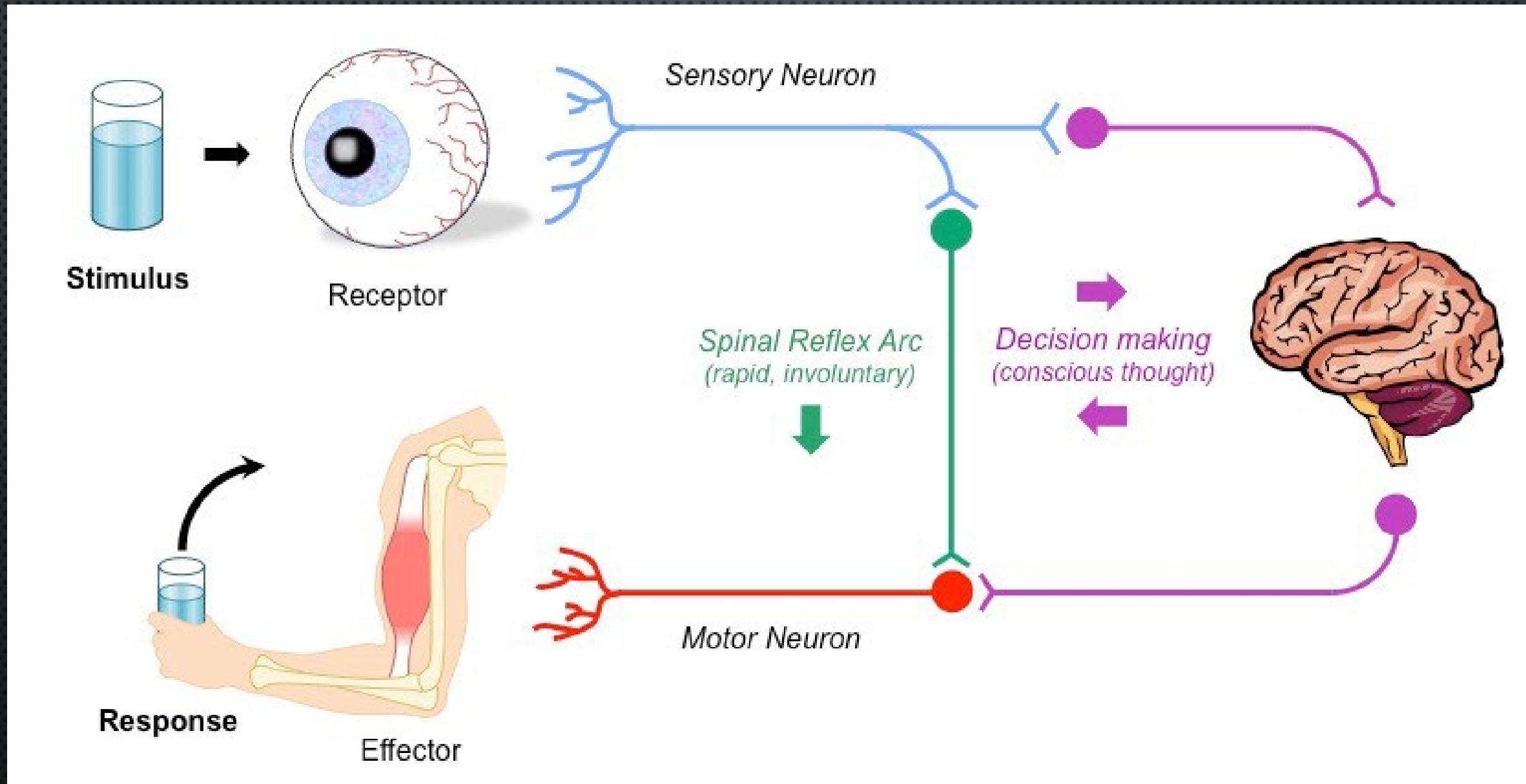




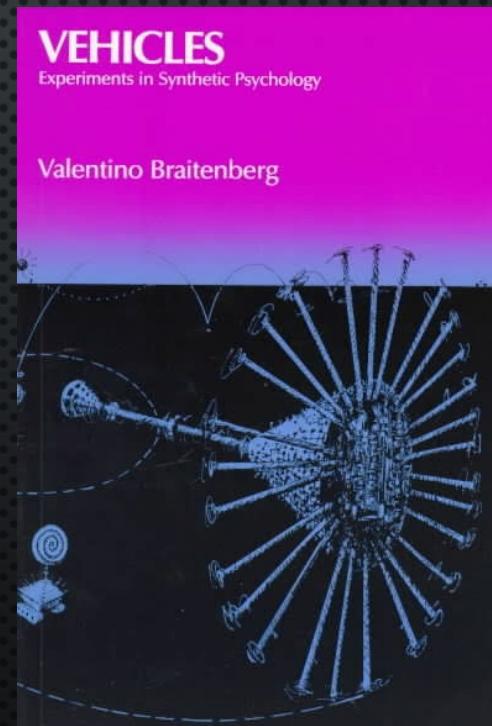
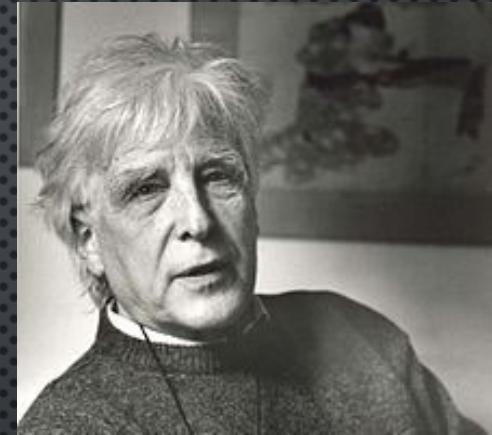
# 3 Simple artificial neural brains for sensing and control

# A simple template for an artificial brain



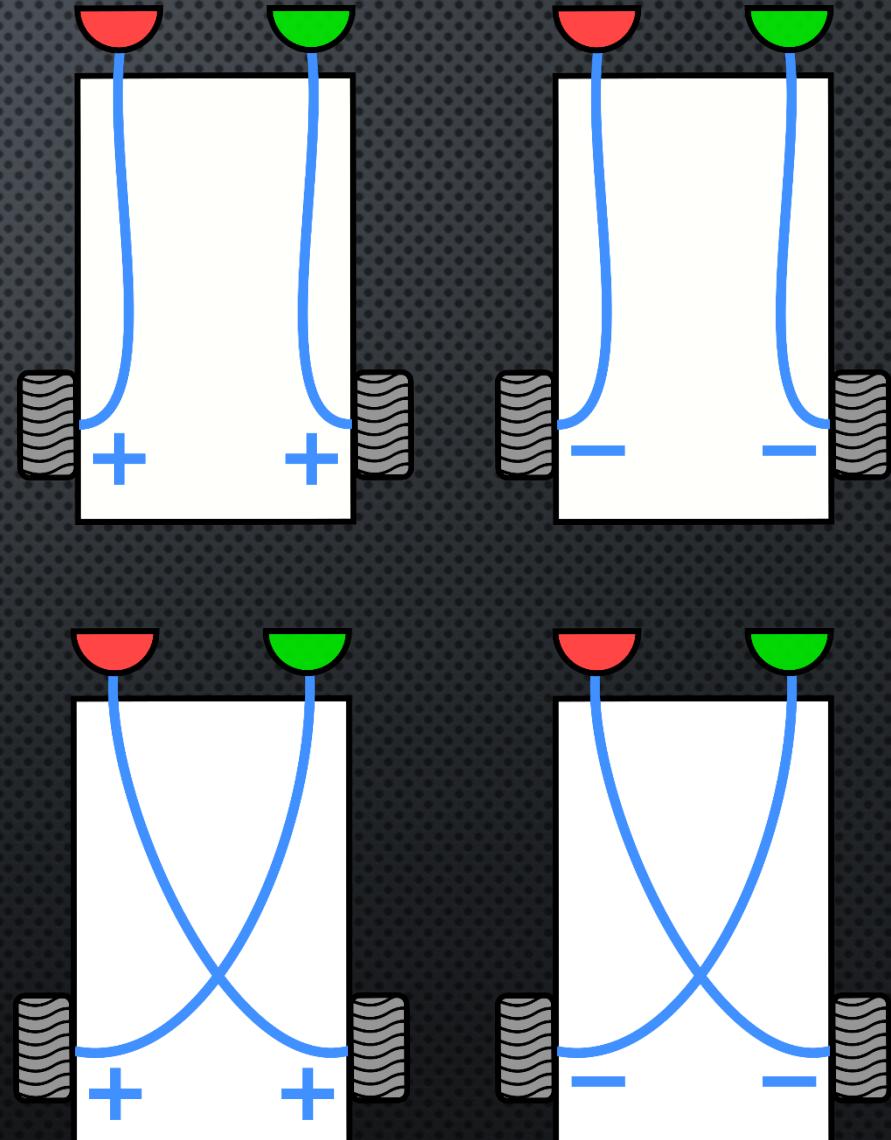
# Braitenberg vehicles: a simple neurorobot

- Proposed by Valentino Braitenberg in 1984 book “Vehicles: Experiments in synthetic psychology”
- Exploring relation between structures and functions of the brain
- Hypothetical analogue vehicles (a combination of sensors, actuators and their interconnections)
- Vehicles displayed behaviours akin to aggression, love, fear, and exploration



# Braitenberg vehicles: a simple neurorobot

- A sensor is directly connected to an actuator (e.g. light sensor → wheel motor)
- Sensorimotor connections can be ipsilateral or contralateral and excitatory or inhibitory
- Depending on how sensors and wheels are connected, the vehicle exhibits different movement behaviours
- In a complex environment with several sources of stimulus, vehicles exhibit complex and dynamic behaviour
- Functioning of the vehicle is purely mechanical, without any information processing or other apparently cognitive processes.



# Some basic Braitenberg vehicles

$$v_{left} = k \times \frac{1}{s_{right}}$$

$$v_{right} = k \times \frac{1}{s_{left}}$$

“Exploration”

OR

$$v_{left} = k \times (s_{max} - s_{right})$$

$$v_{right} = k \times (s_{max} - s_{left})$$

$$v_{left} = \frac{1}{k} \times \frac{1}{s_{left}}$$

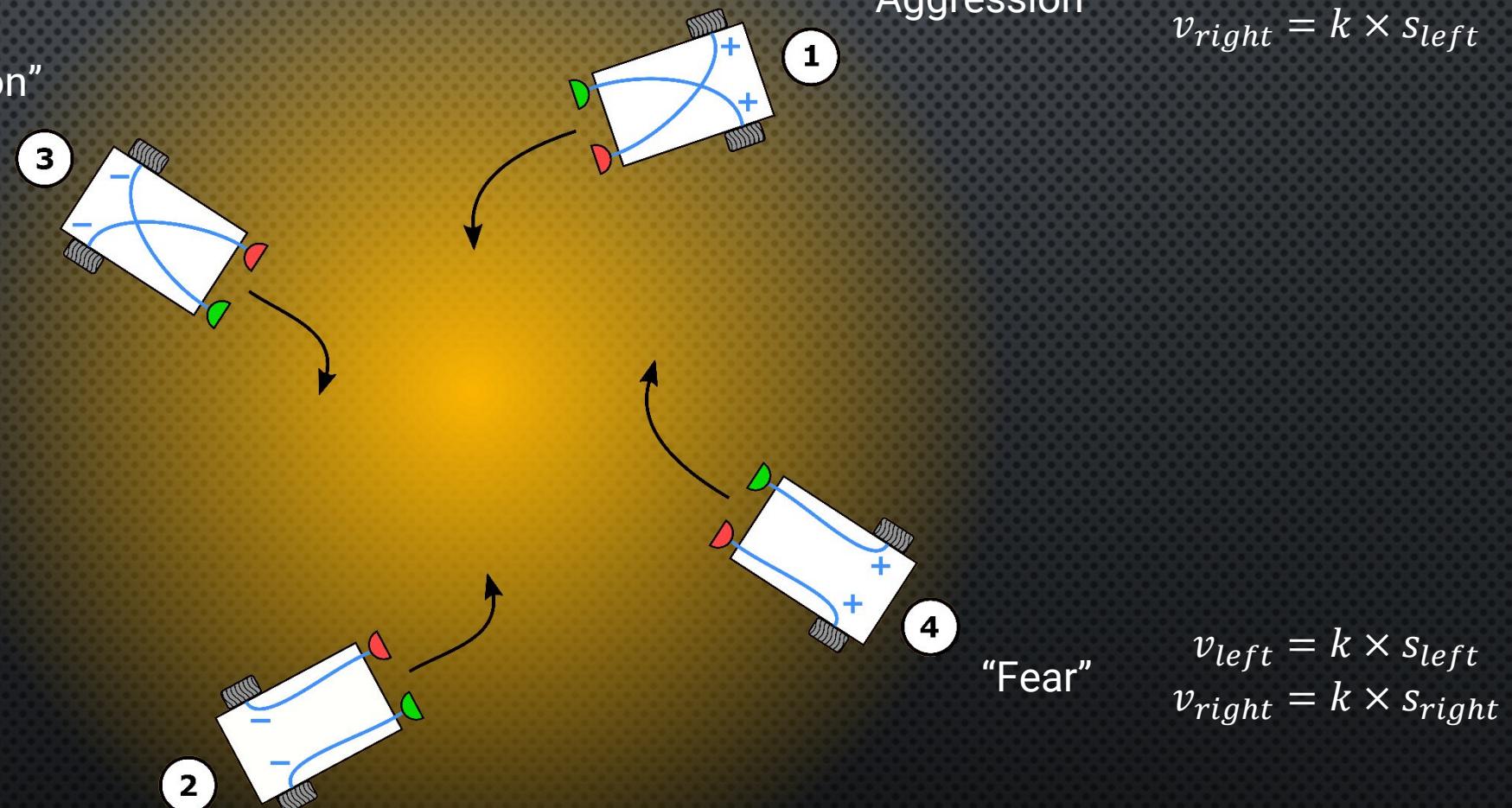
$$v_{right} = \frac{1}{k} \times \frac{1}{s_{right}}$$

OR

$$v_{left} = k \times (s_{max} - s_{left})$$

“Love”

$$v_{right} = k \times (s_{max} - s_{right})$$



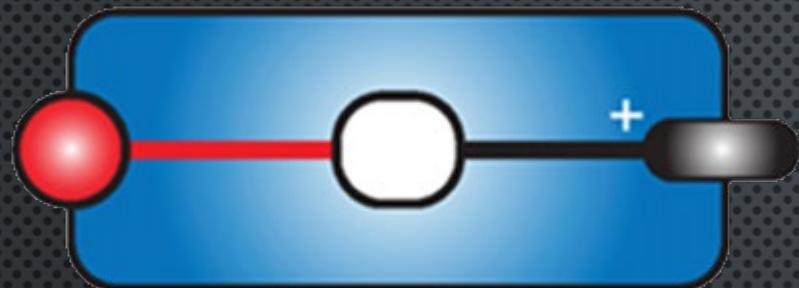
$$v_{left} = k \times s_{right}$$

$$v_{right} = k \times s_{left}$$

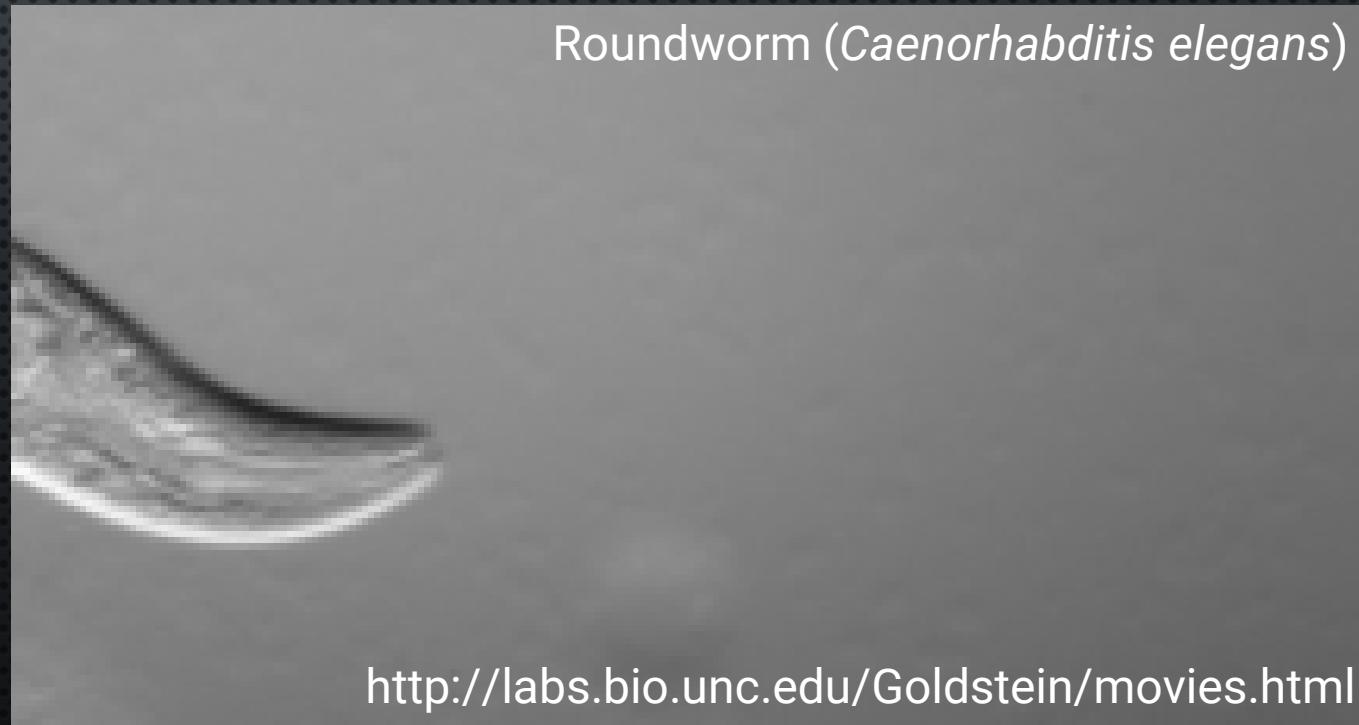
$$v_{left} = k \times s_{left}$$

$$v_{right} = k \times s_{right}$$

# Braitenberg vehicles as animal models

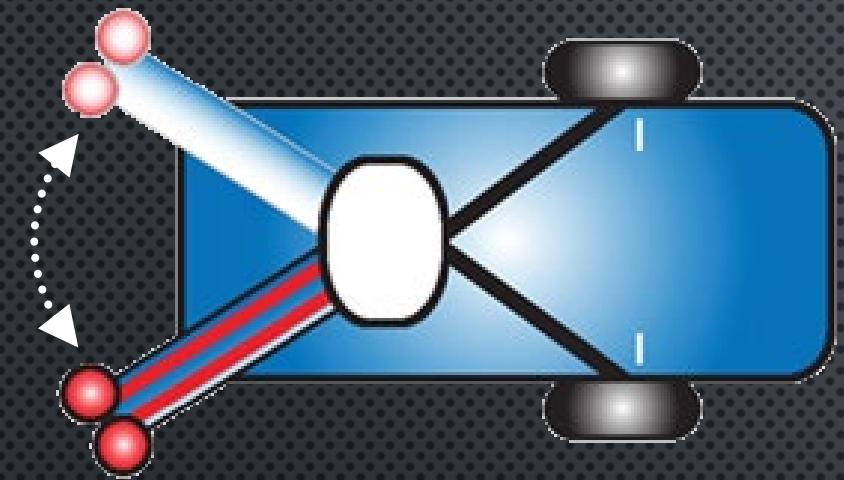


Alex Gomez-Marin et al., 2010



Roundworm (*Caenorhabditis elegans*)

