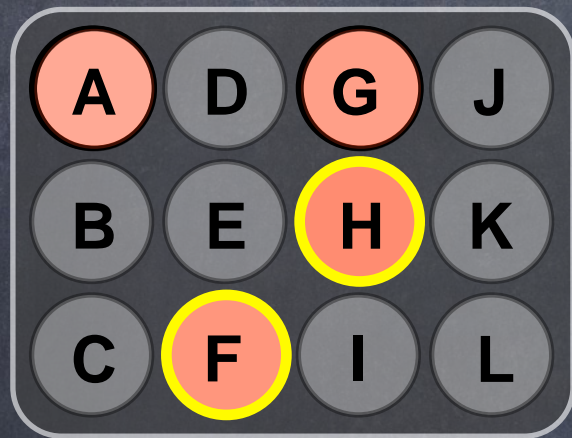
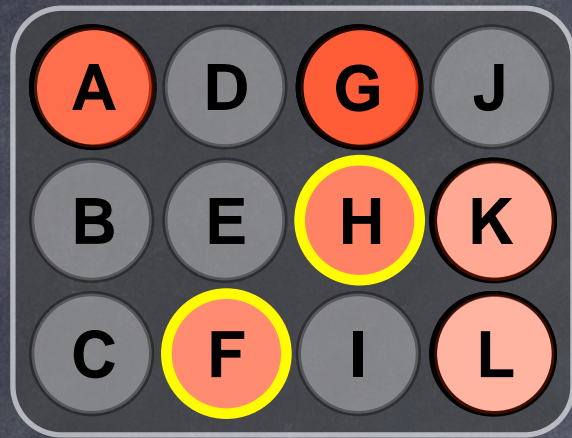


Intensity

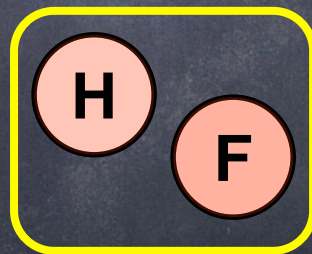
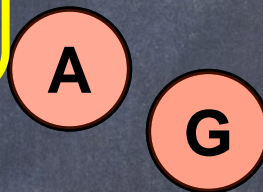
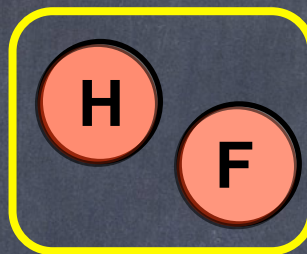
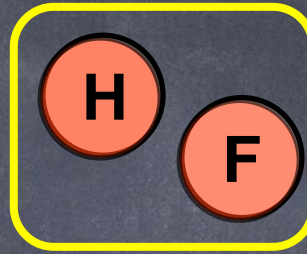
receptor ligand interaction