# Braitenberg vehicles as animal models

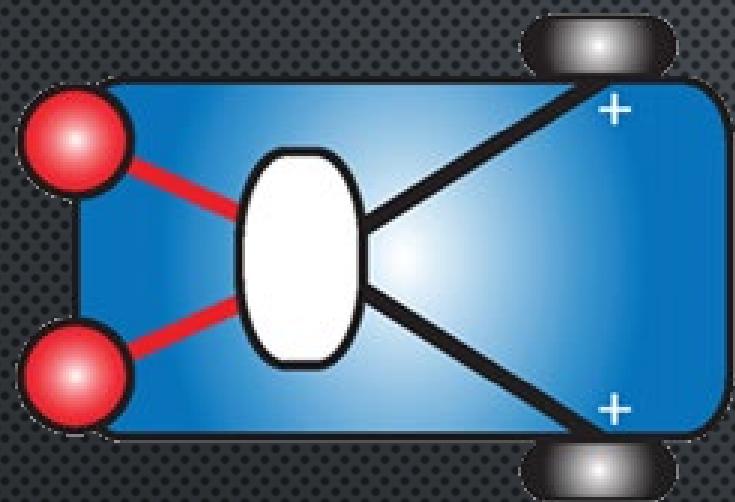


Alex Gomez-Marin et al., 2010



*Drosophila melanogaster* or common fruit fly, larval stage

# Braitenberg vehicles as animal models

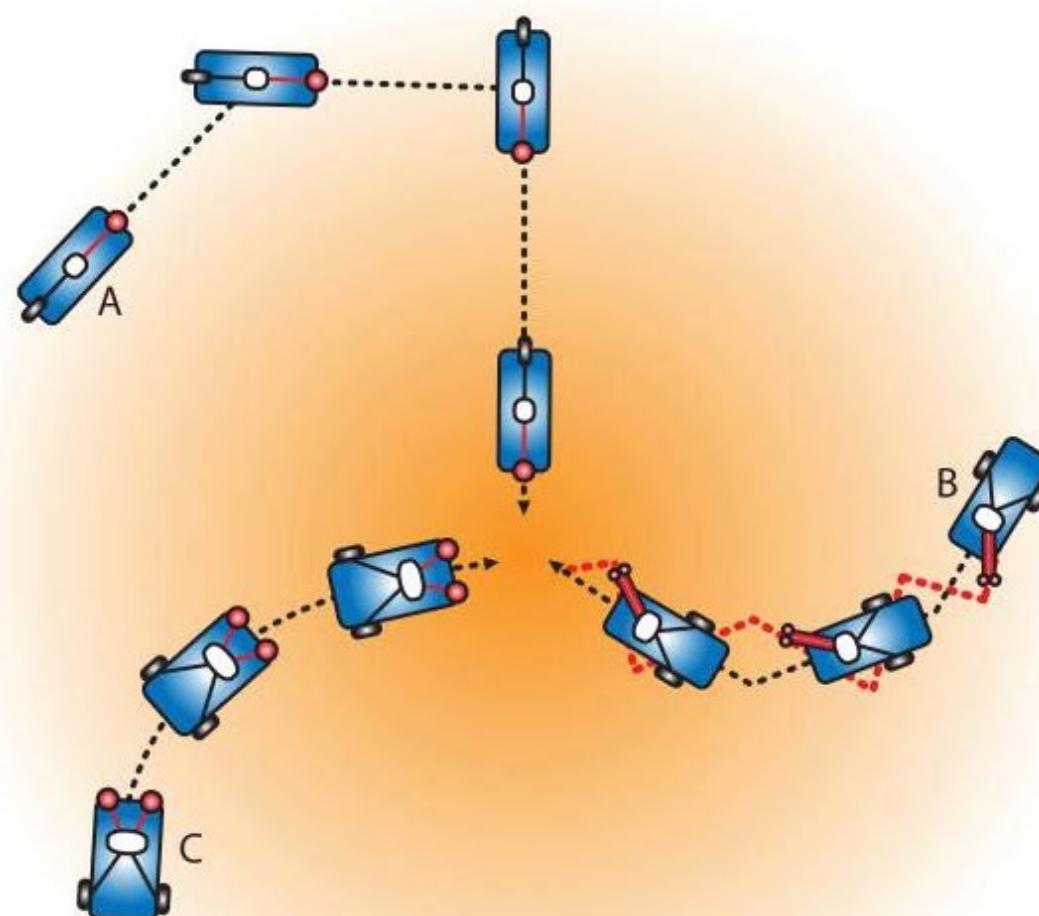
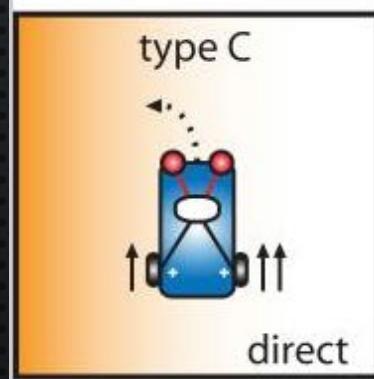
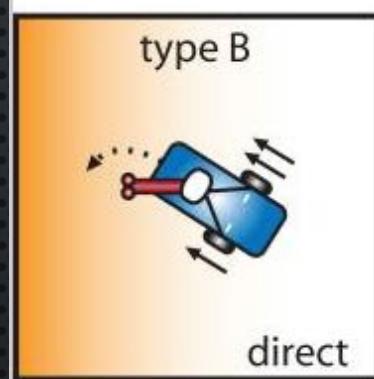
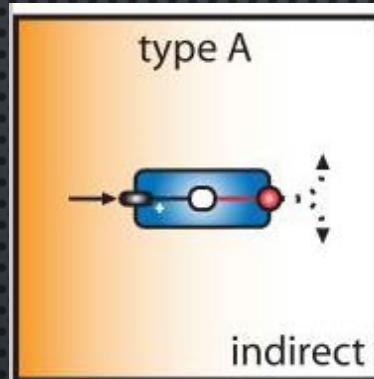


Alex Gomez-Marin et al., 2010



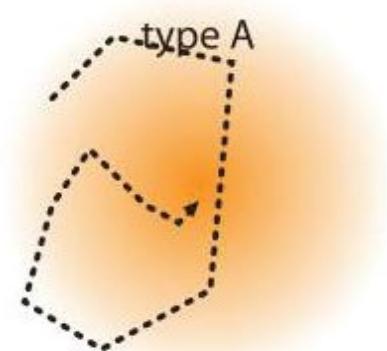
*Drosophila melanogaster* or  
common fruit fly, adult stage

# Braitenberg vehicles as animal models



low                          high      odor

Alex Gomez-Marin et al., 2010



type B



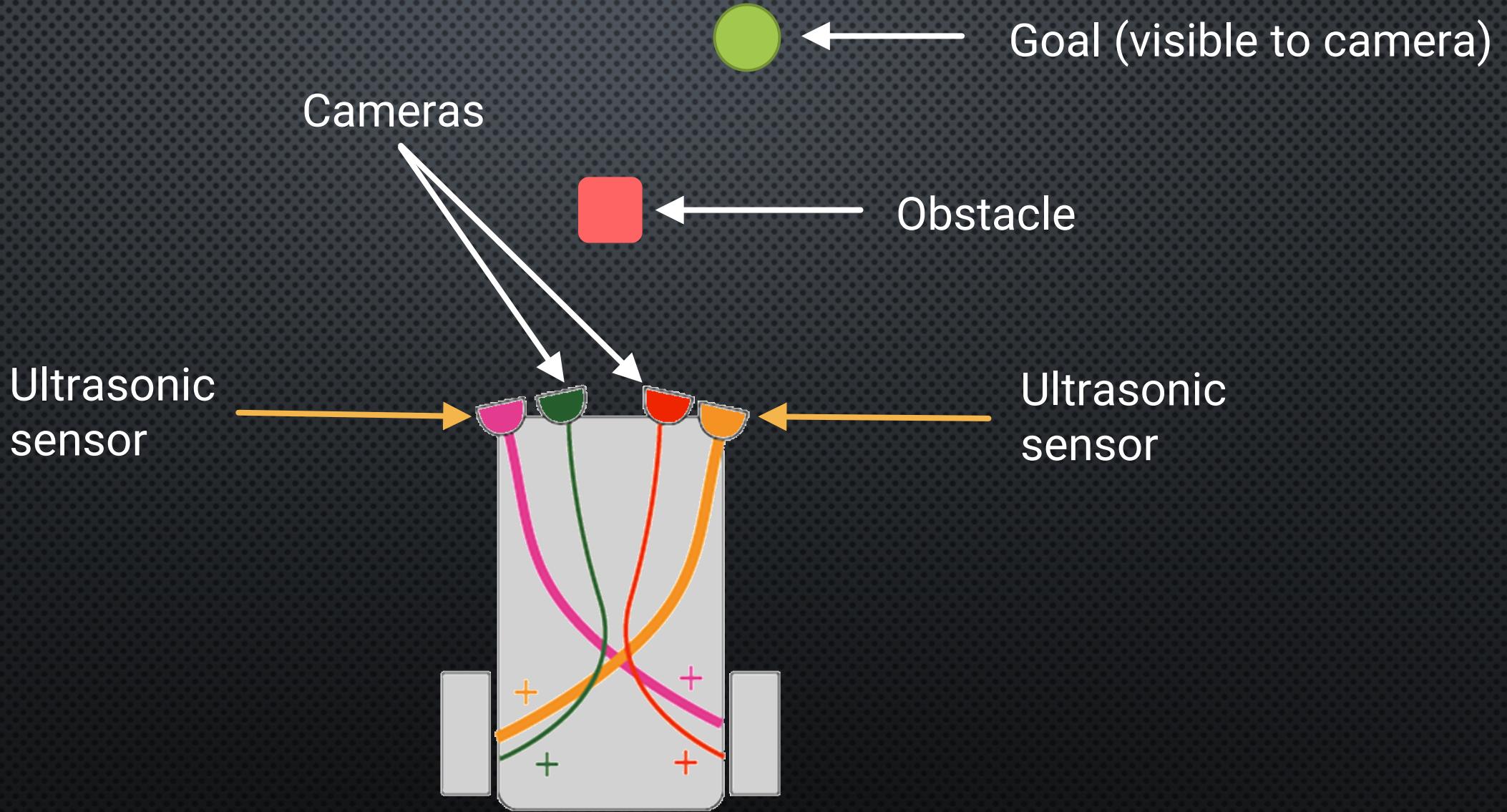
type C

## Some examples

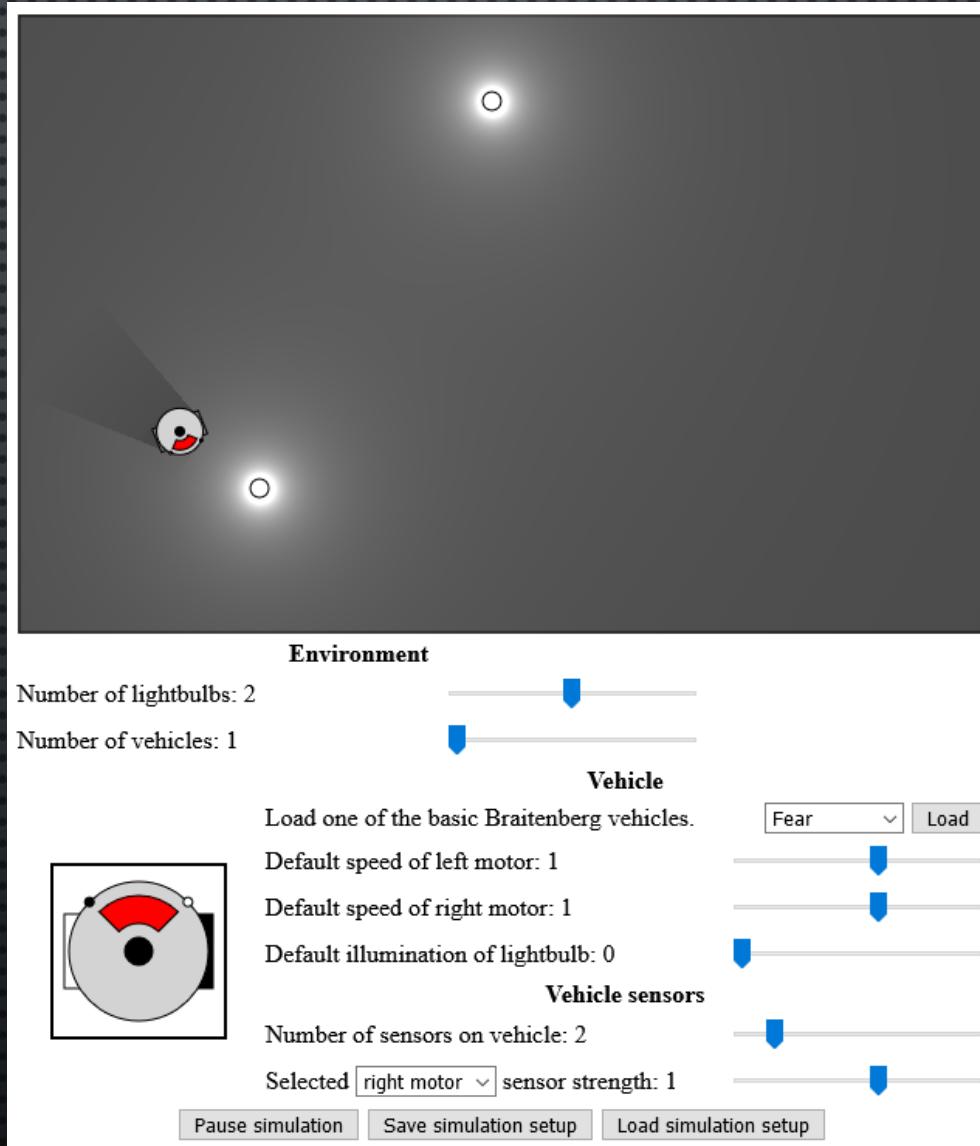
# LEGO NXT Braitenberg Vehicle 2

From Bricks to Brains:  
Chapter 4: "Braitenberg's Vehicle 2"

# How will this vehicle behave?



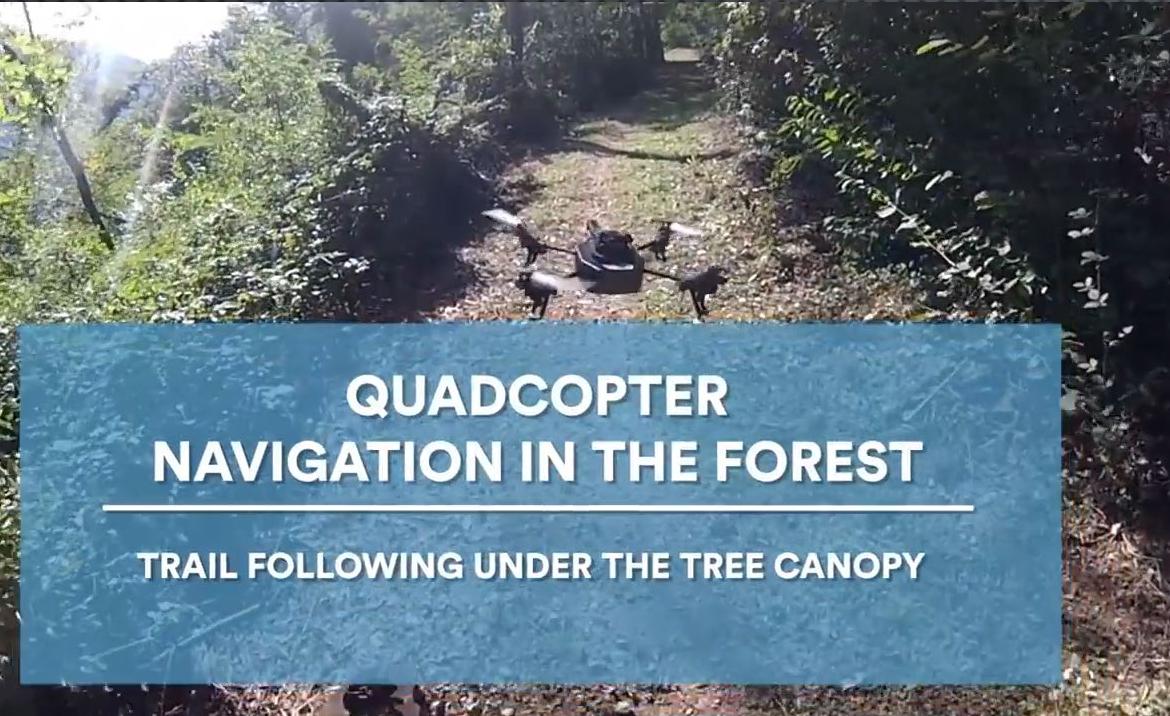
# Play time: Braitenberg vehicle playground



<http://www.harmendeweerd.nl/braitenberg-vehicles/>

# A case for Braitenberg controllers

The artificial solution



<https://www.youtube.com/watch?v=umRdt3zGgpU>

The natural solution



[https://www.youtube.com/watch?v=p-\\_RHRAzUHM](https://www.youtube.com/watch?v=p-_RHRAzUHM)

# Case study 1

## A lizard-inspired sound localising robot

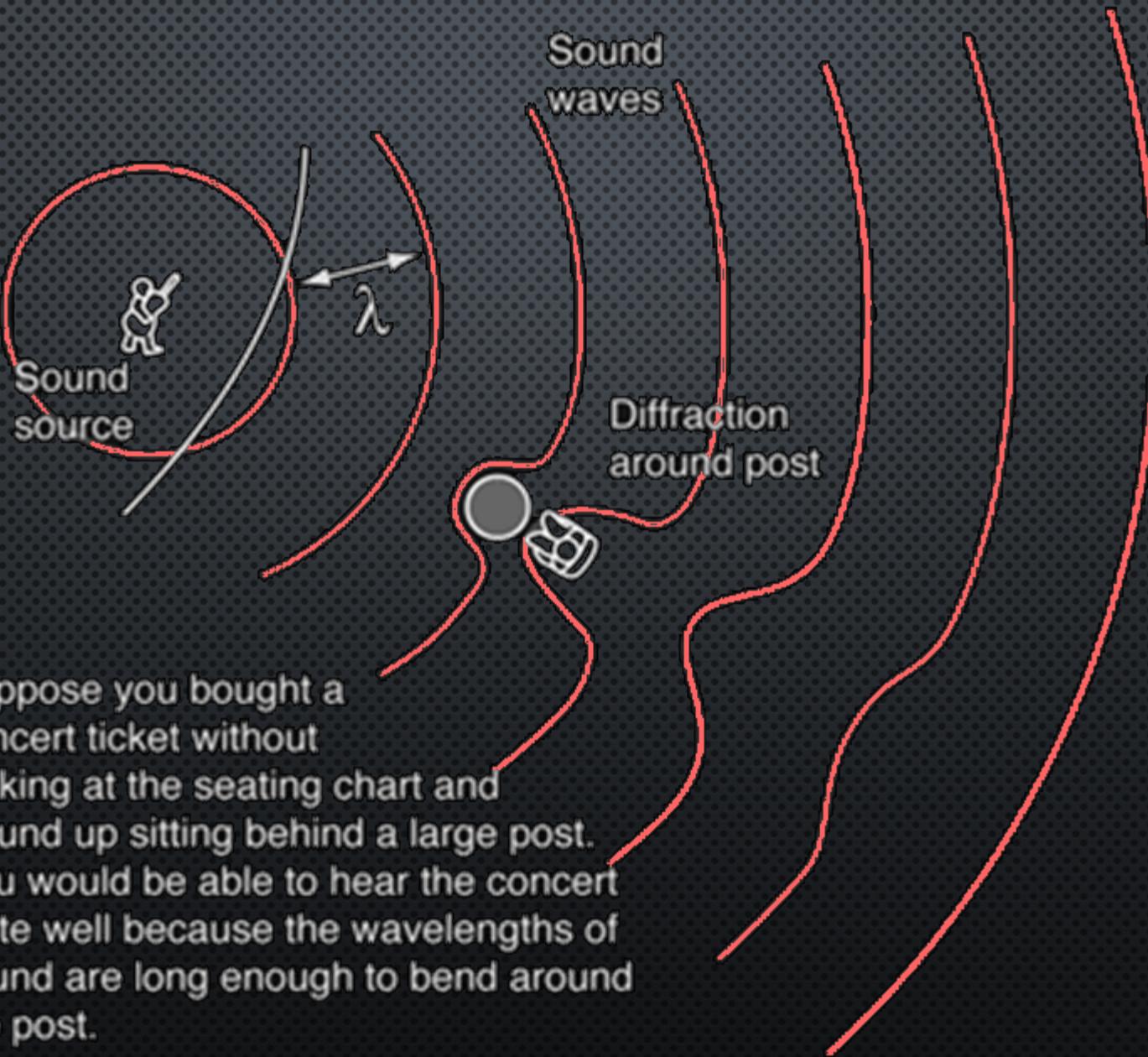
# Lizard audition



wildlife  
singapore

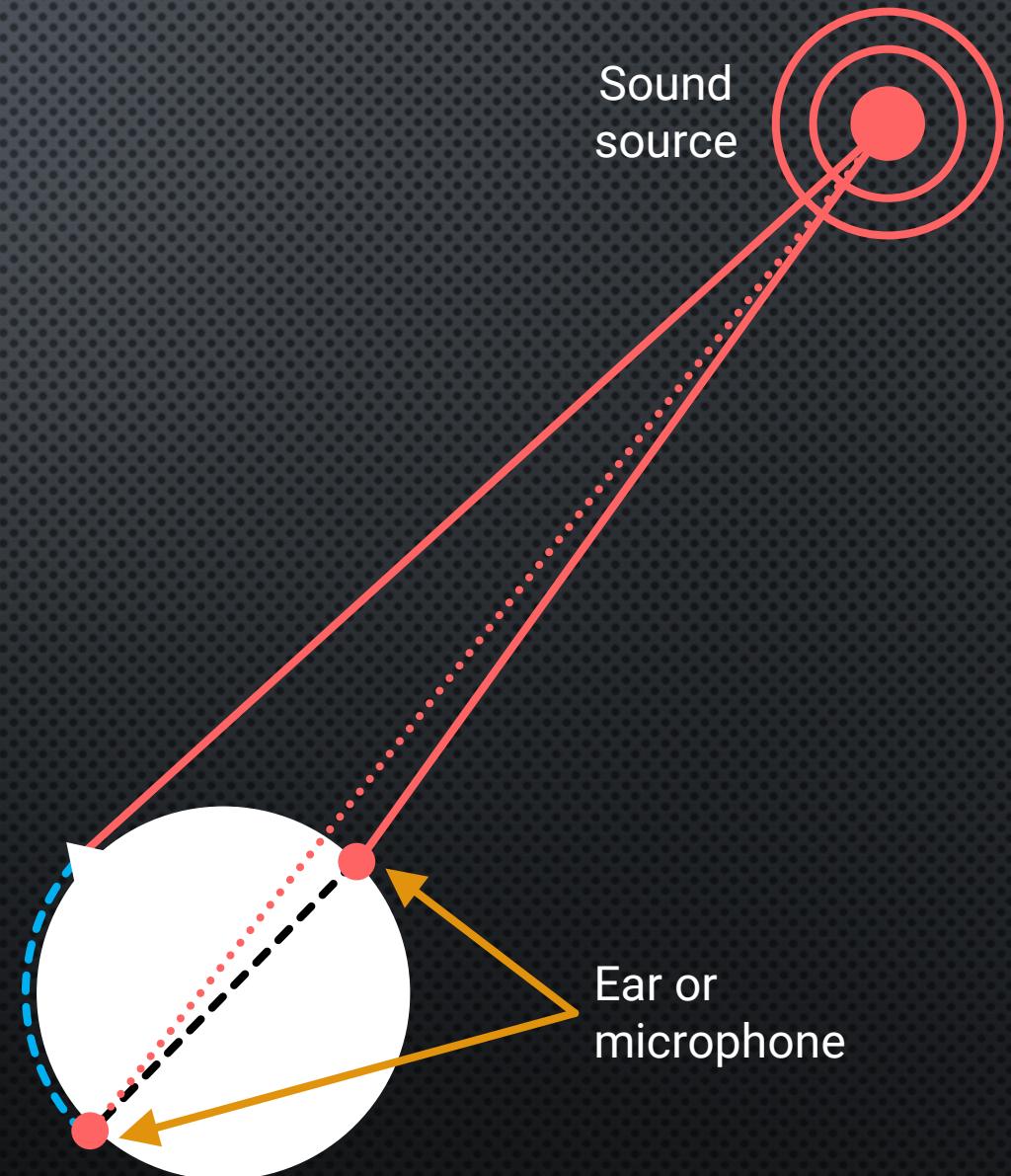
[www.wildsingapore.per.sg](http://www.wildsingapore.per.sg)

# Ecological niche: physics of sound propagation



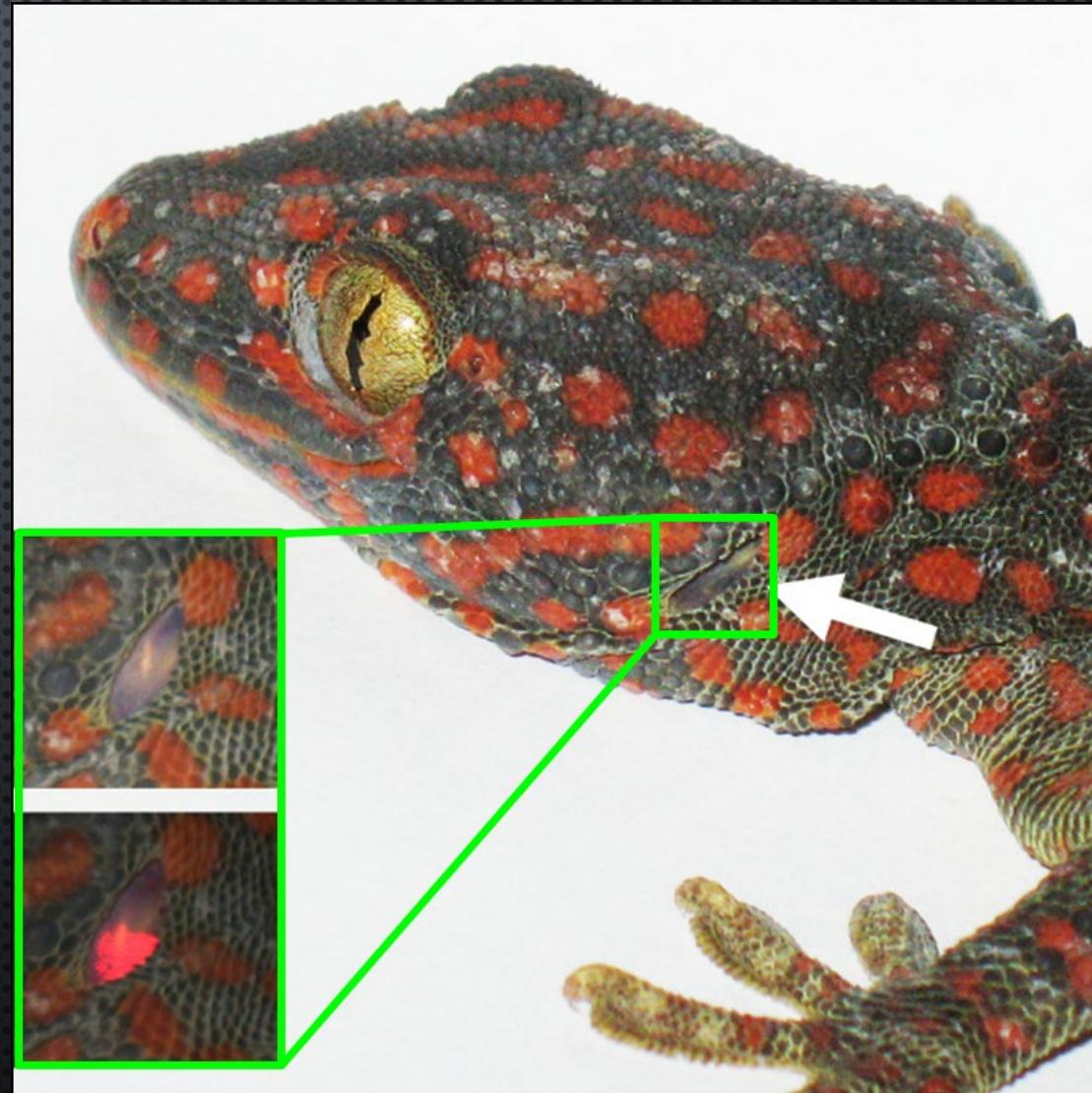
# Basics of acoustics: diffraction

- Two ways to determine sound direction
  - Inter-aural **level difference** (ILD)
  - Inter-aural **time difference** (ITD)
- ILD = difference in sensed loudness (in dB) of sound at each ear
- ITD = difference in time of arrival (in  $\mu\text{s}$ ) of sound at each ear
- If sound frequency is high (**wavelength > distance between ears**), ILD is significant
- If sound frequency is low (**wavelength < distance between ears**) ITD is significant



# Characteristics of lizard hearing

- Small size (10–20 mm) w.r.t sound wavelengths (85–340 mm) → **sound diffracts around the head**
- Diffraction leads to small inter-aural level difference (ILD) (typically 1-2 dBs → **too small to measure without special, big, heavy and expensive equipment**)
- Tiny ( $\mu$ s scale) inter-aural time difference (ITD) information available to determine sound direction

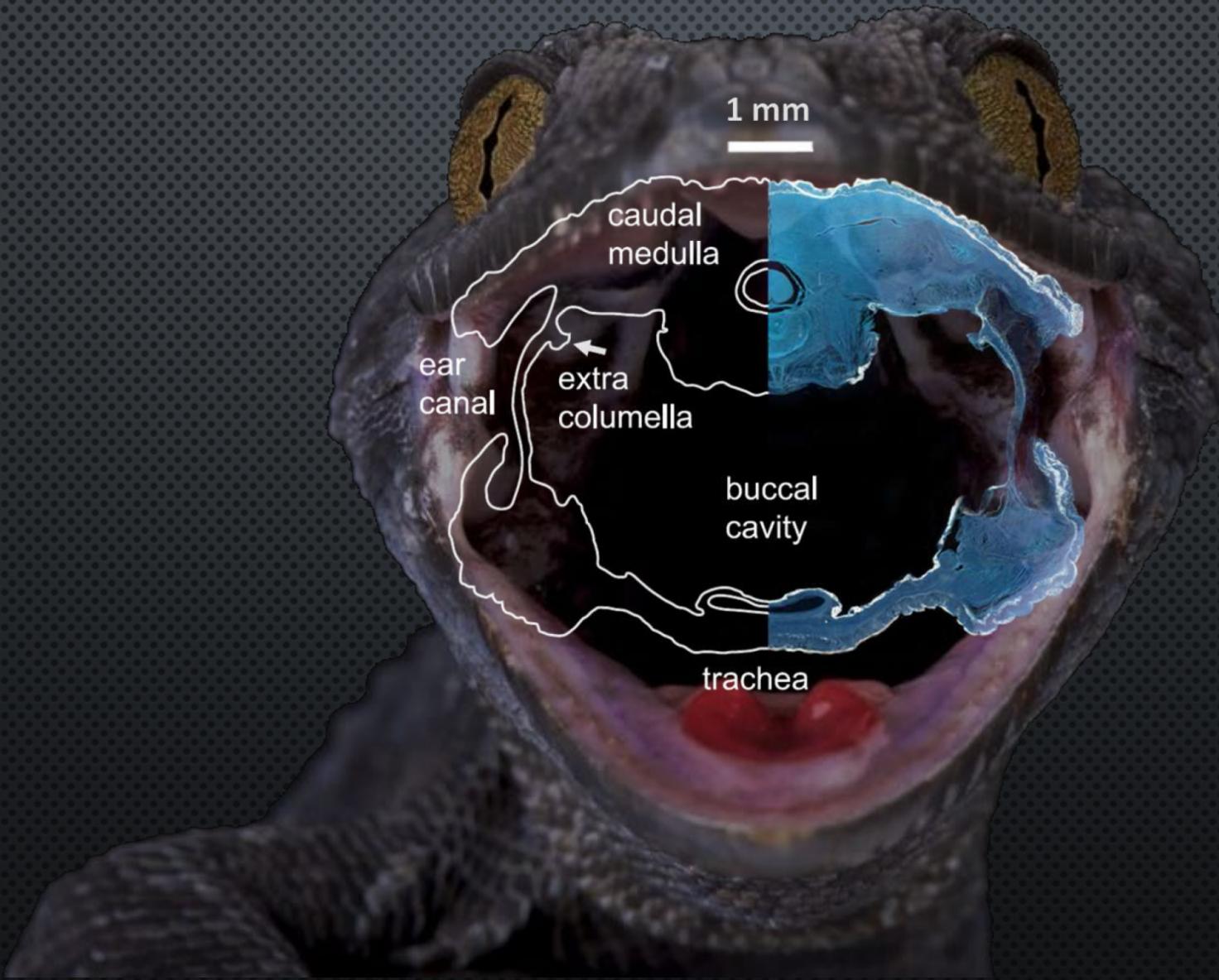


# Auditory directional cues

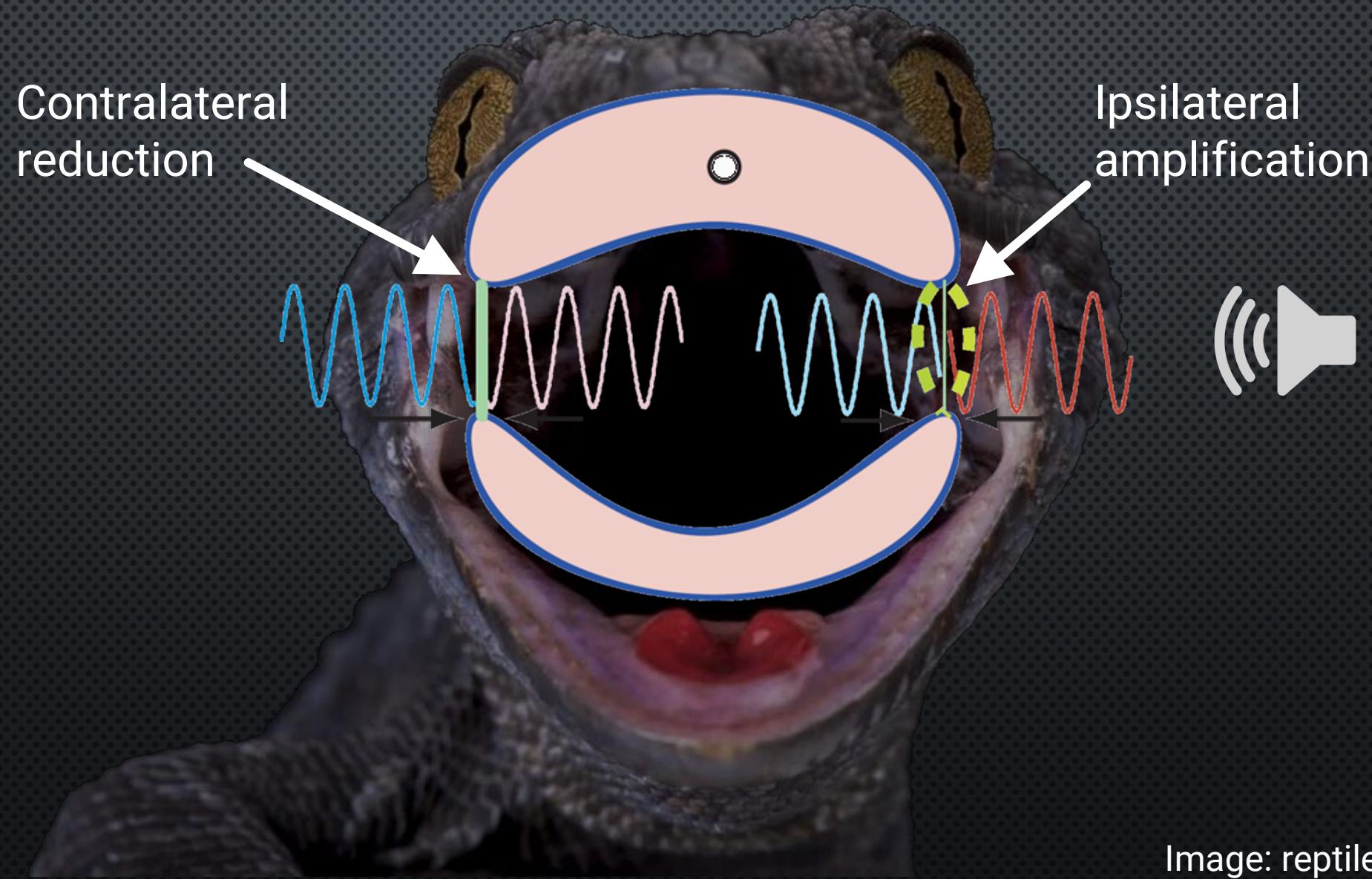


Image: [reptilepark.com.au](http://reptilepark.com.au)