concentration



p



t_p



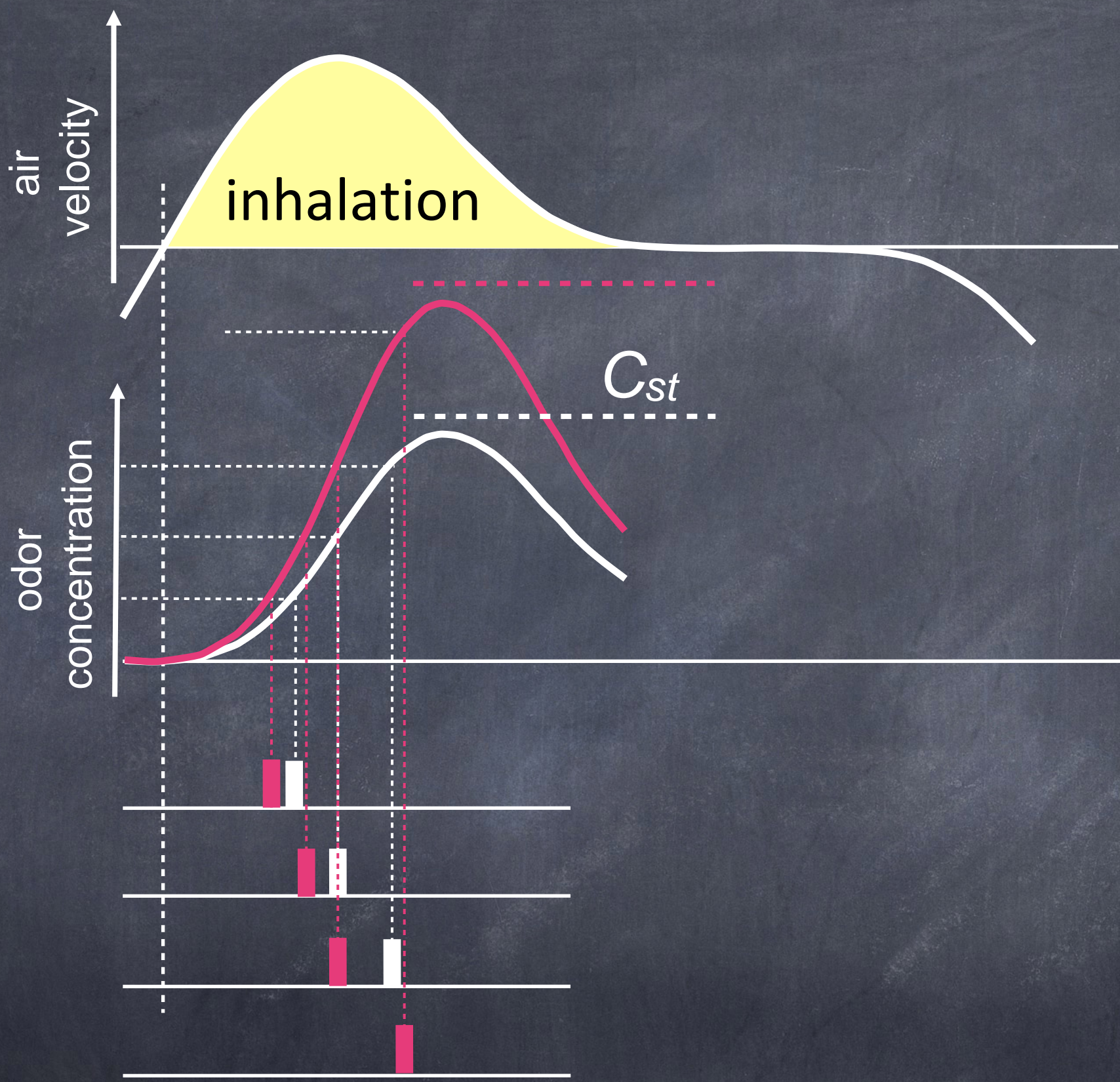
time

Primacy coding

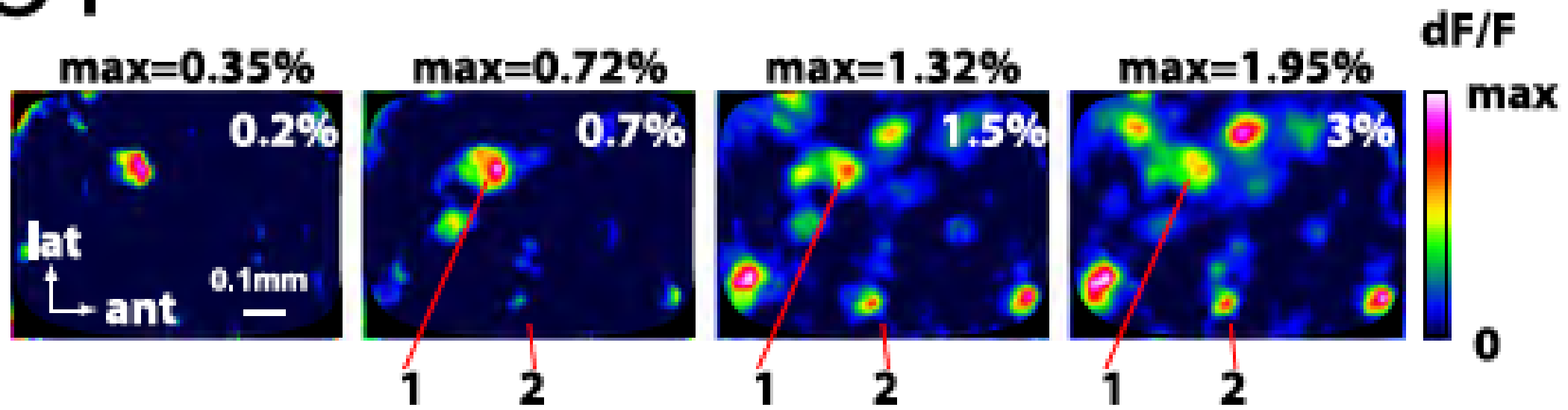
- concentration invariance

- neural mechanisms
- reading the code
- code features

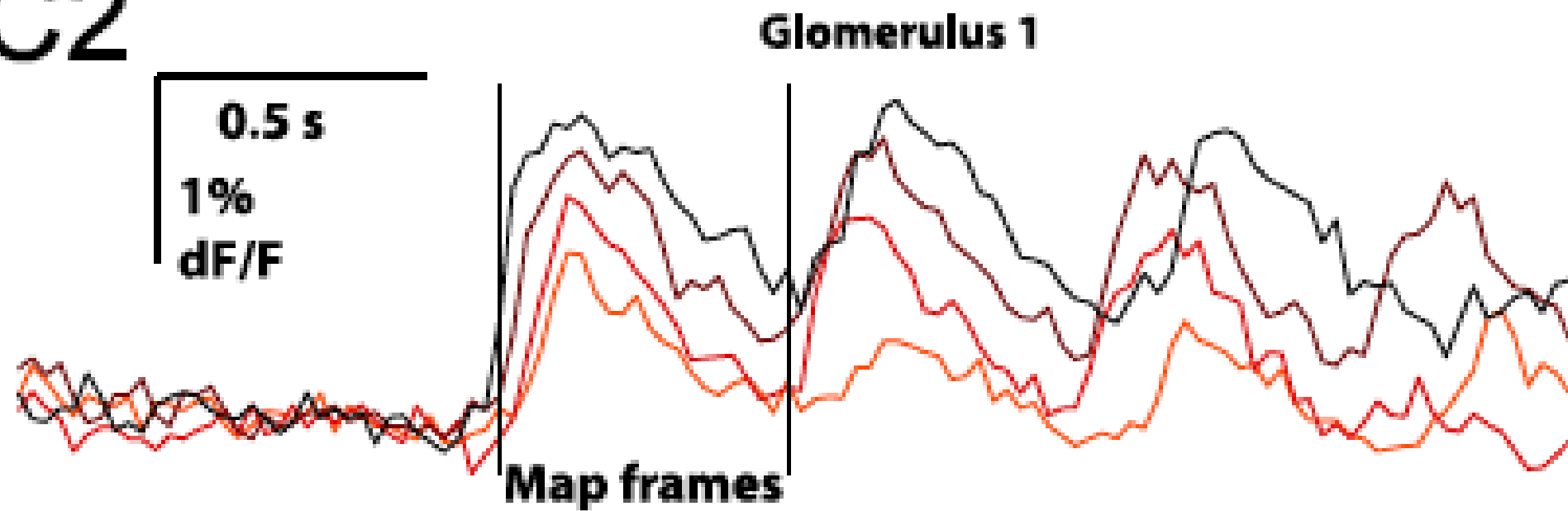
- window of relevant information



C1

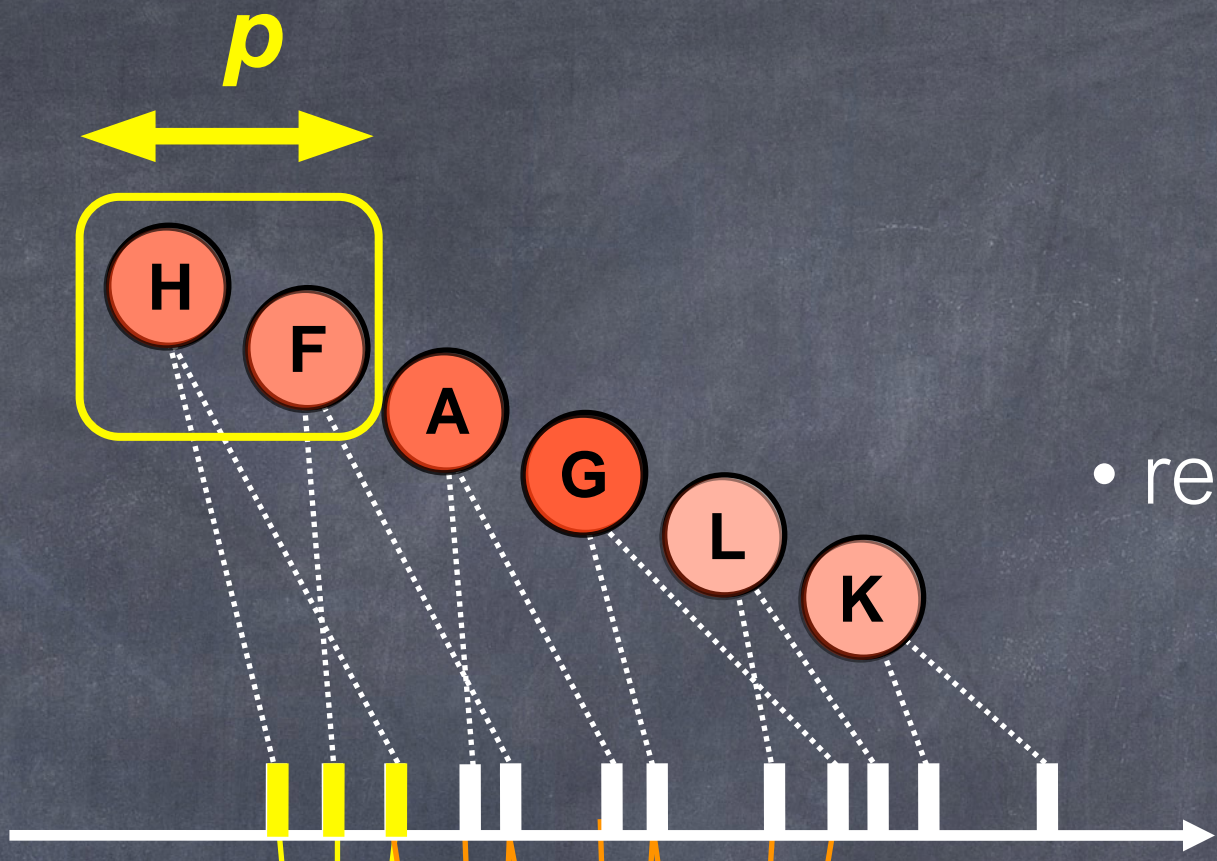
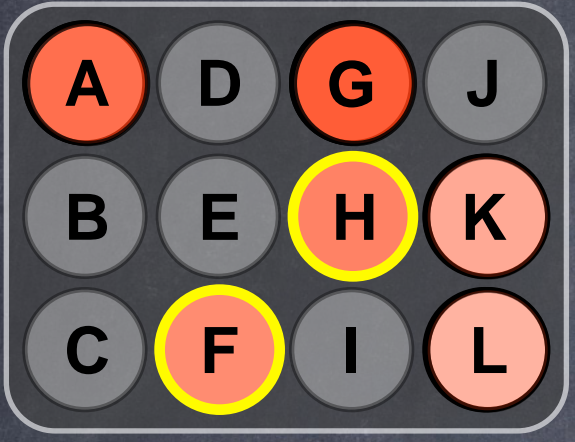