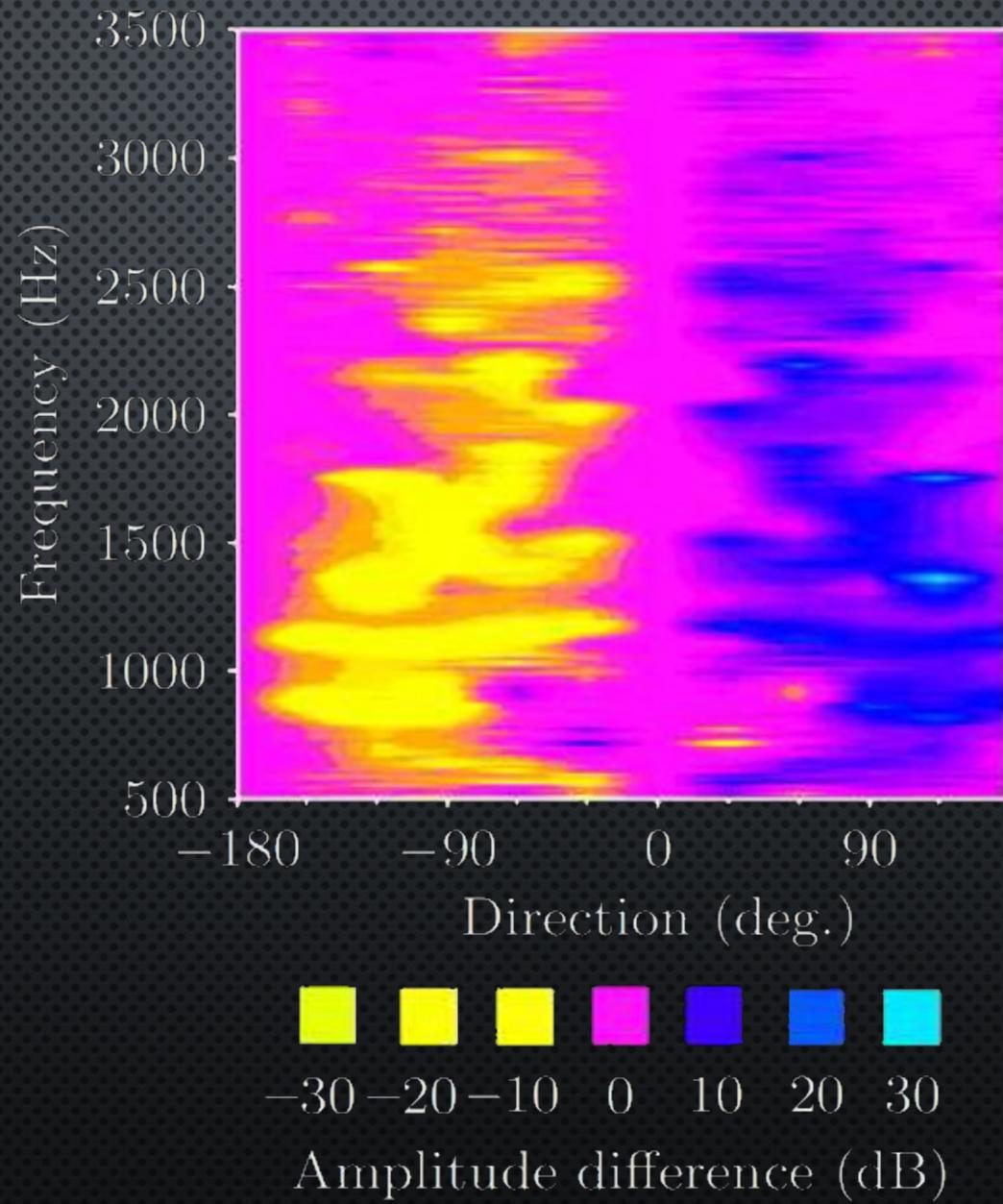
# Auditory directional cues



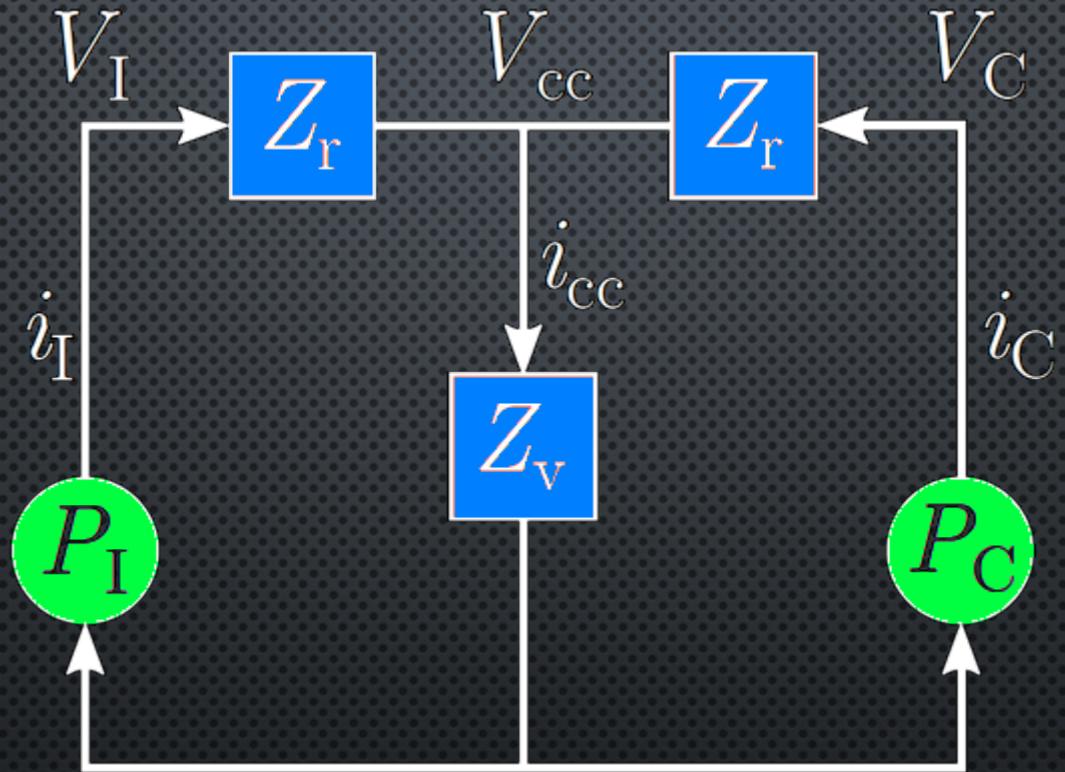
# Auditory directional cues



# Sound direction information

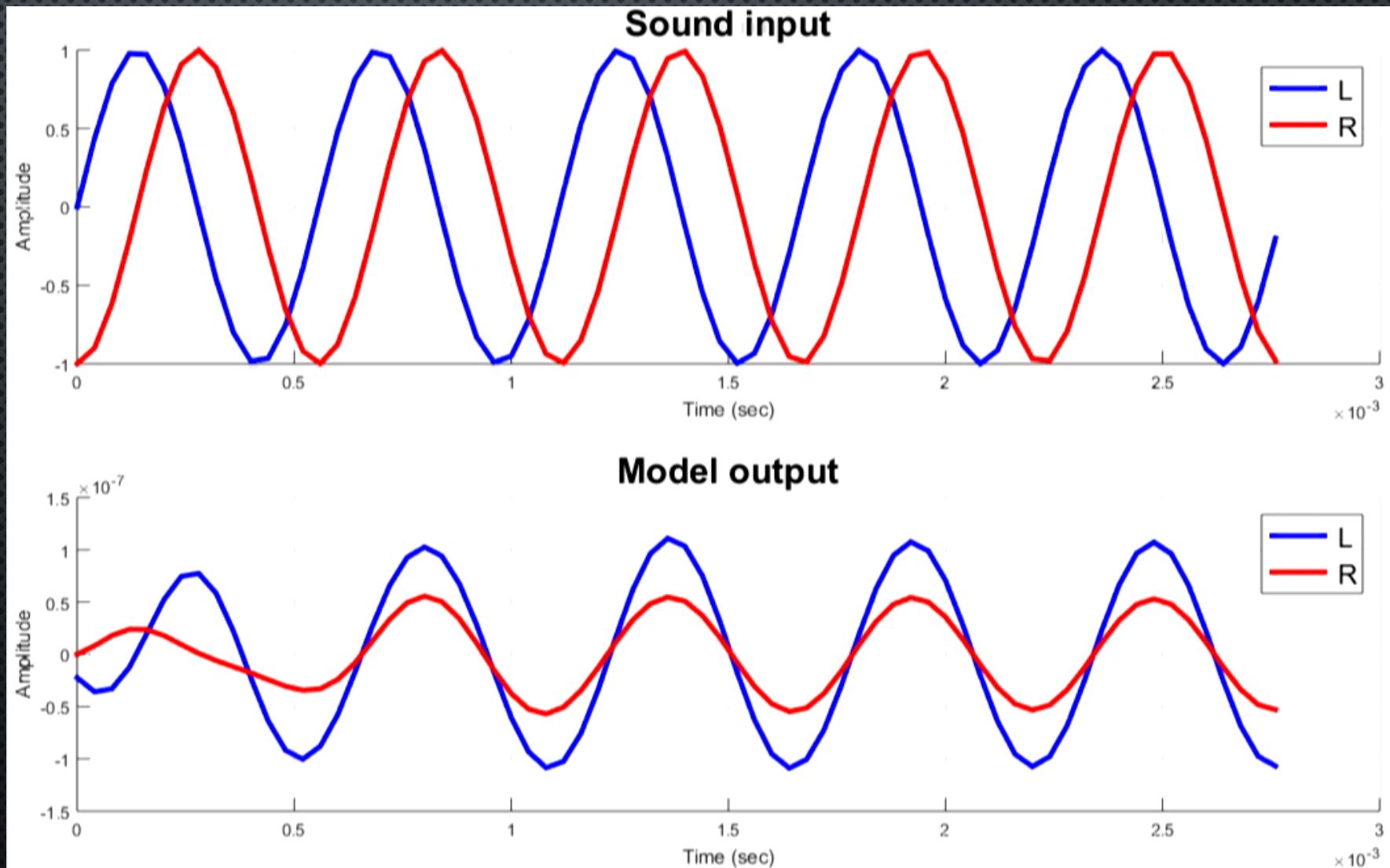
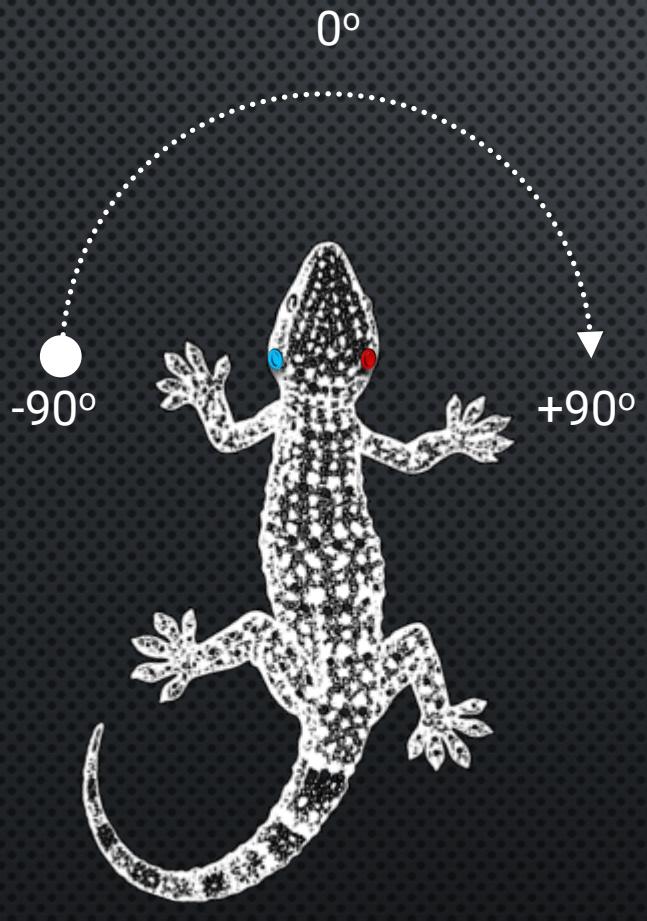


# Sensor model

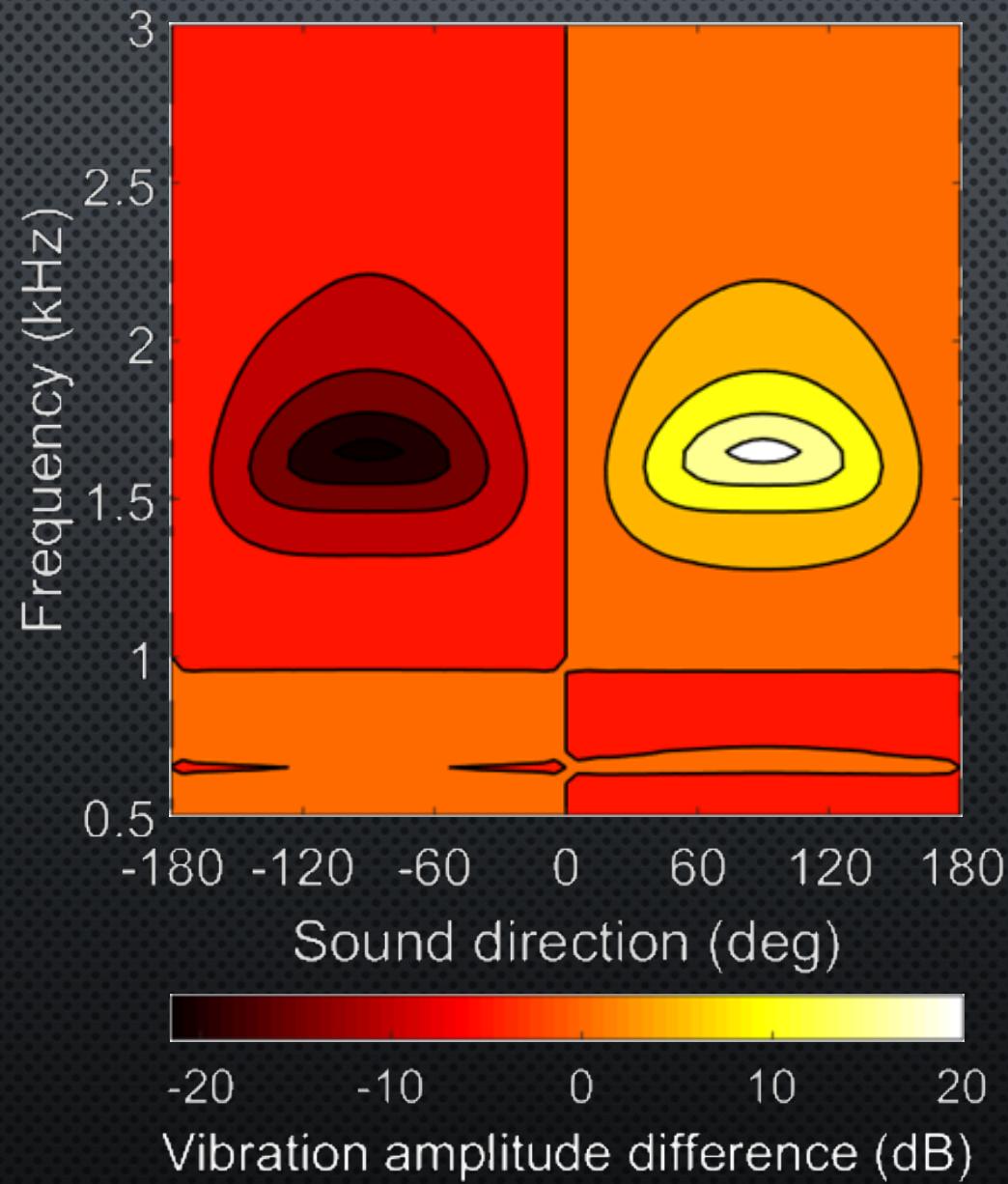


$$\left| \frac{i_I}{i_C} \right| = \left| \frac{G_I \cdot V_I + G_C \cdot V_C}{G_C \cdot V_I + G_I \cdot V_C} \right| \equiv 20 (\log |i_I| - \log |i_C|) \text{ dB}$$

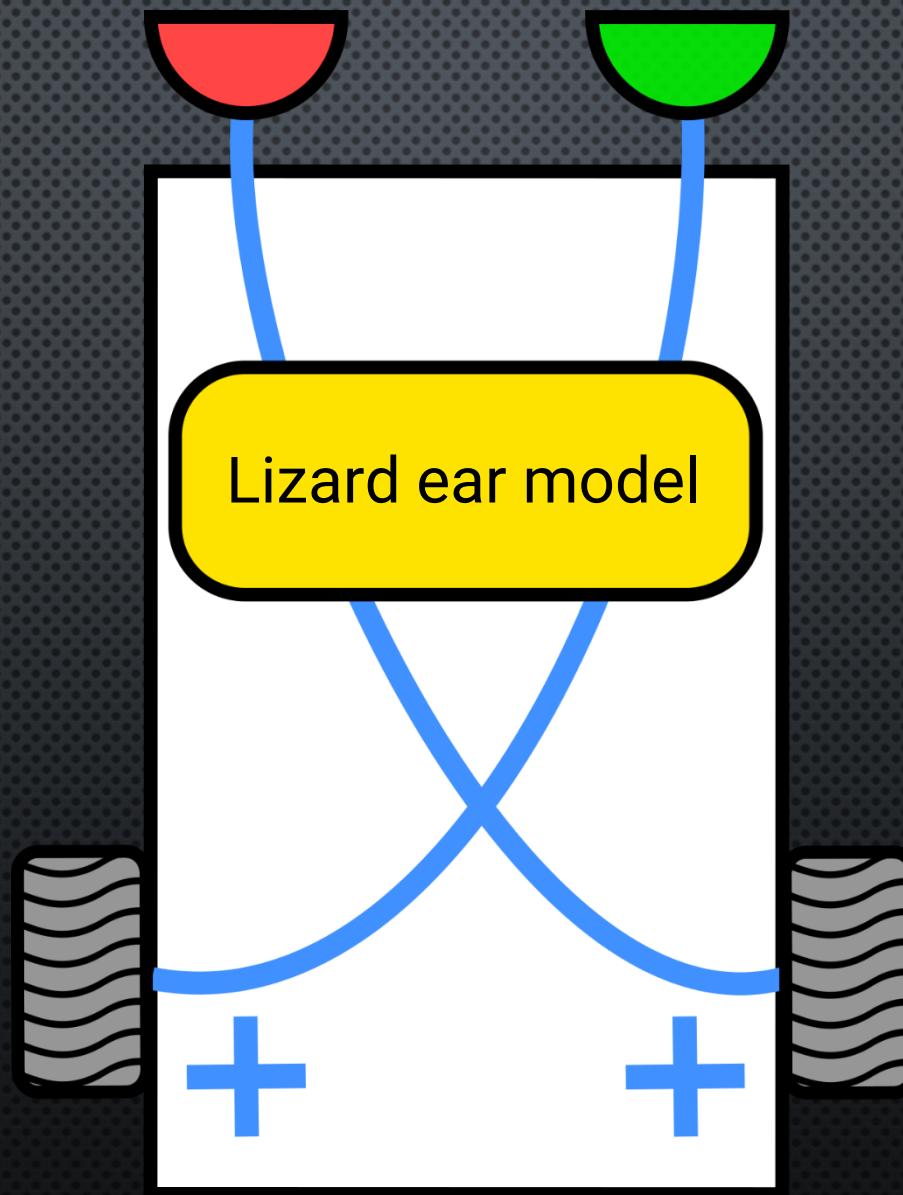
# Model response in the azimuth



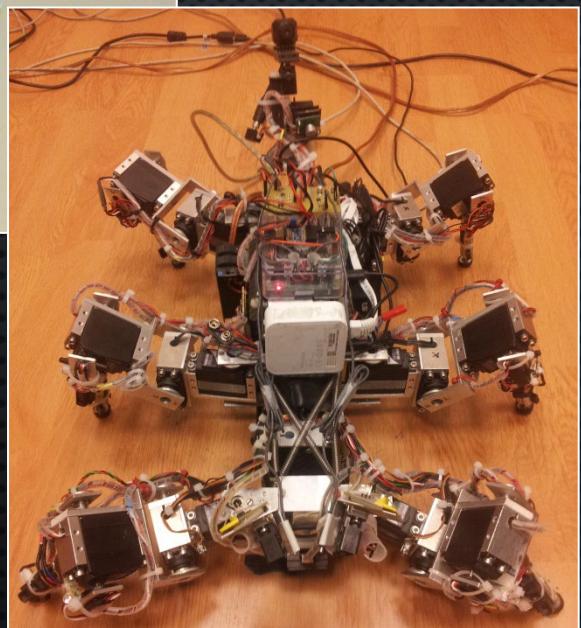
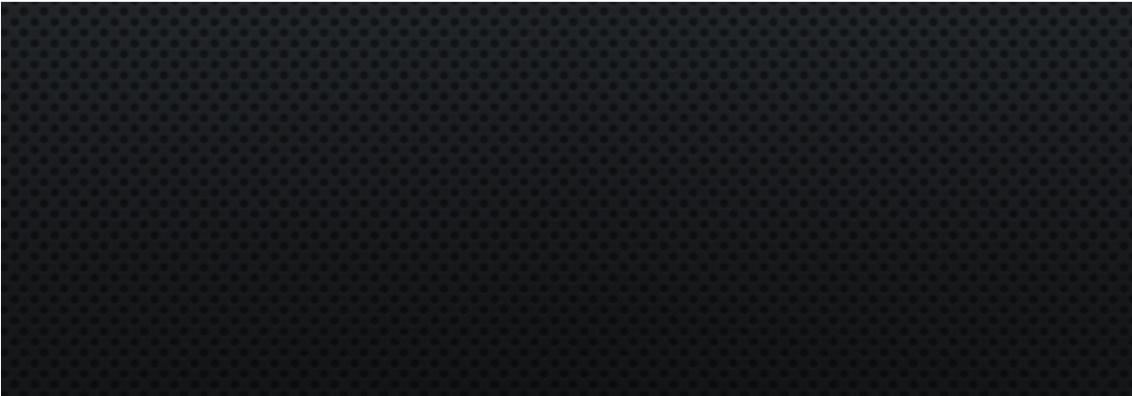
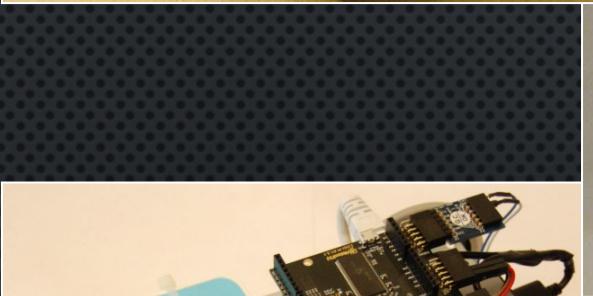
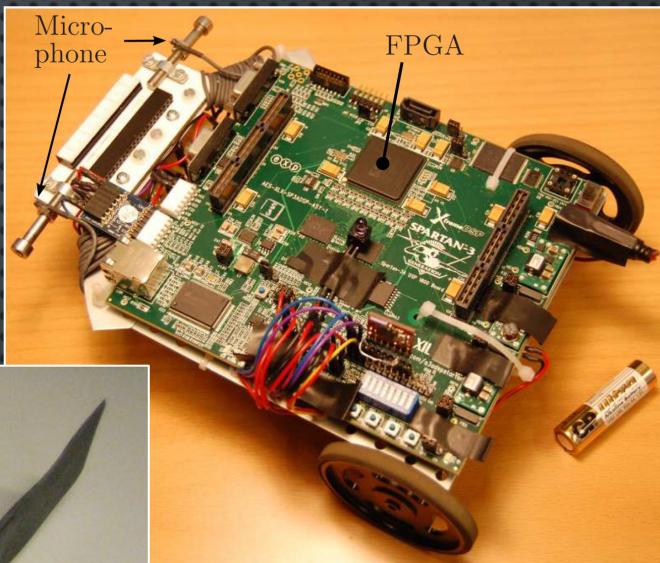
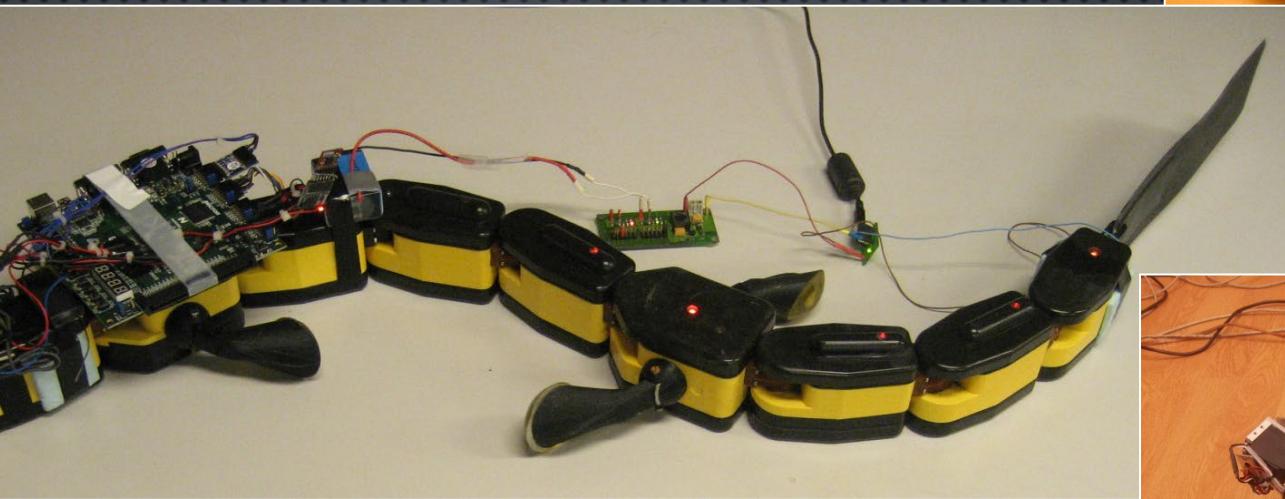
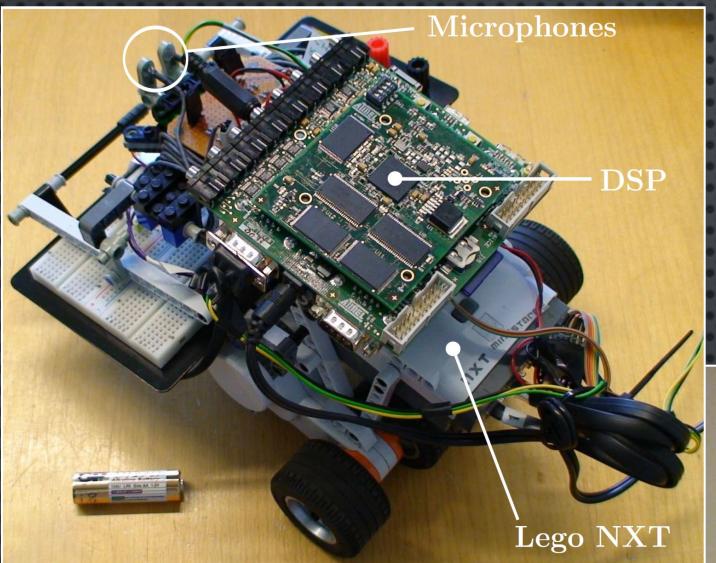
# Model response in the azimuth



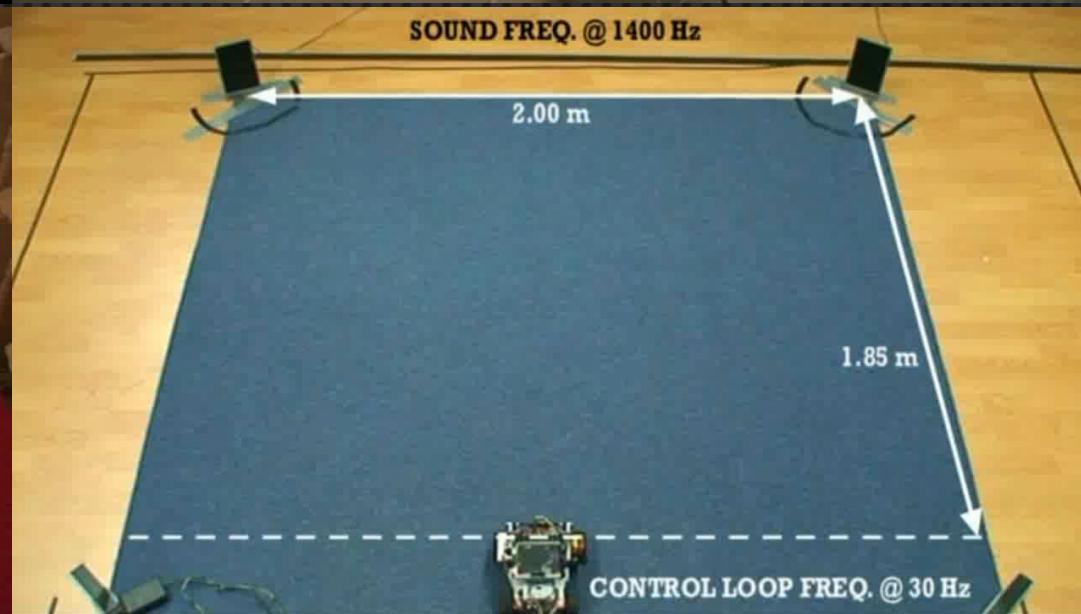
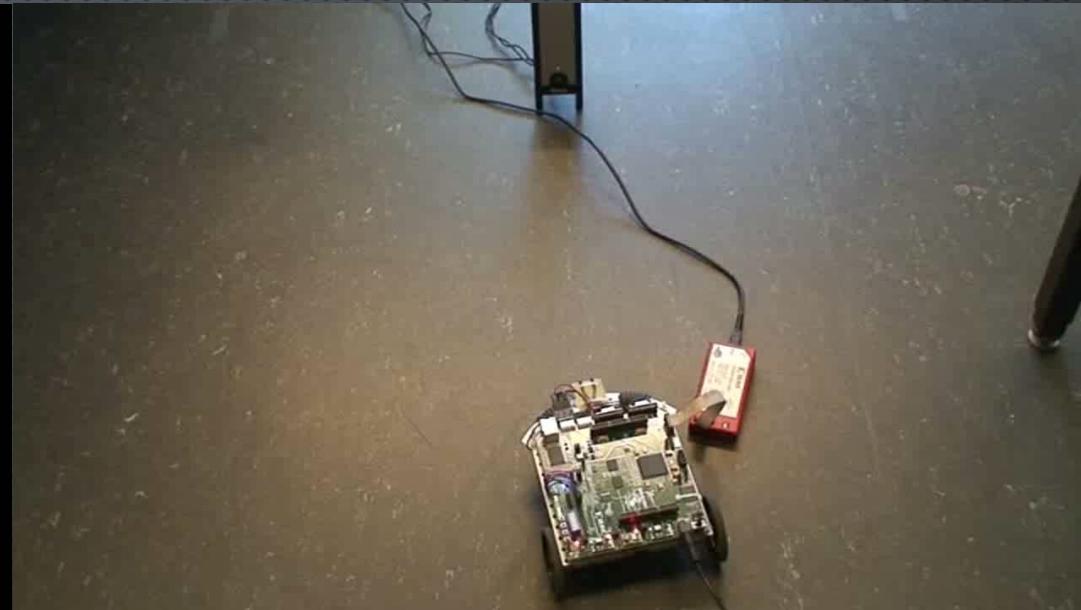
# A Braatenberg model for sound localisation