C2

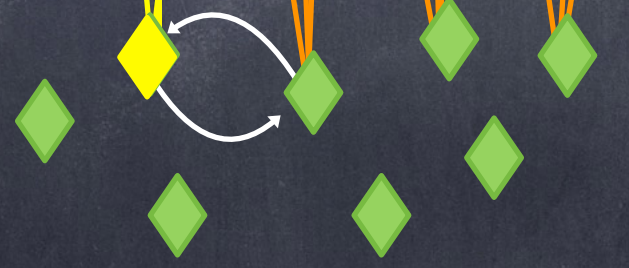


Primacy coding

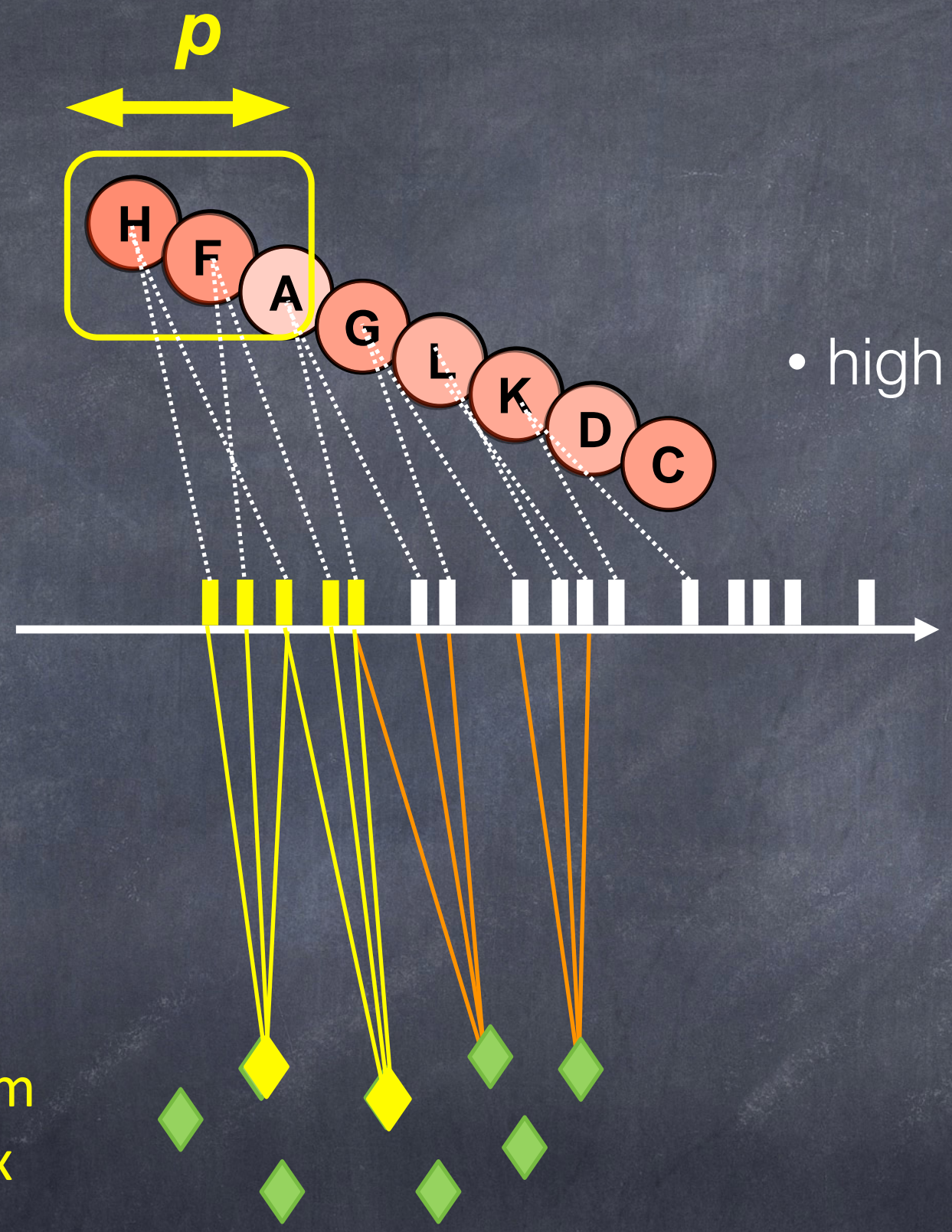
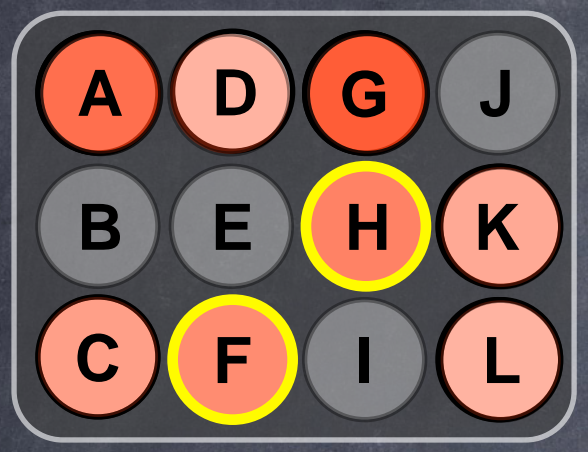
- reading the code