# Biologically-inspired sound localising robots (by yours truly)



# Biologically-inspired sound localising robots (by yours truly)



## Case study 2

A cockroach-inspired gas leak localising robot

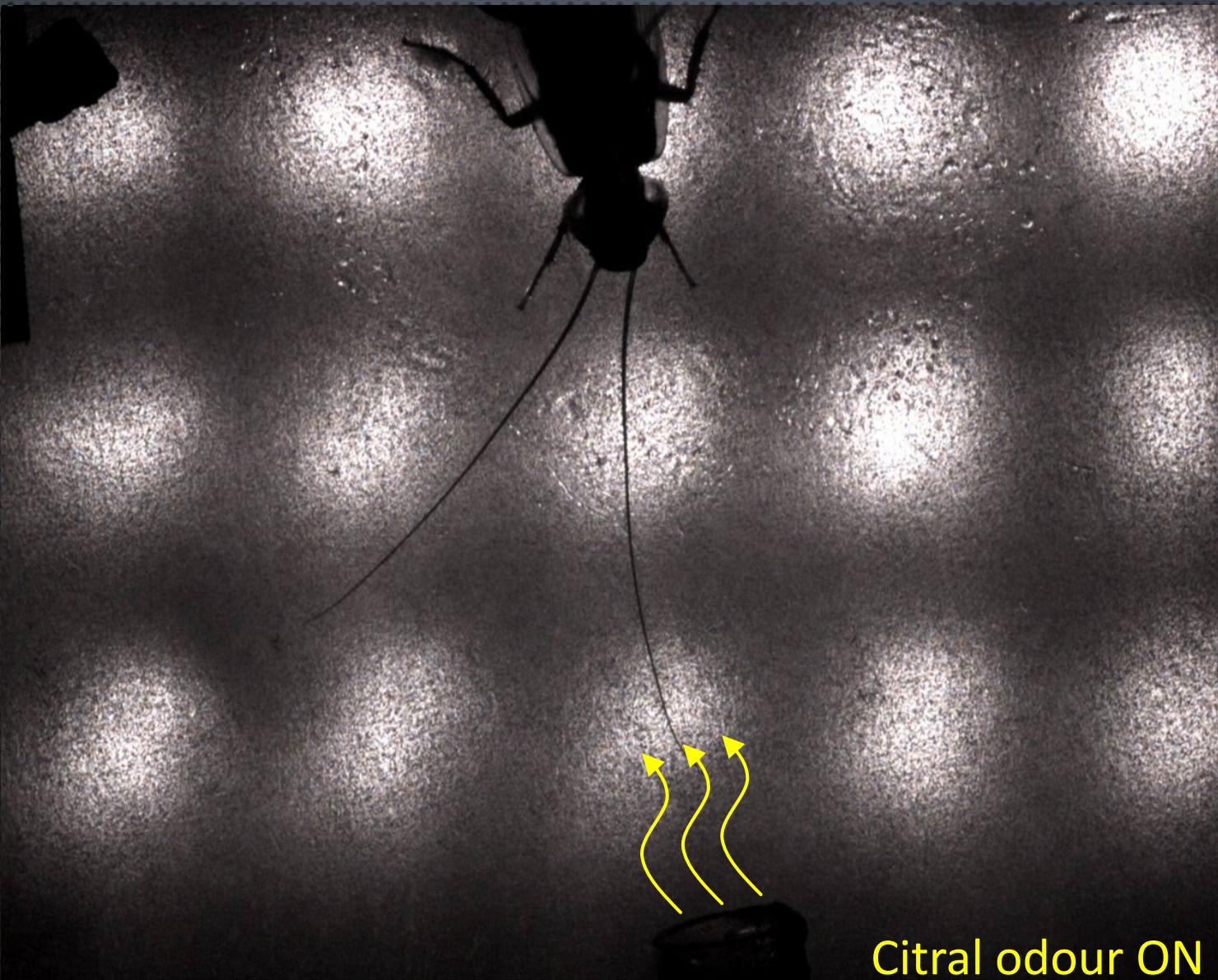
# Cockroach olfaction



# Observing the animal

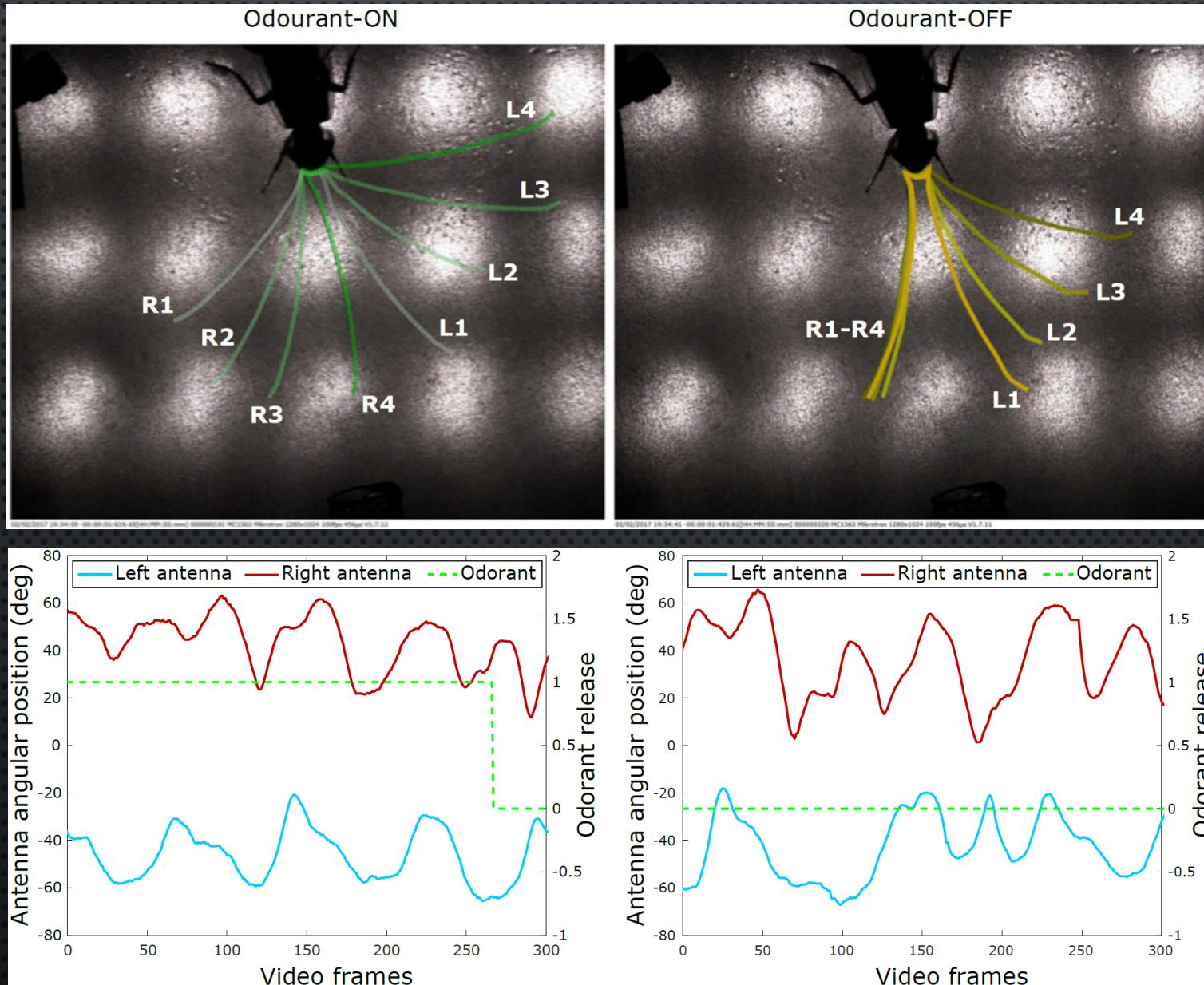


# Antennal response to chemical odours

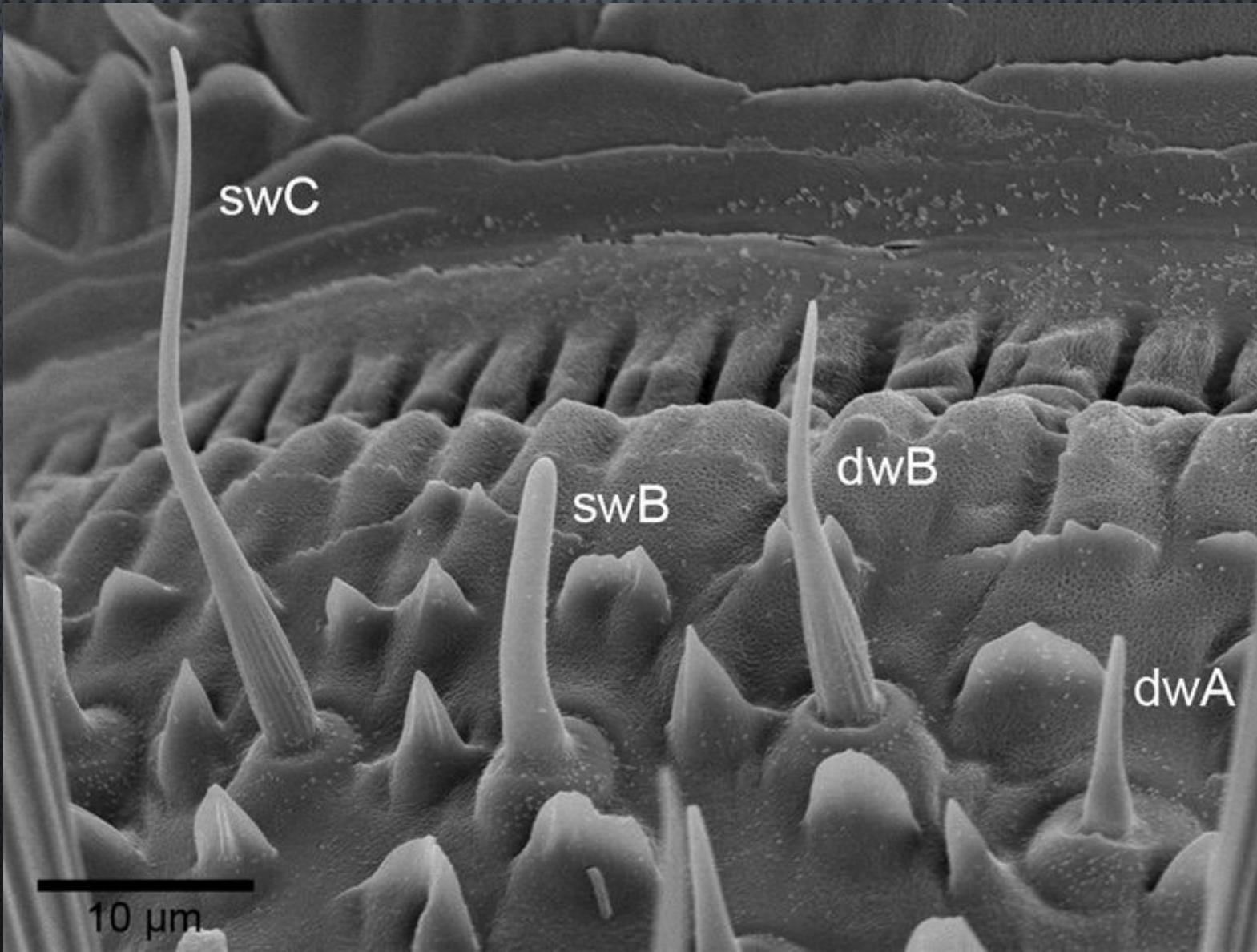


Citral odour ON

# Antennal response to chemical odours

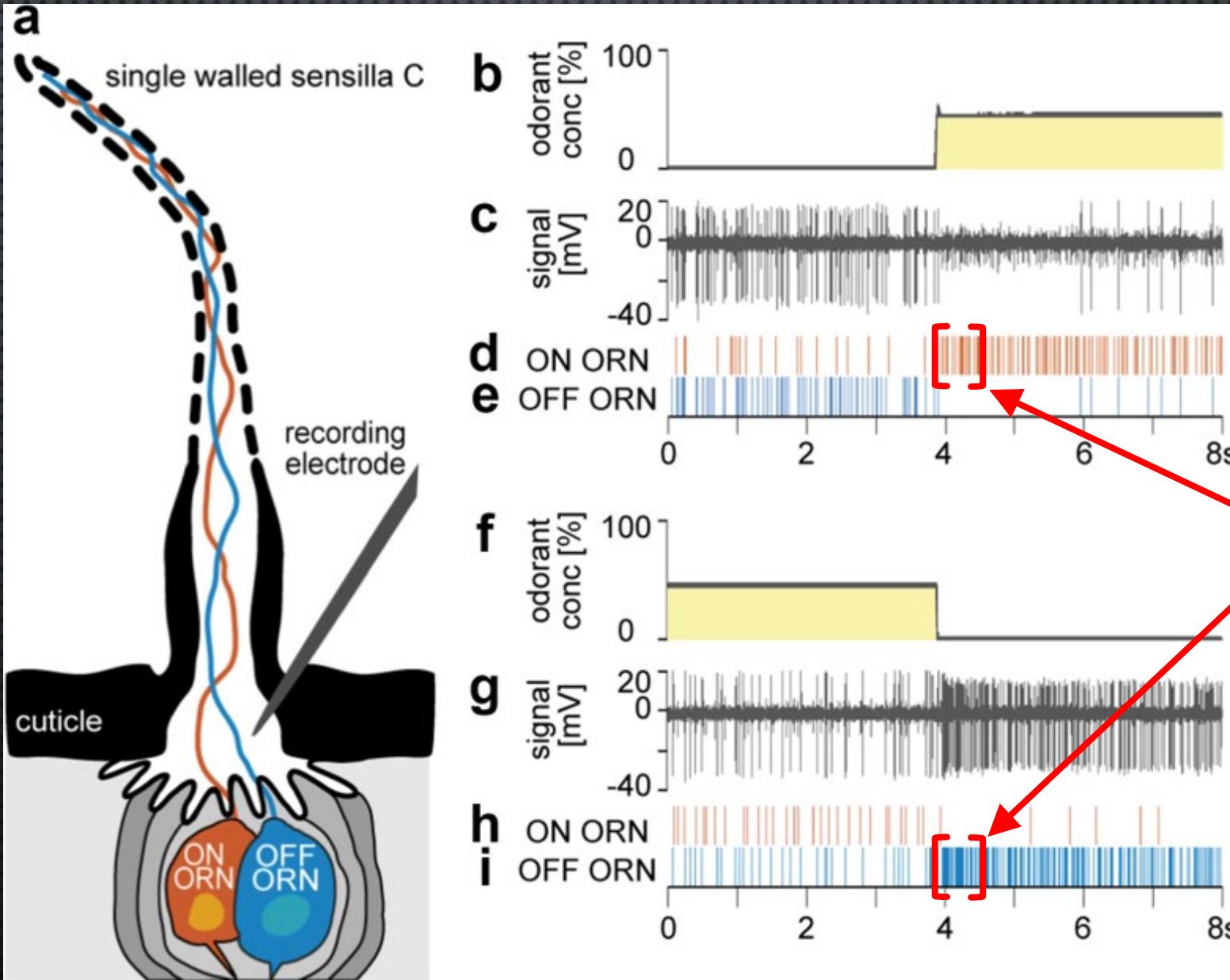


# How do cockroaches smell?

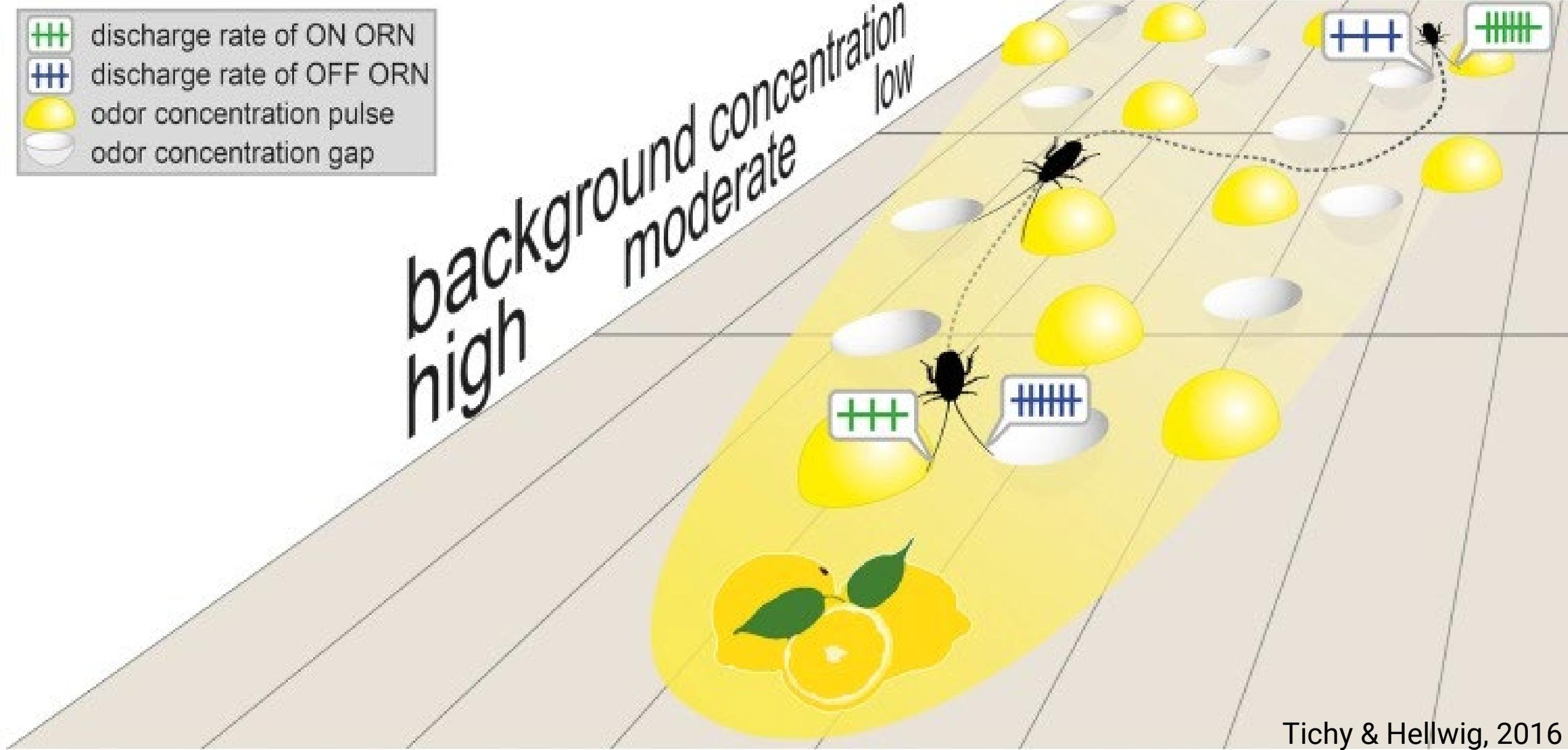


Tichy & Hellwig, 2018

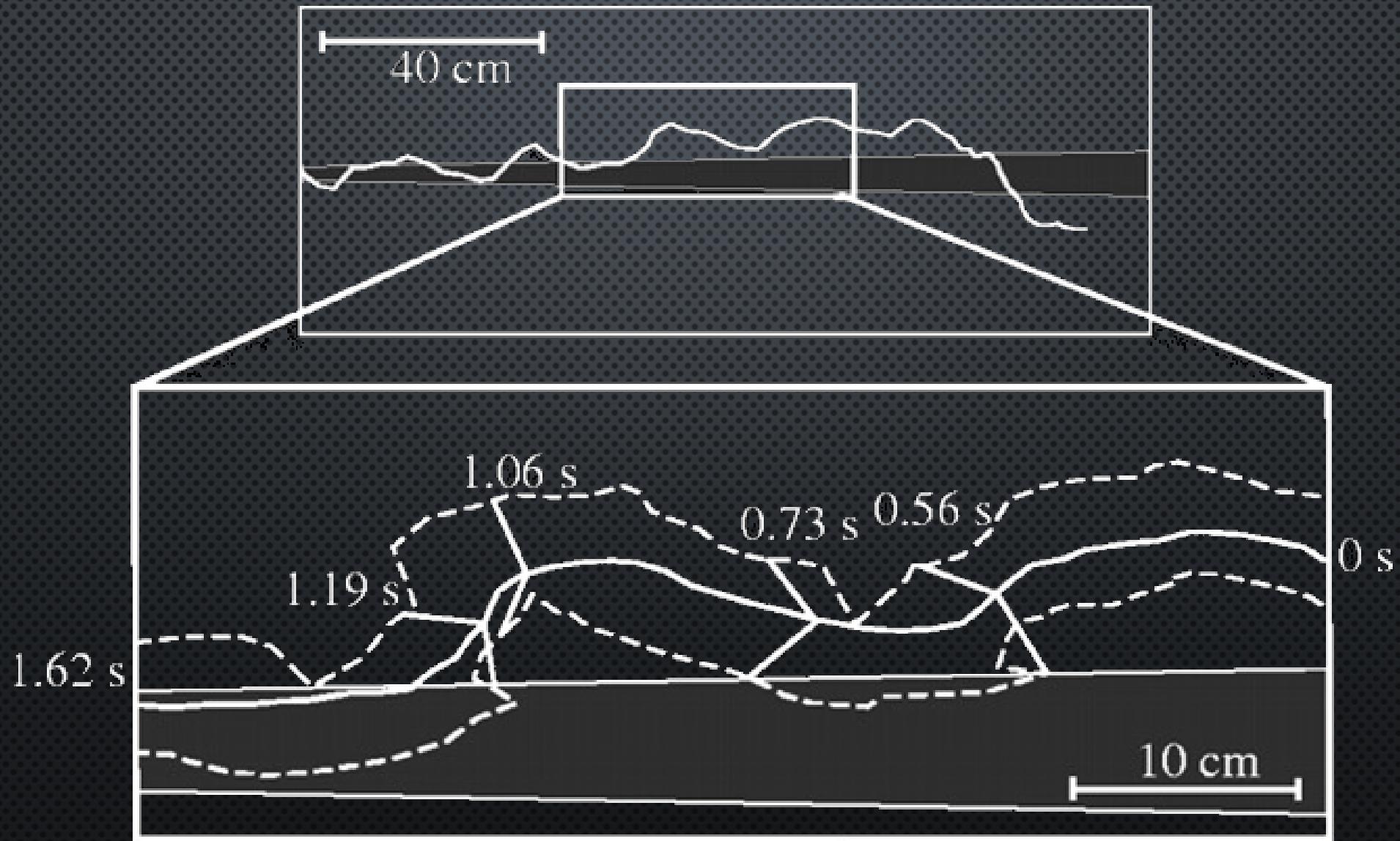
# Olfactory neurons (ORNs) encode odour concentration gradient



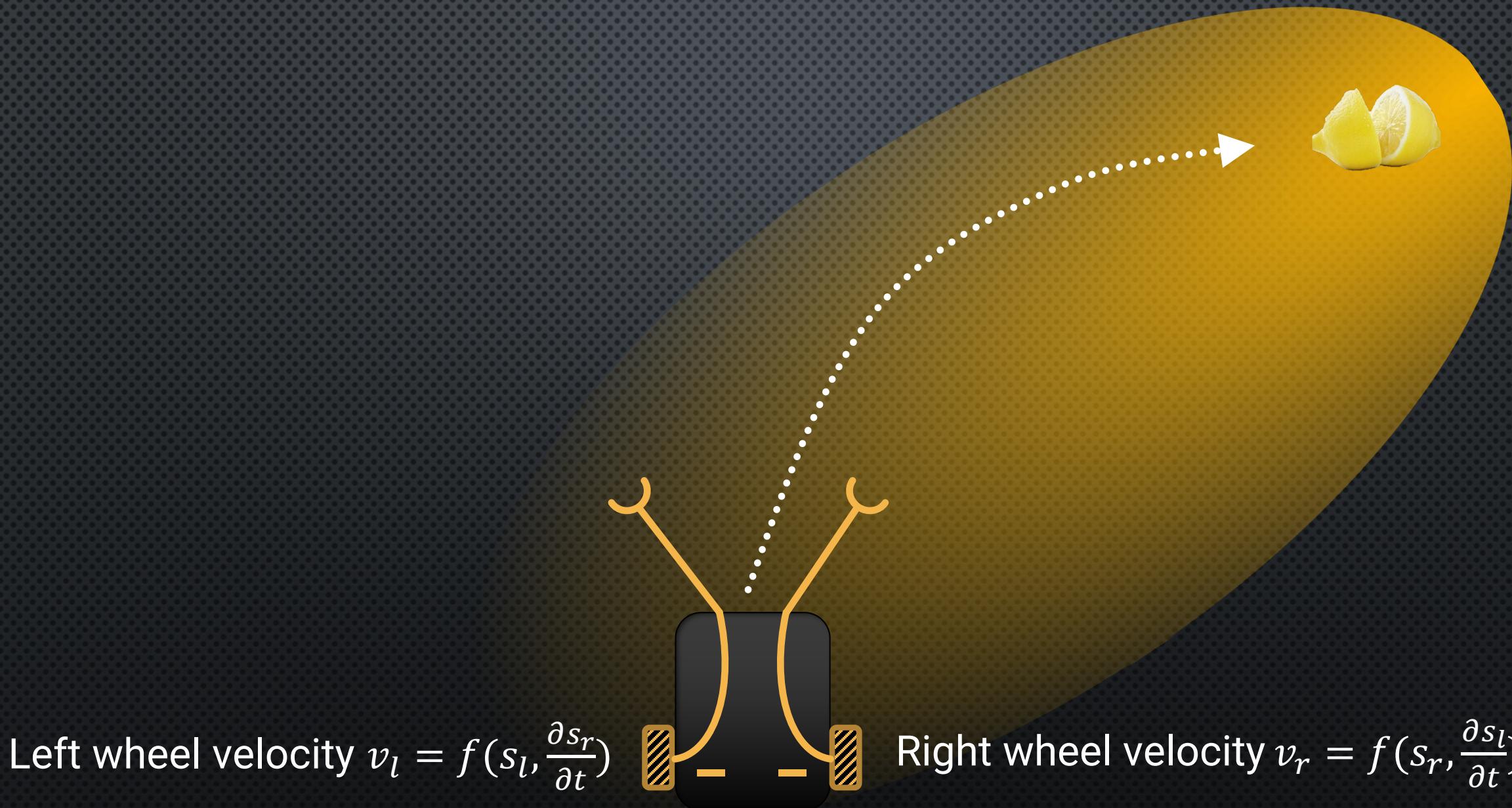
# From neurons to behaviour: a hypothesis



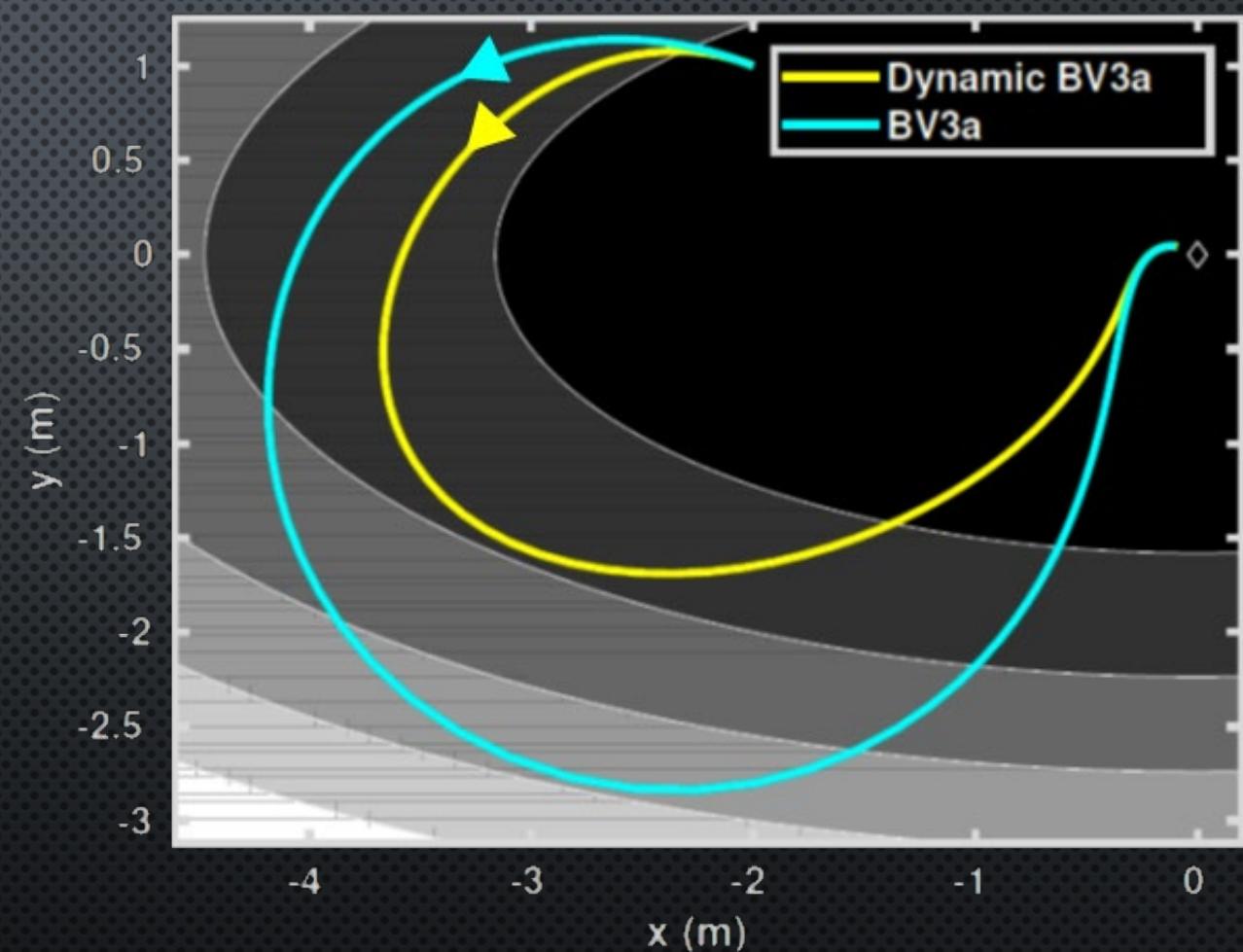
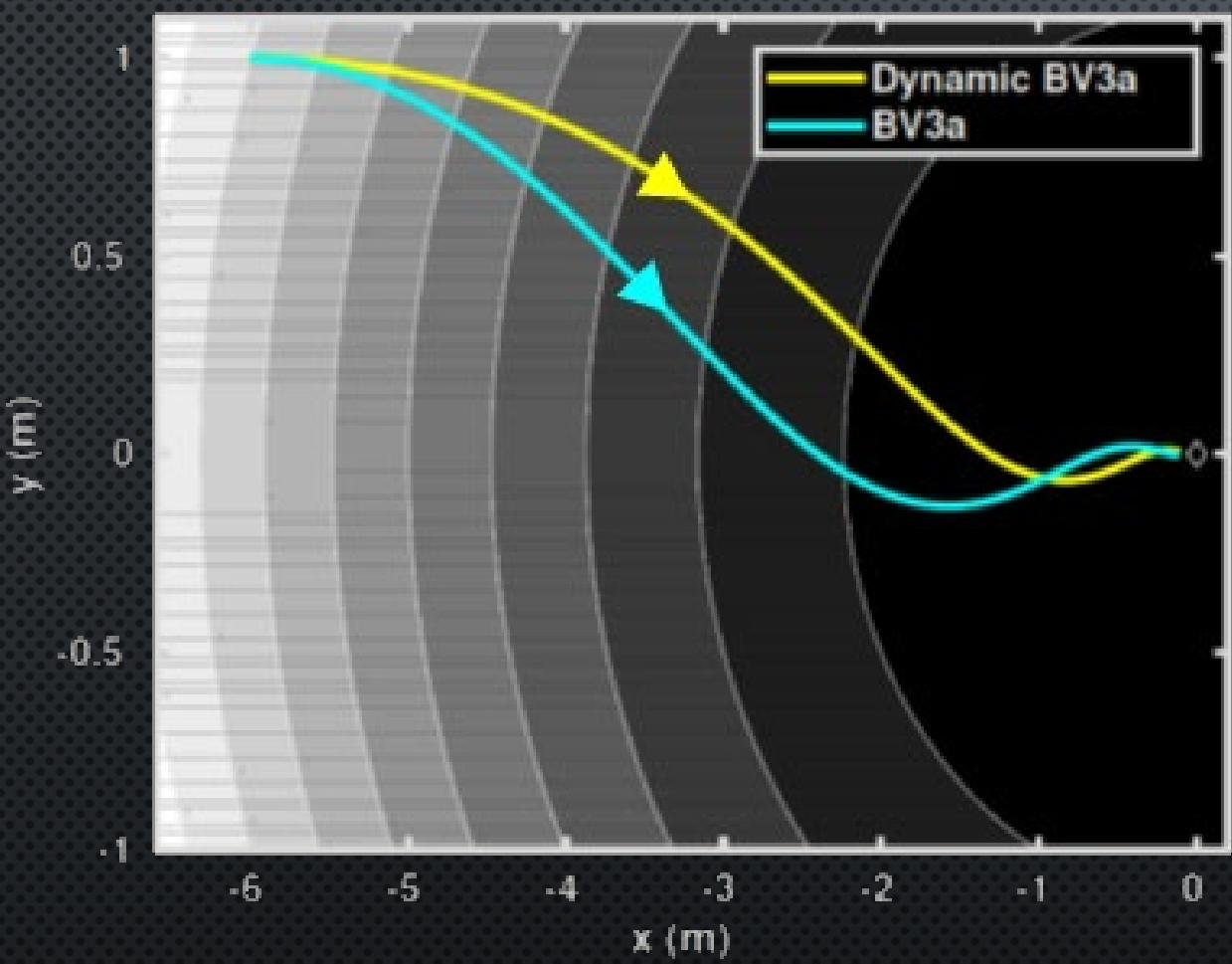
# Biological cockroach trajectories



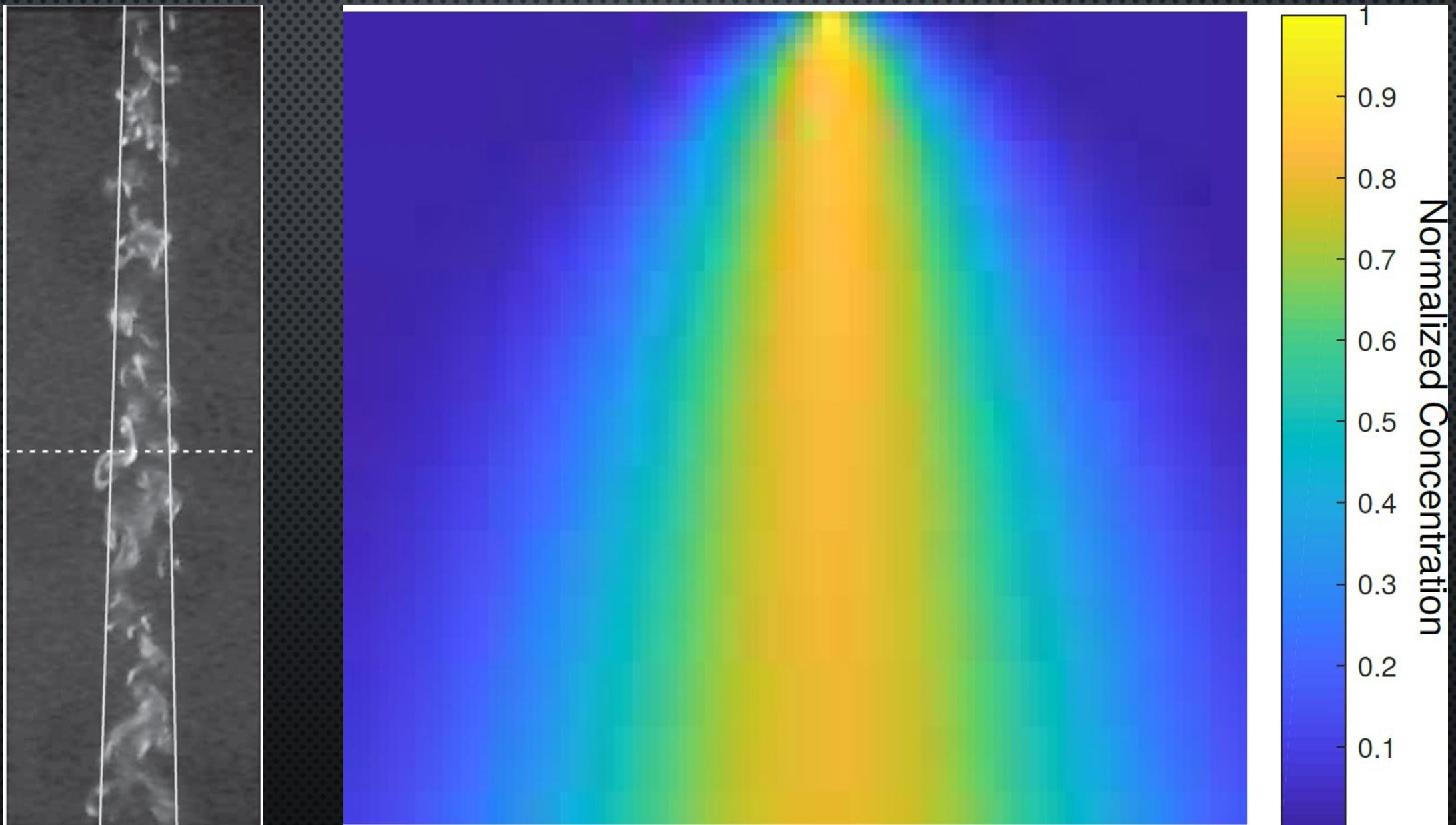
# A Braatenberg model for odour localisation (static antennae)



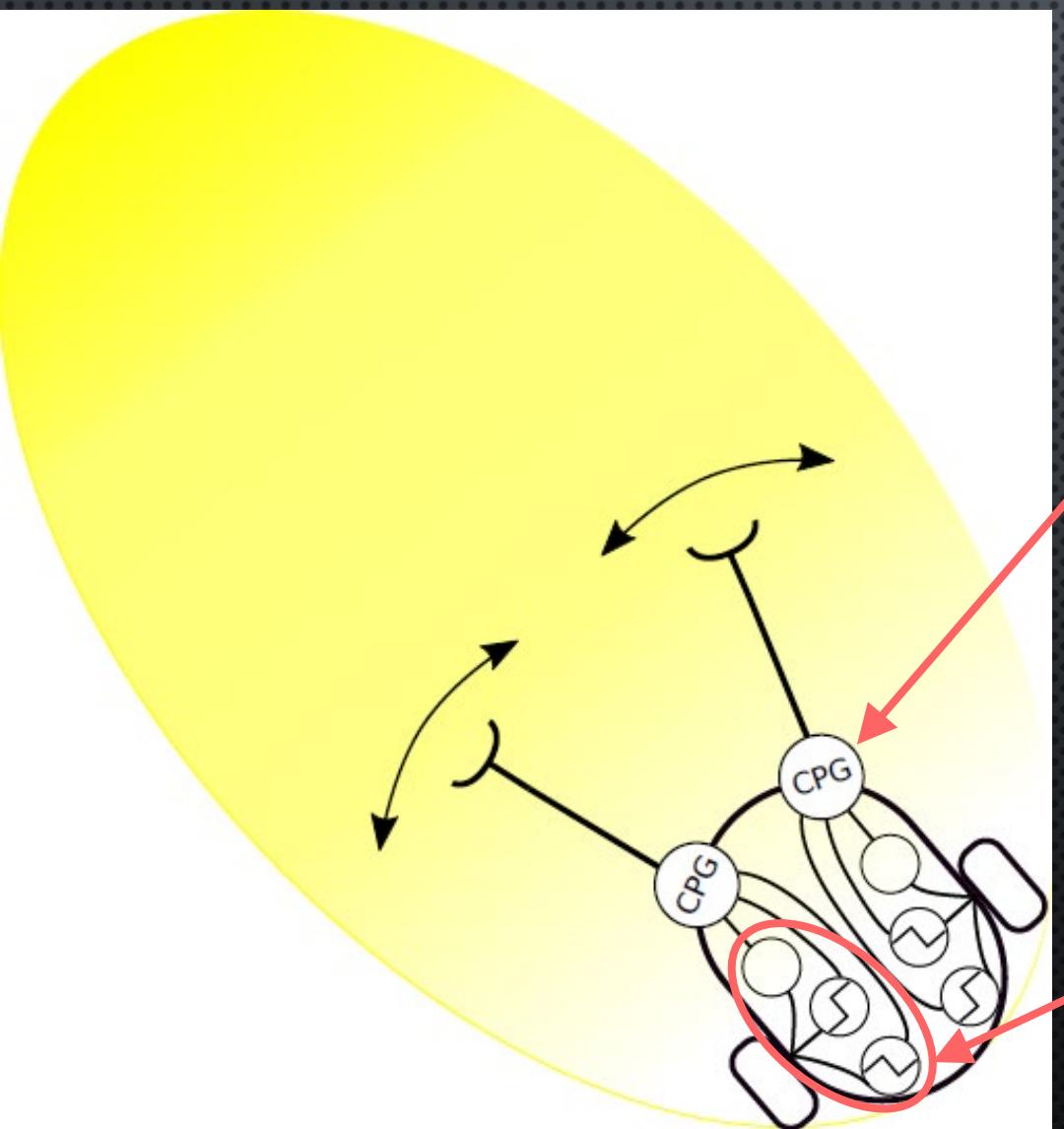
# Taxis with and without stimulus dynamics (static antennae)