piriform cortex



Primacy coding

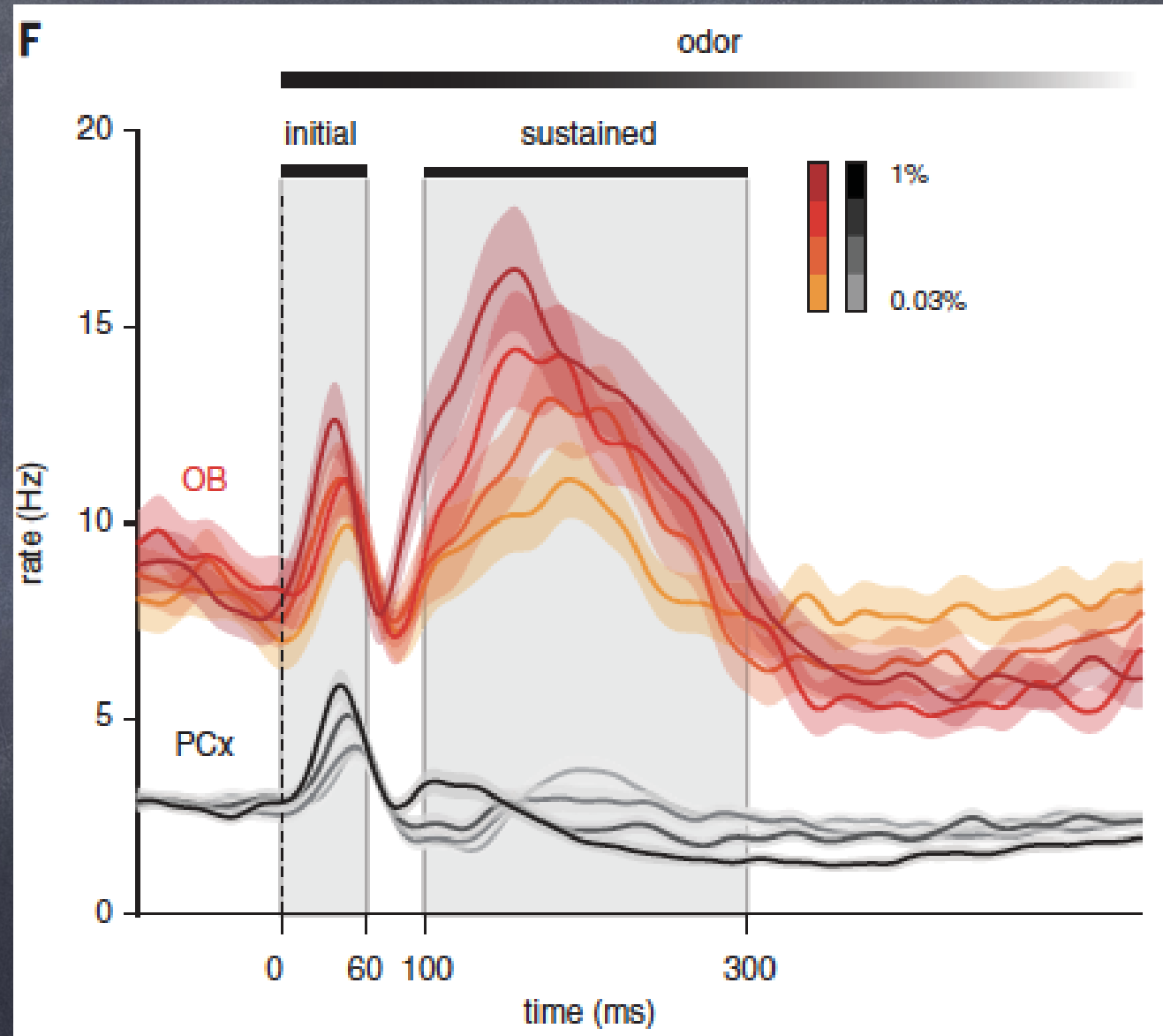


- high concentrations

Recurrent cortical circuits implement concentration-invariant odor coding

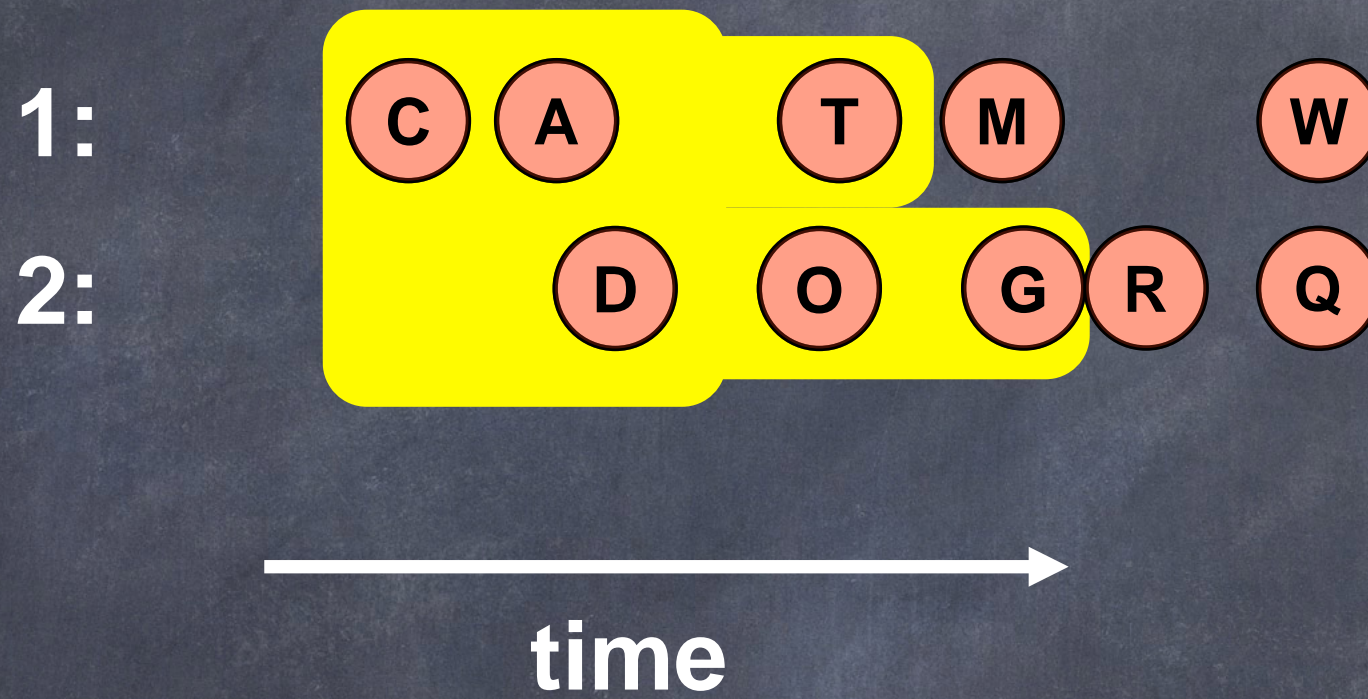
Kevin A. Bolding and Kevin M. Franks*

Science, 2018



Primacy coding

- mixtures



Odor concentration invariance by chemical ratio coding

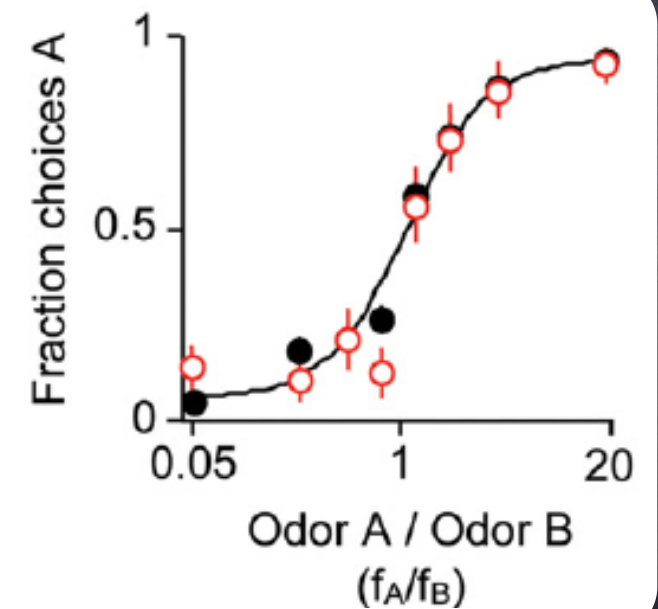
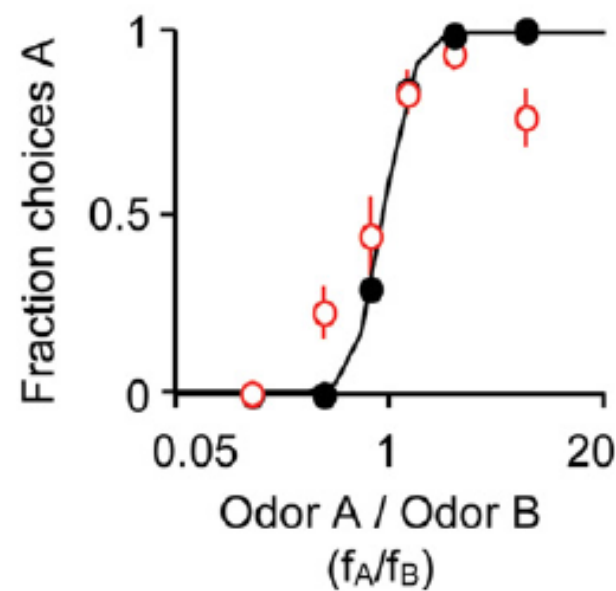
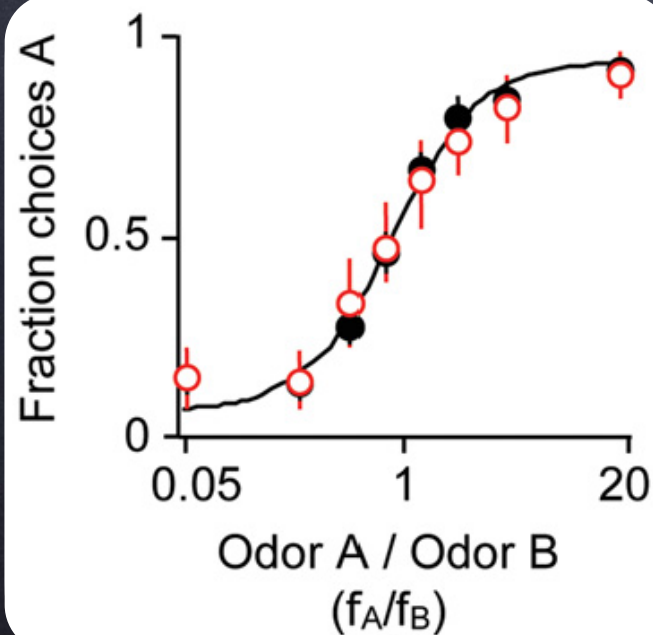
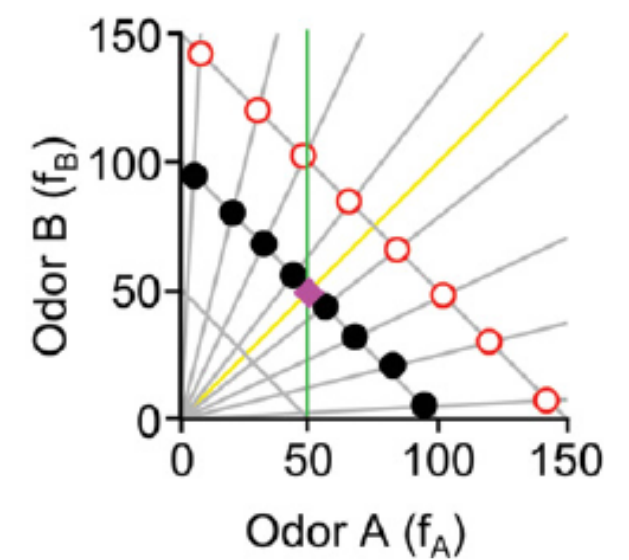
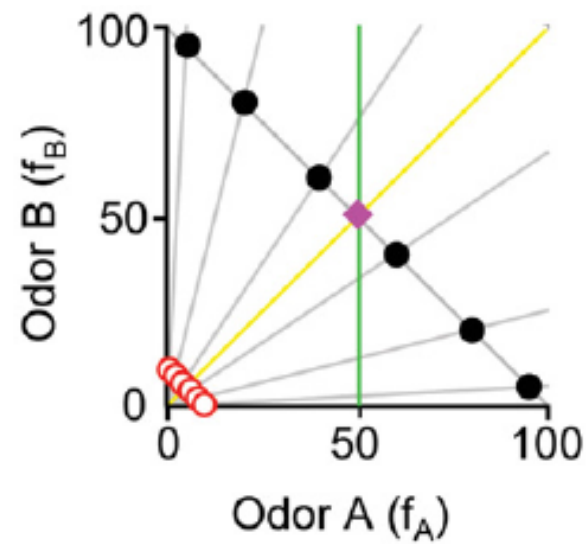
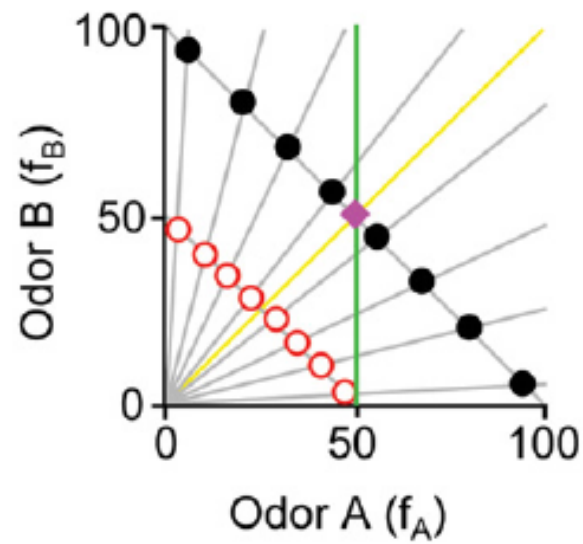
Naoshige Uchida[†] and Zachary F. Mainen^{*}

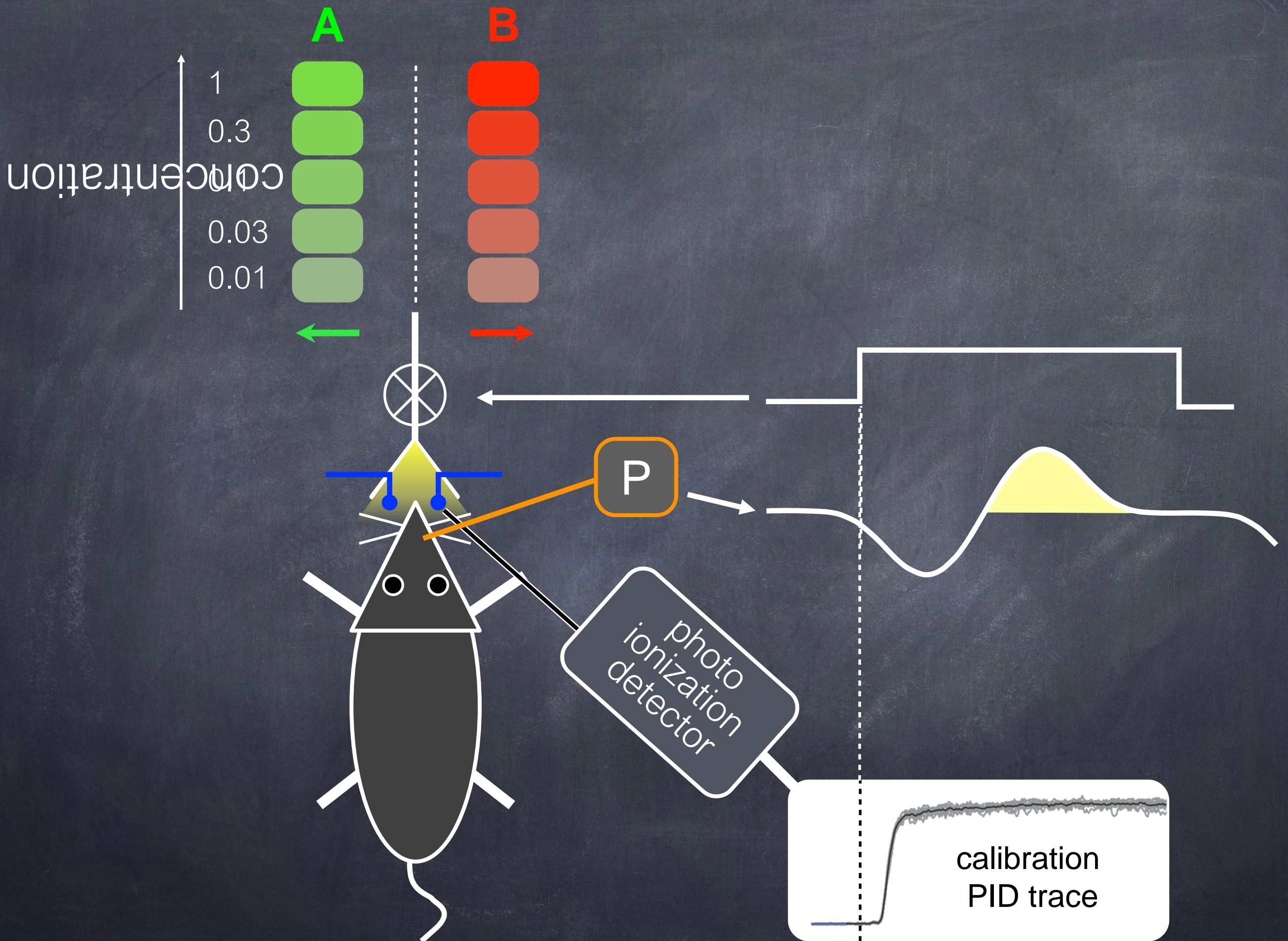
Cold Spring Harbor Laboratory, Cold Spring Harbor, NY, USA

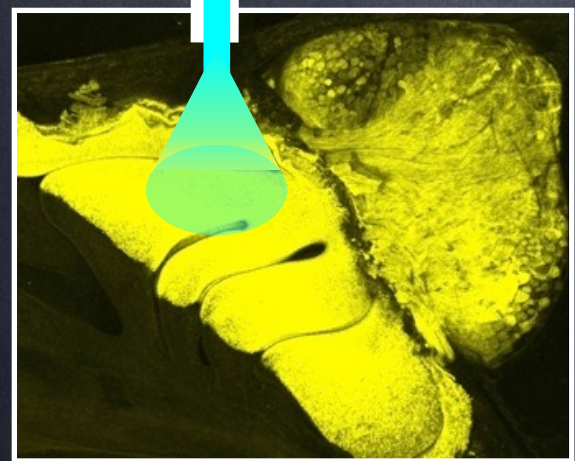
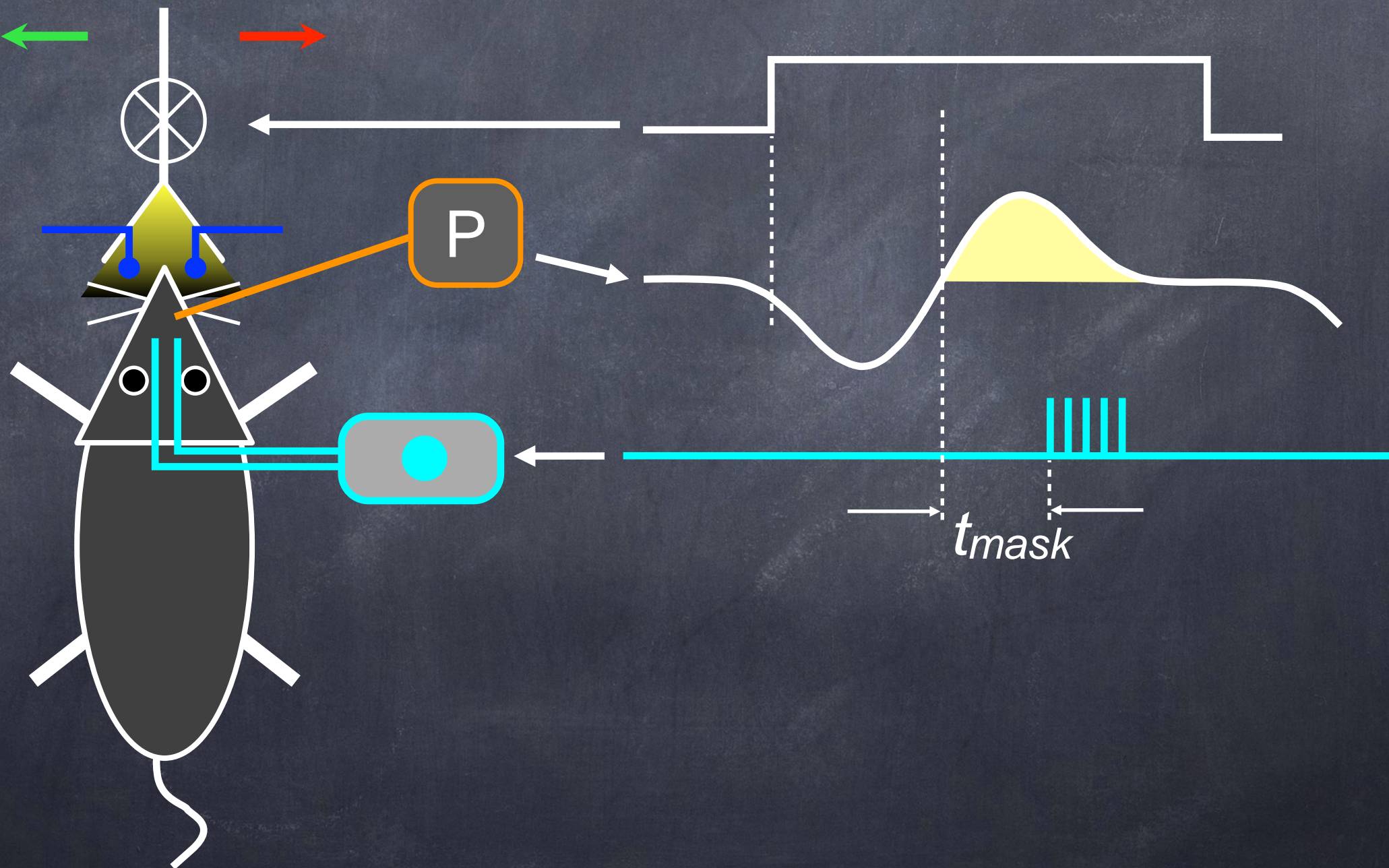
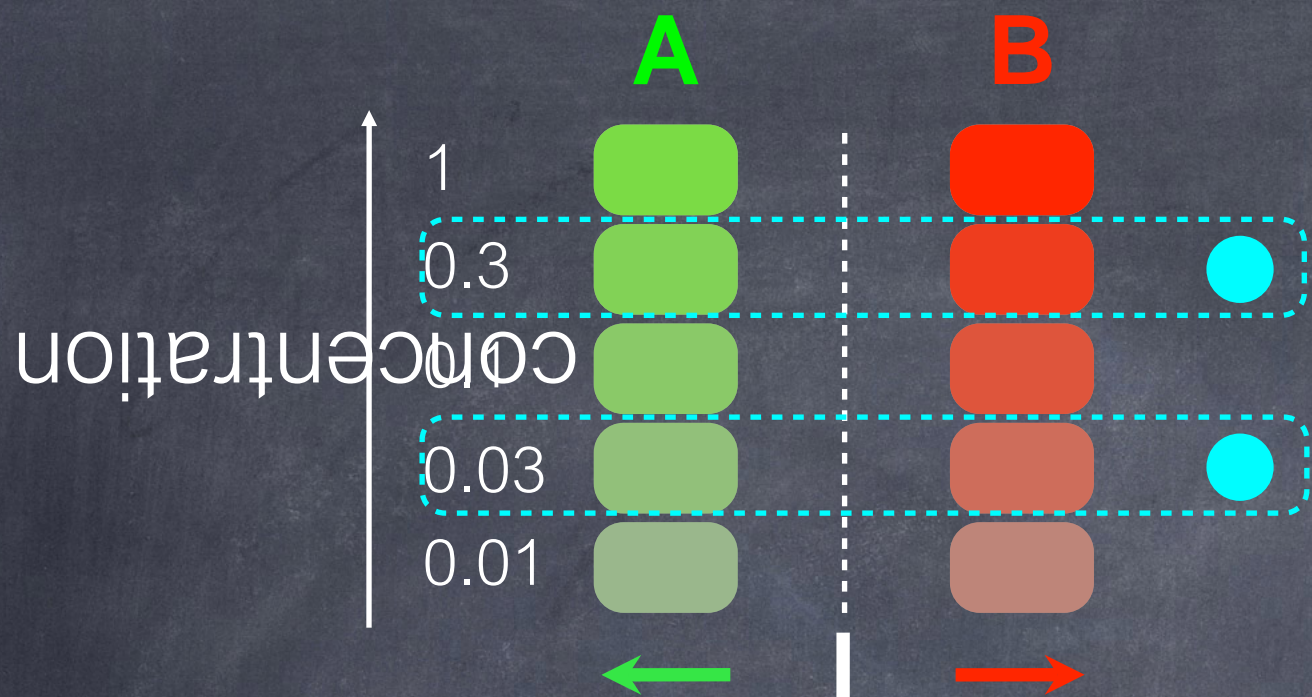
Odor concentration invariance by chemical ratio coding