# Task environment



# A Braatenberg model for odour localisation (moving antennae)



$$\begin{aligned}\dot{u} &= (\mu^2 - r) \cdot x + \omega y \\ \dot{v} &= (\mu^2 - r) \cdot y + \omega x \\ r &= (x^2 + y^2)\end{aligned}$$

Antenna CPG parameters:  
 $\mu$  = steady state amplitude  
 $\omega = 2\pi f$  = angular velocity

$c_{l/r}$  = instantaneous odour concentration  
 $s_{l/r}$  = total stimulus  
 $v_{l/r}$  = wheel velocity

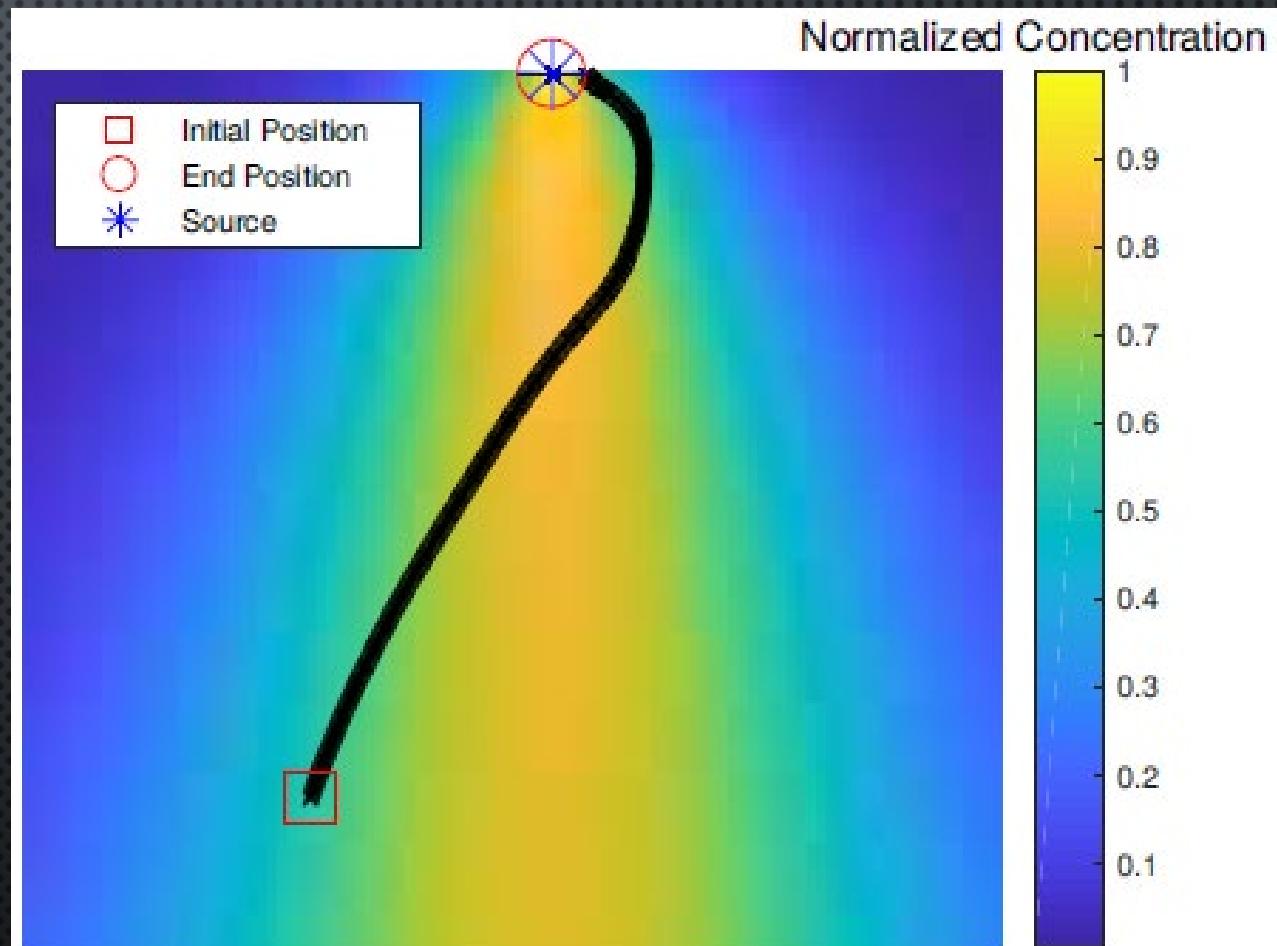
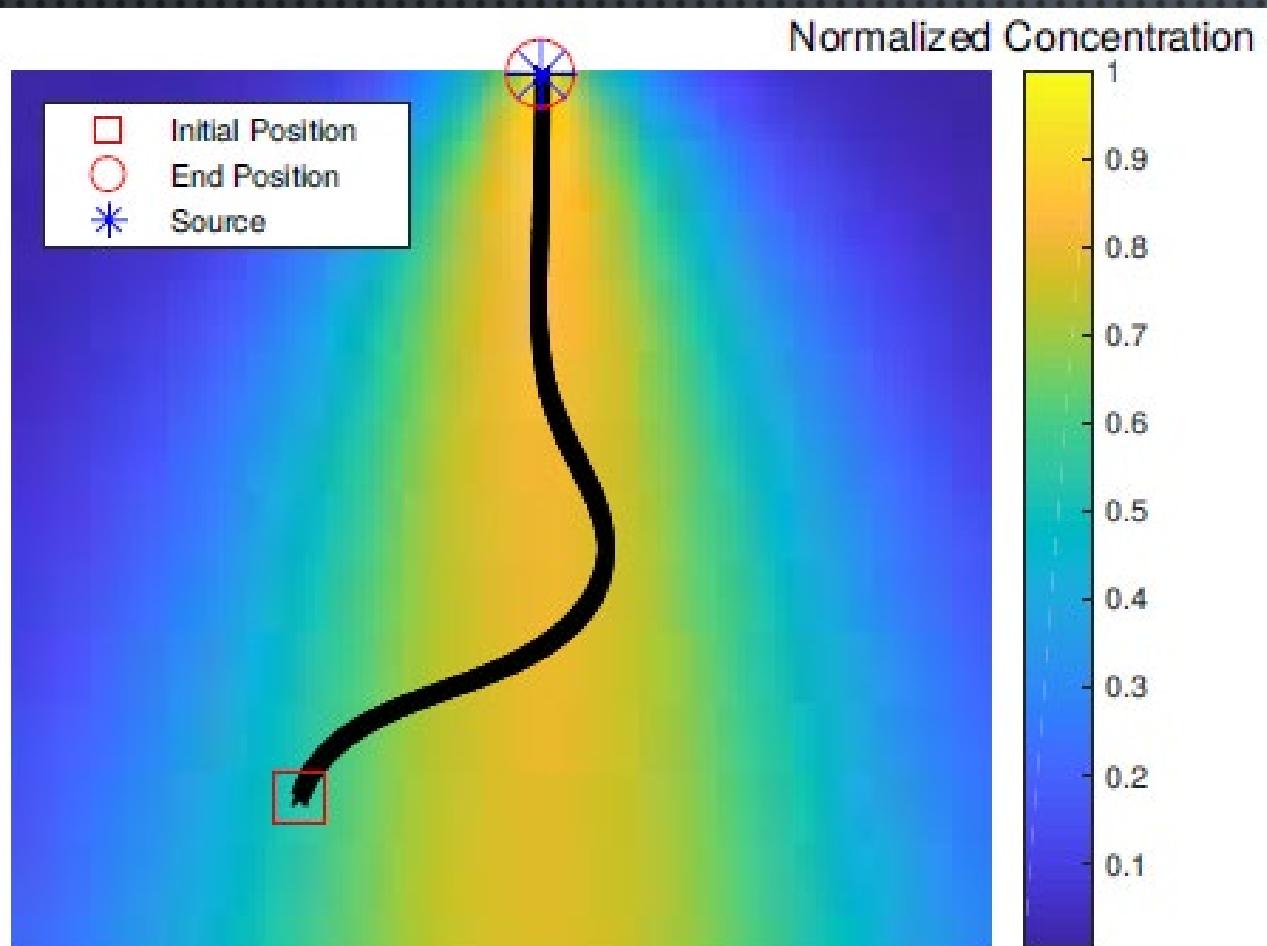
$f(\dot{c}_{r/l})$  = Heaviside step function  
(ON neuron model)

$f(-\dot{c}_{r/l})$  = Heaviside step function  
(OFF neuron model)

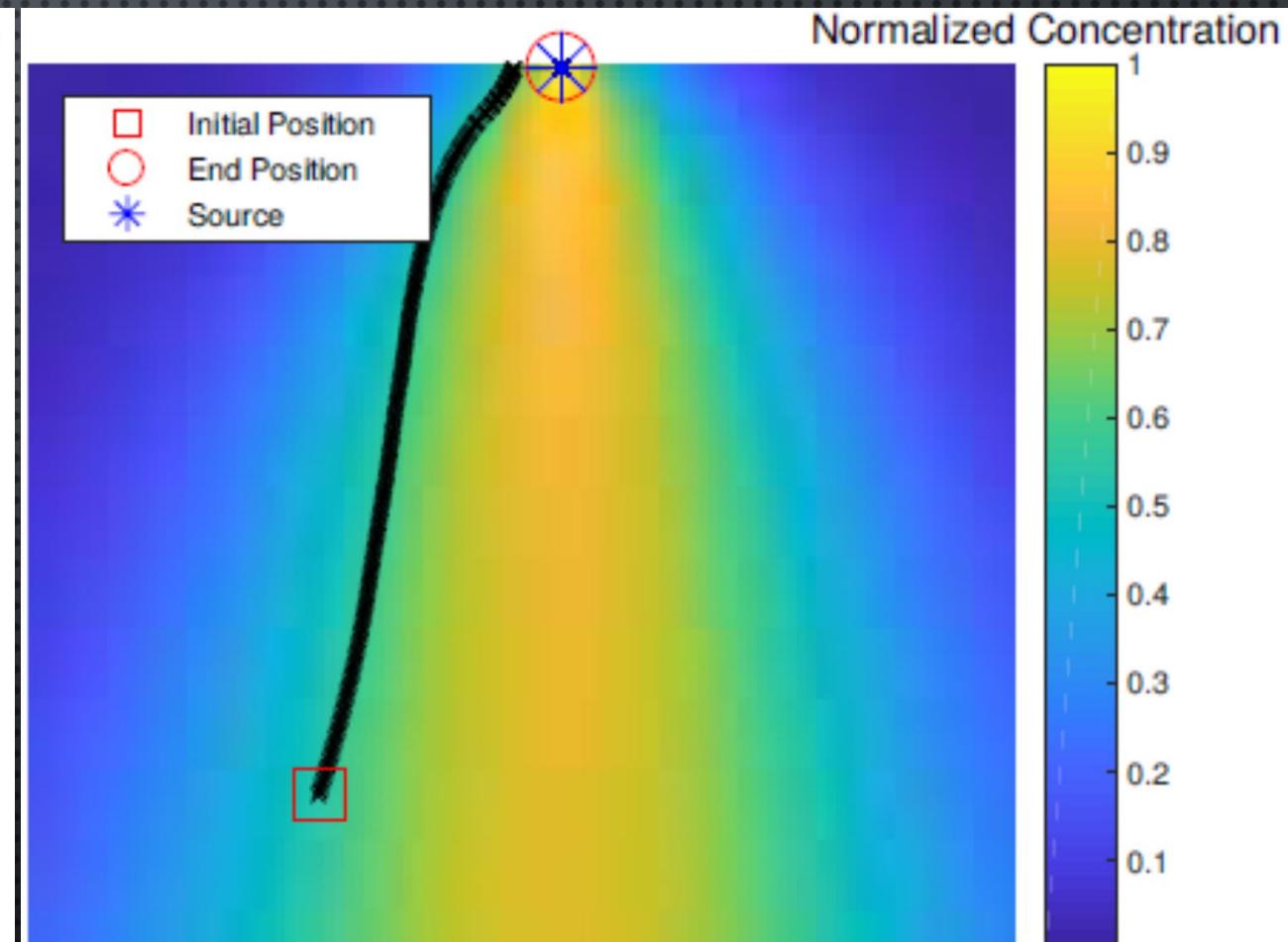
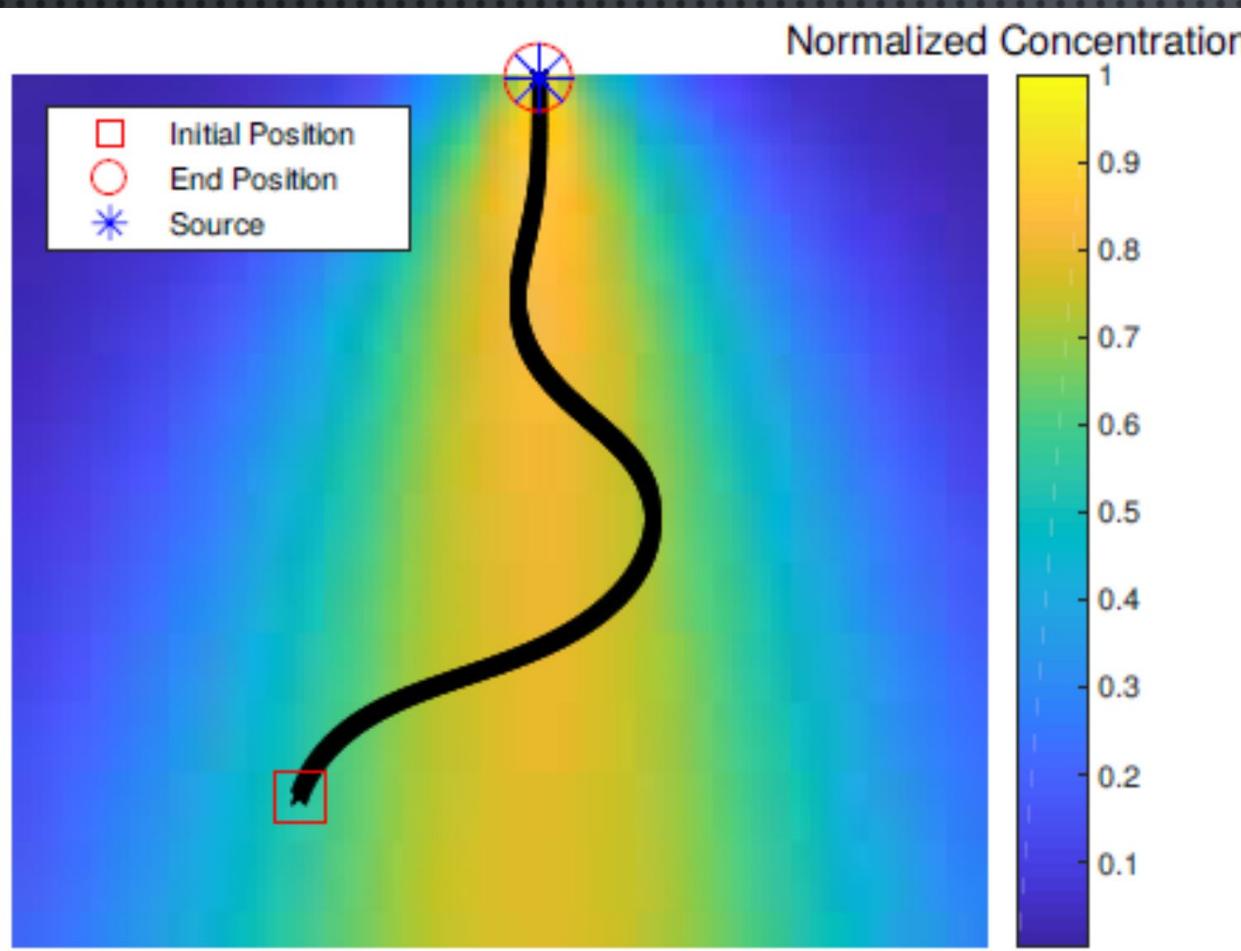
$$\begin{aligned}c_{l/r} &= C(x_{l/r}, y_{l/r}) \\ s_{l/r} &= K_n c_{l/r} + K_d f(-\dot{c}_{r/l}) + K_i f(\dot{c}_{r/l}) \\ v_{l/r} &= \alpha(s_M - s_{l/r})\end{aligned}$$

Sensorimotor coupling parameters:  
 $\alpha$  = gain term  
 $s_M$  = maximum stimulus  
 $K_n, K_d, K_i$  = gain terms

# Localising odour source (static antennae)



# Localising odour source (moving antennae)



# Matlab exercises

- Download “braitenberg\_gradient.m”
- Implement various light following Braitenberg vehicles and observe their behaviour
- Vary parameters and observe behaviour
  - *sensor\_width*
  - *add\_noise* and *snr\_db*
  - *robot\_pose*