Naoshige Uchida[†] and Zachary F. Mainen^{*}

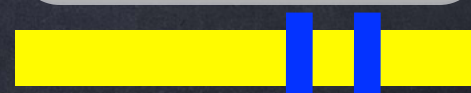
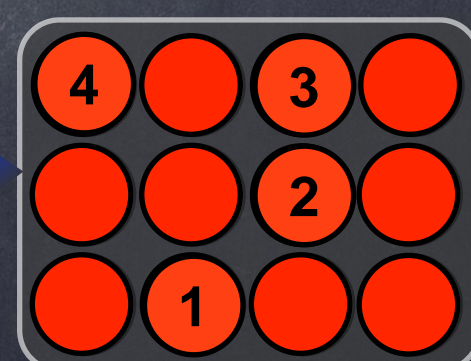
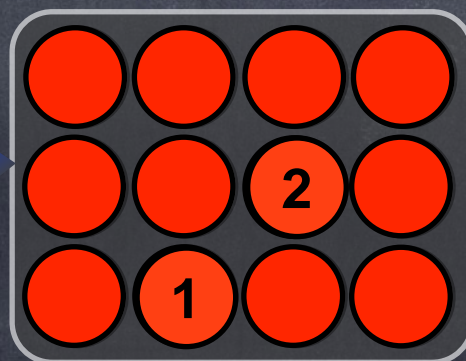
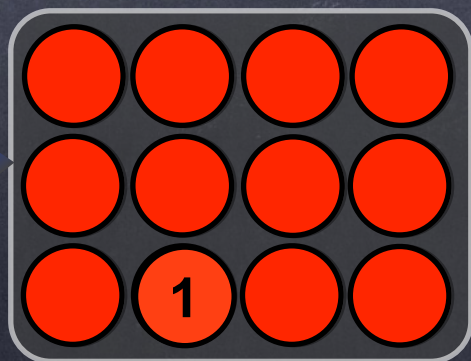
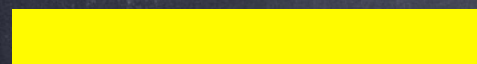
Cold Spring Harbor Laboratory, Cold Spring Harbor, NY, USA

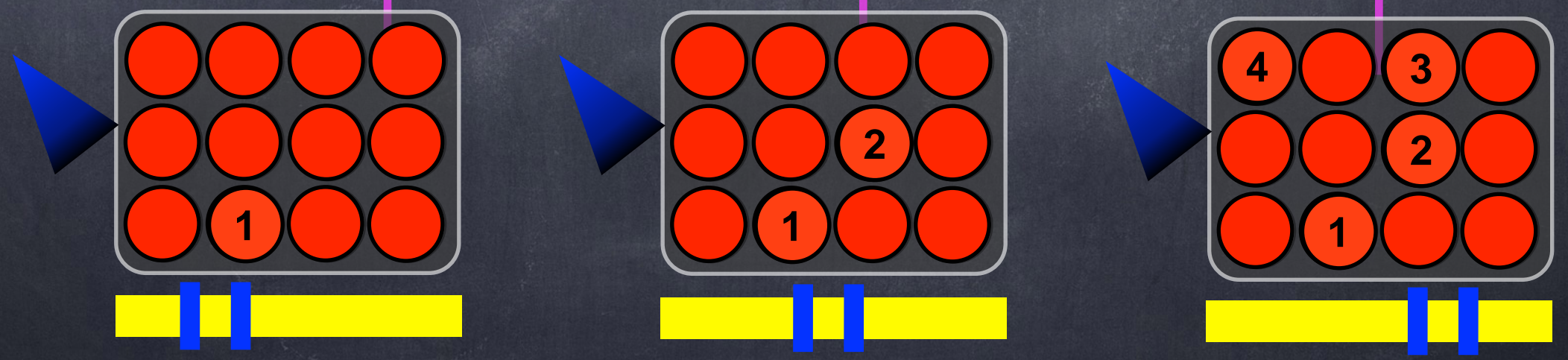
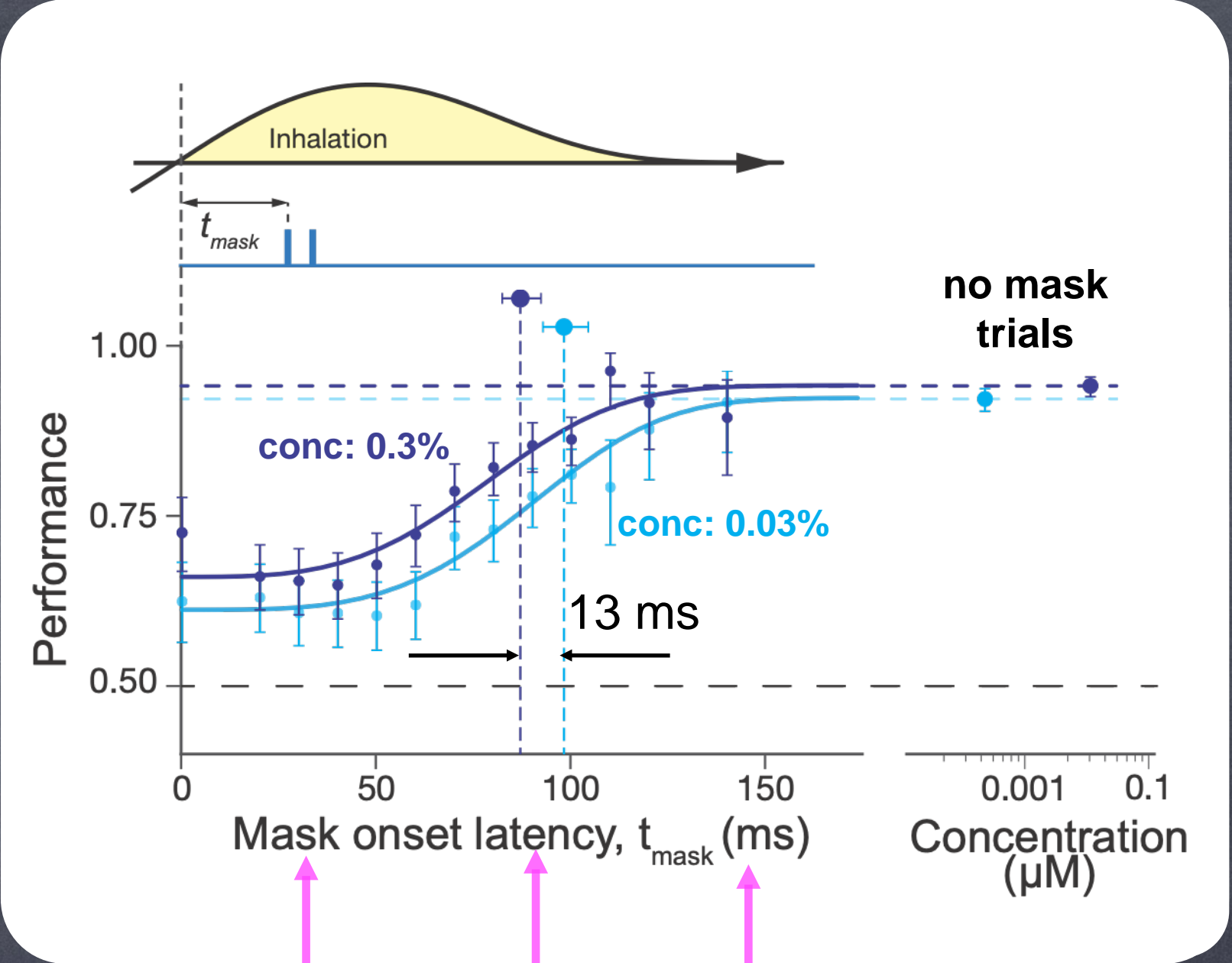
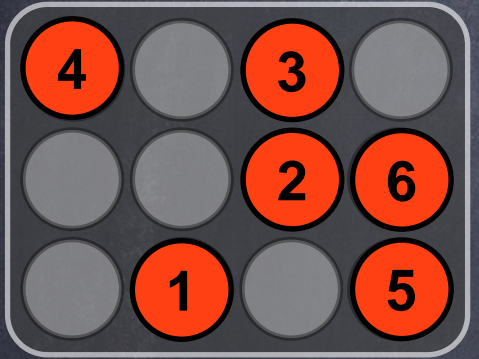


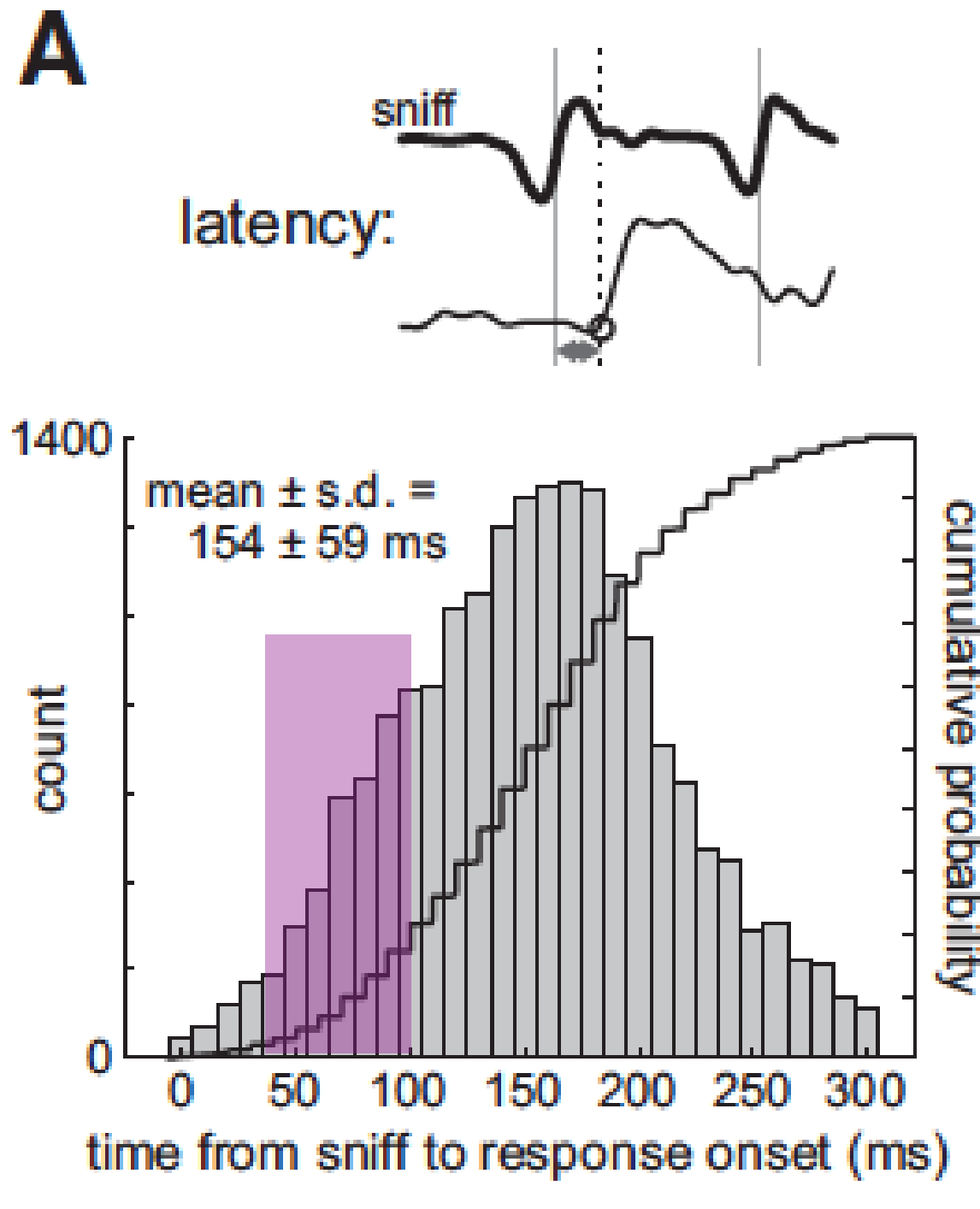
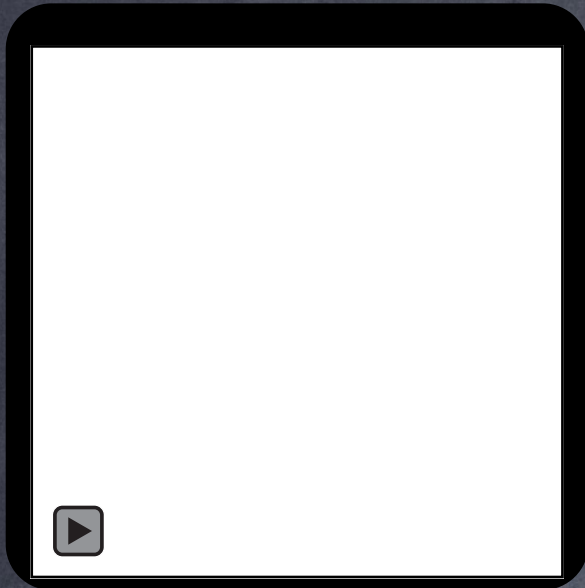




ChR2 & YFP -> OMP locus

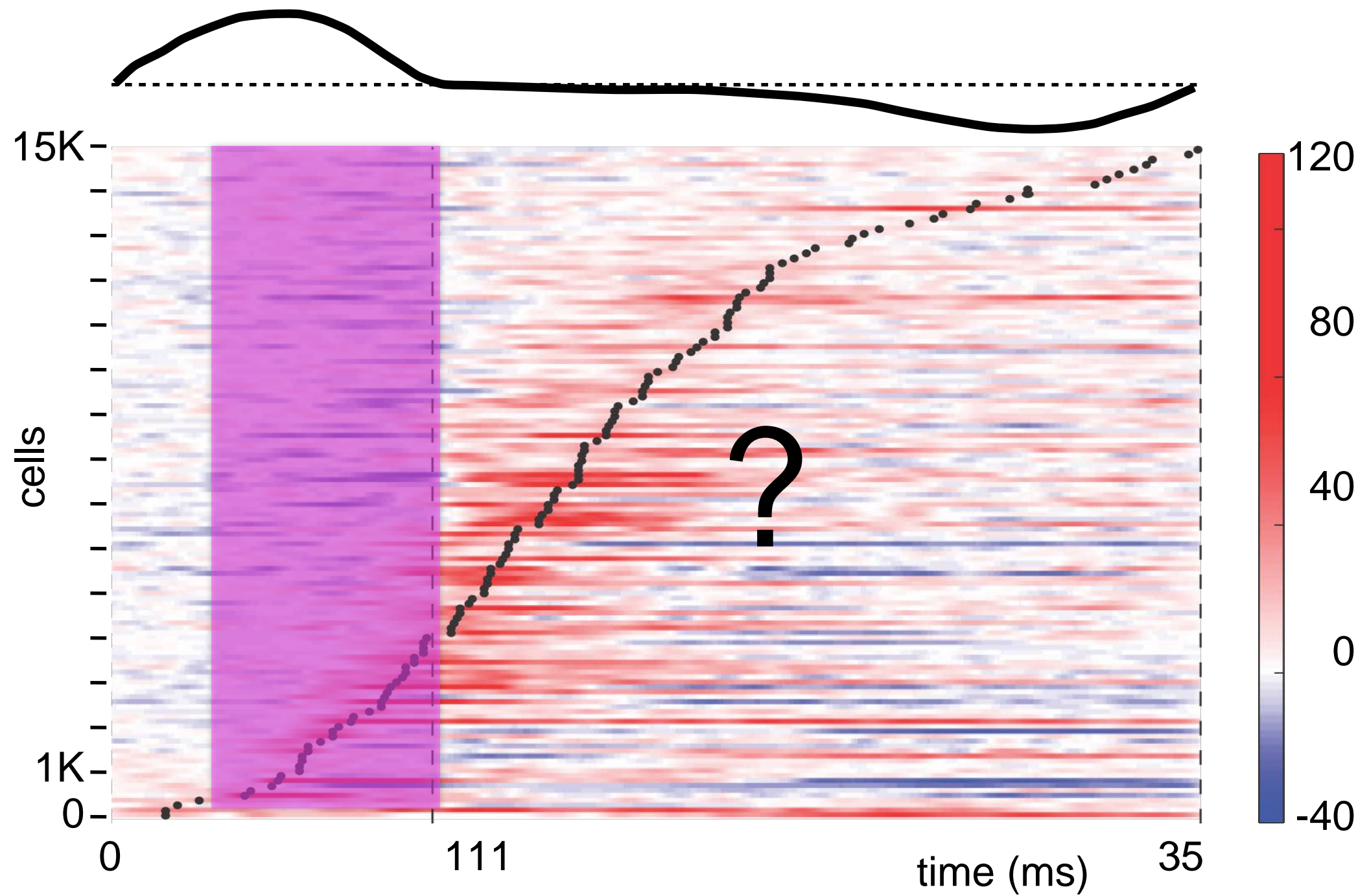




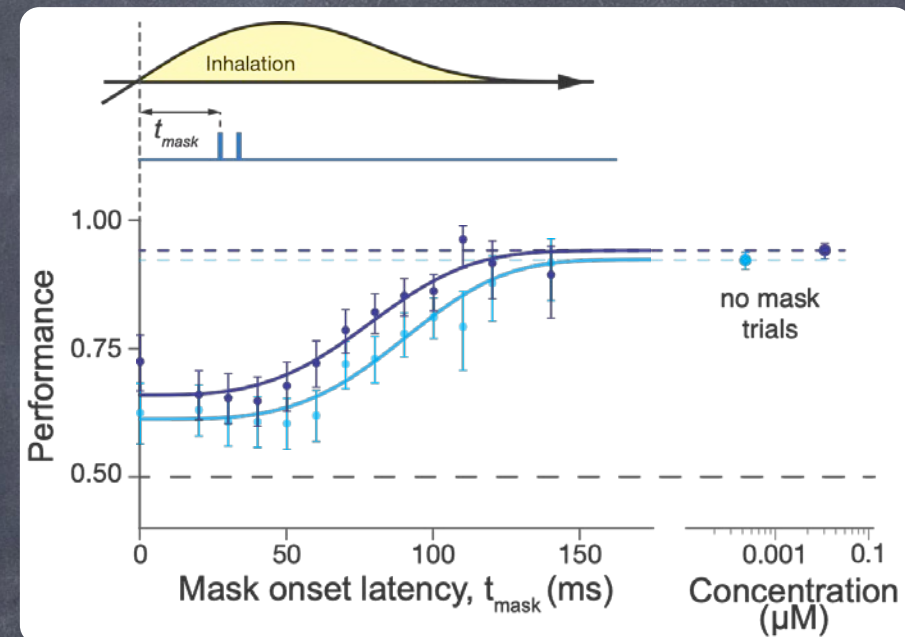
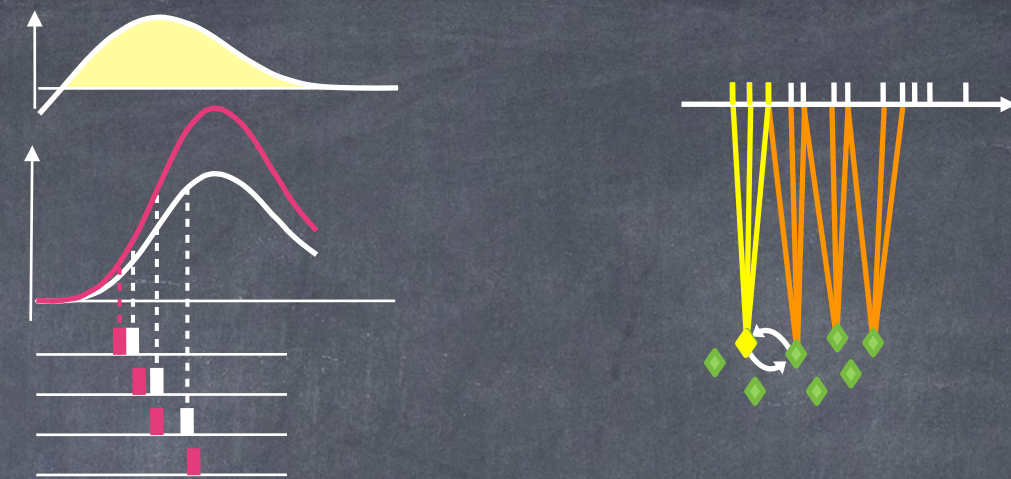
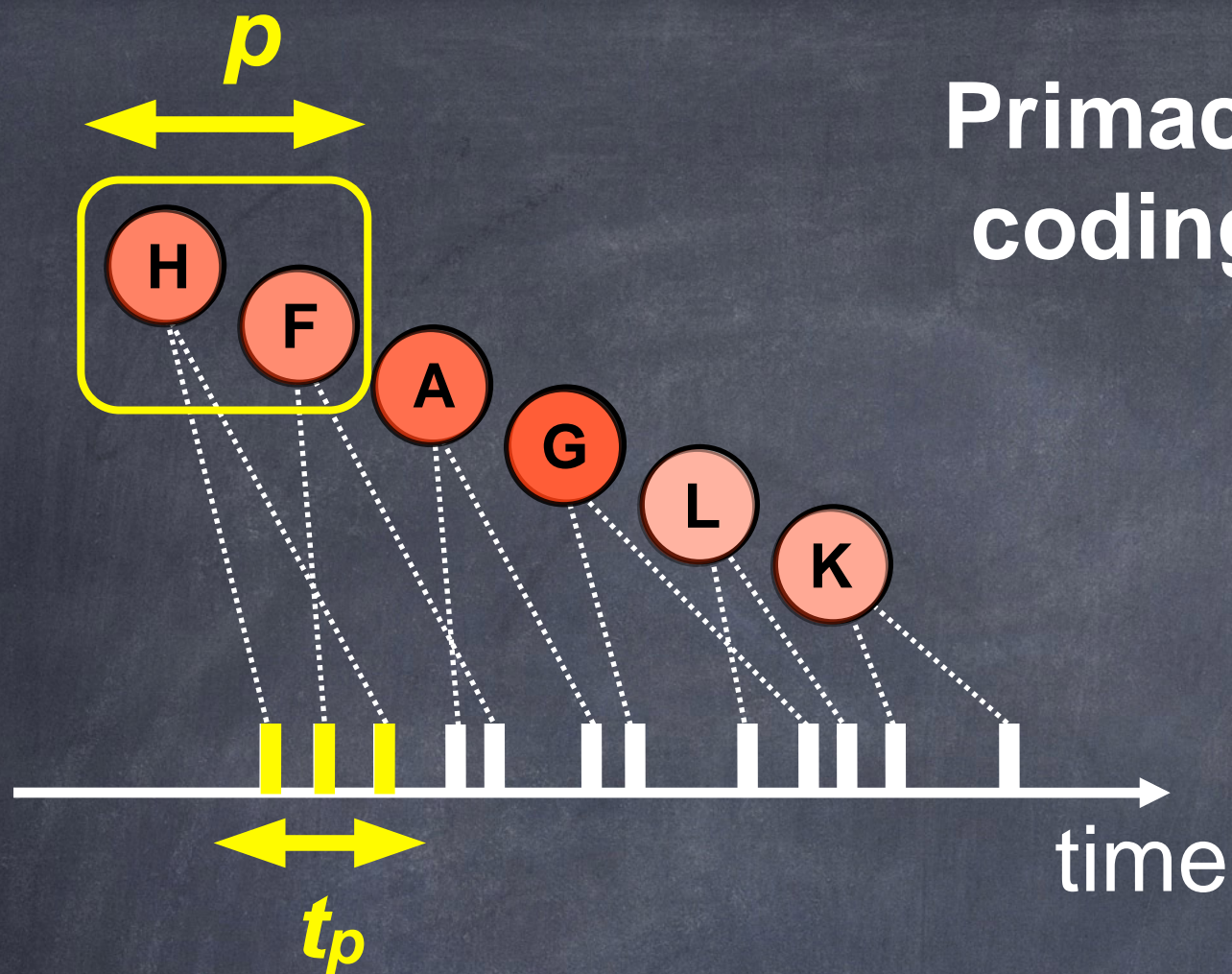


R Carey, et. al.,
J. Neurophysiol. 2009

~50.000 M/T cells
~15.000 excitatory responses



Primacy coding



- ★ concentration invariance
 - ★ mechanisms for forming the code
 - ★ mechanisms for reading the code
 - ★ the code is consistent with some known behavioral phenomena
- => small temporal window is relevant for behavior



- Multiple coding features are perceptually accessible
- Paradigm for evaluation of behavioral relevance of coding features
- Spatial-temporal template matching model for perceptual distances
- Primacy coding for concentration invariance

