

# The Navigation Mechanism in a Rat's Brain

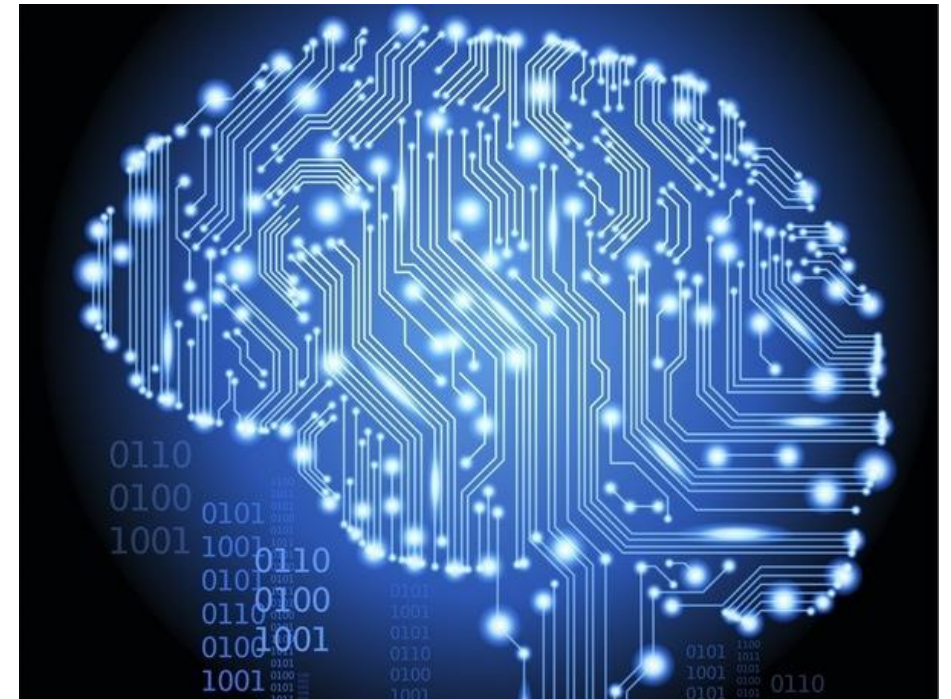
Yile Ying

1<sup>st</sup> June, 2018

# The purpose of this study

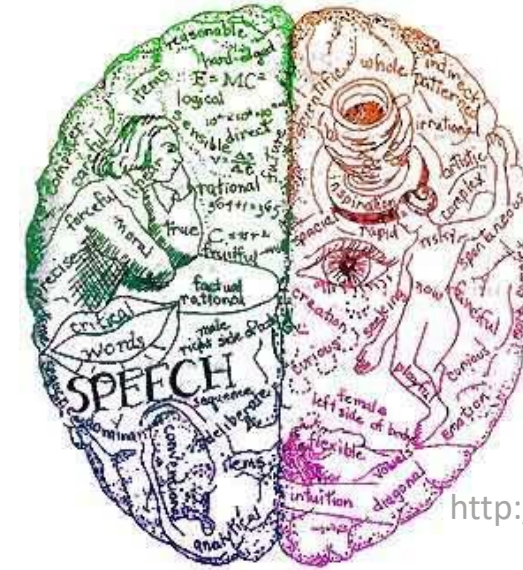
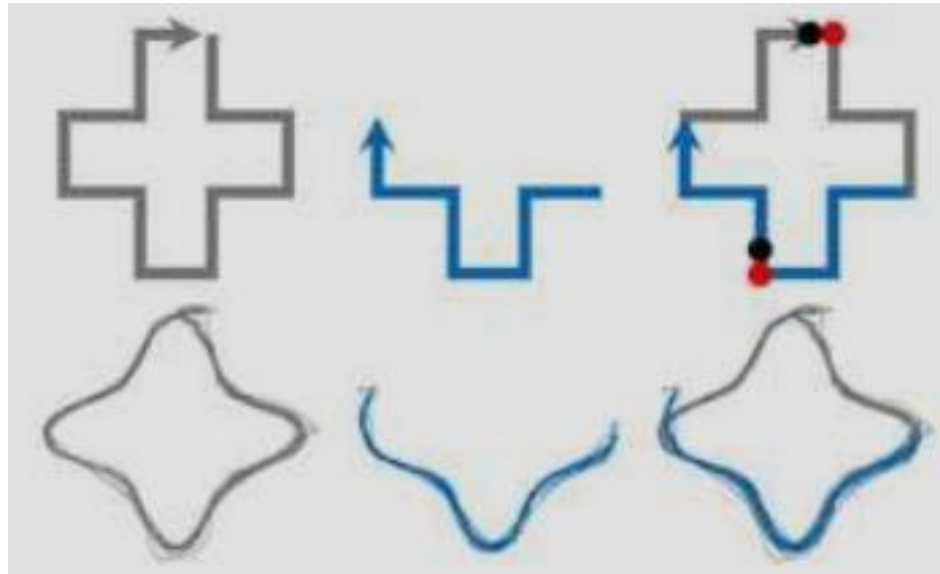
- Learn from nature
- Gain insights into nature

➔ Transfer findings into AI techniques

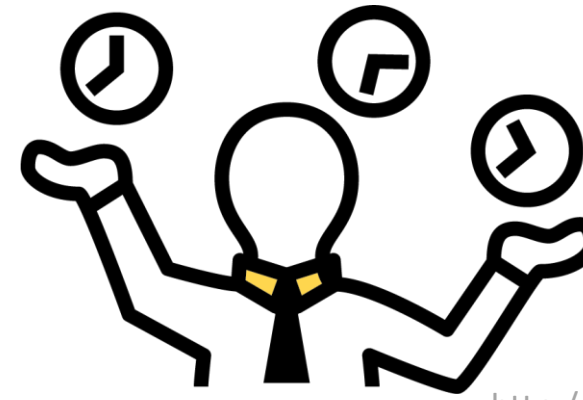


# Learn from nature

- Building-Block Mechanism
- Lateralization
- Time Representation



<http://think-bomb.blogspot.com>

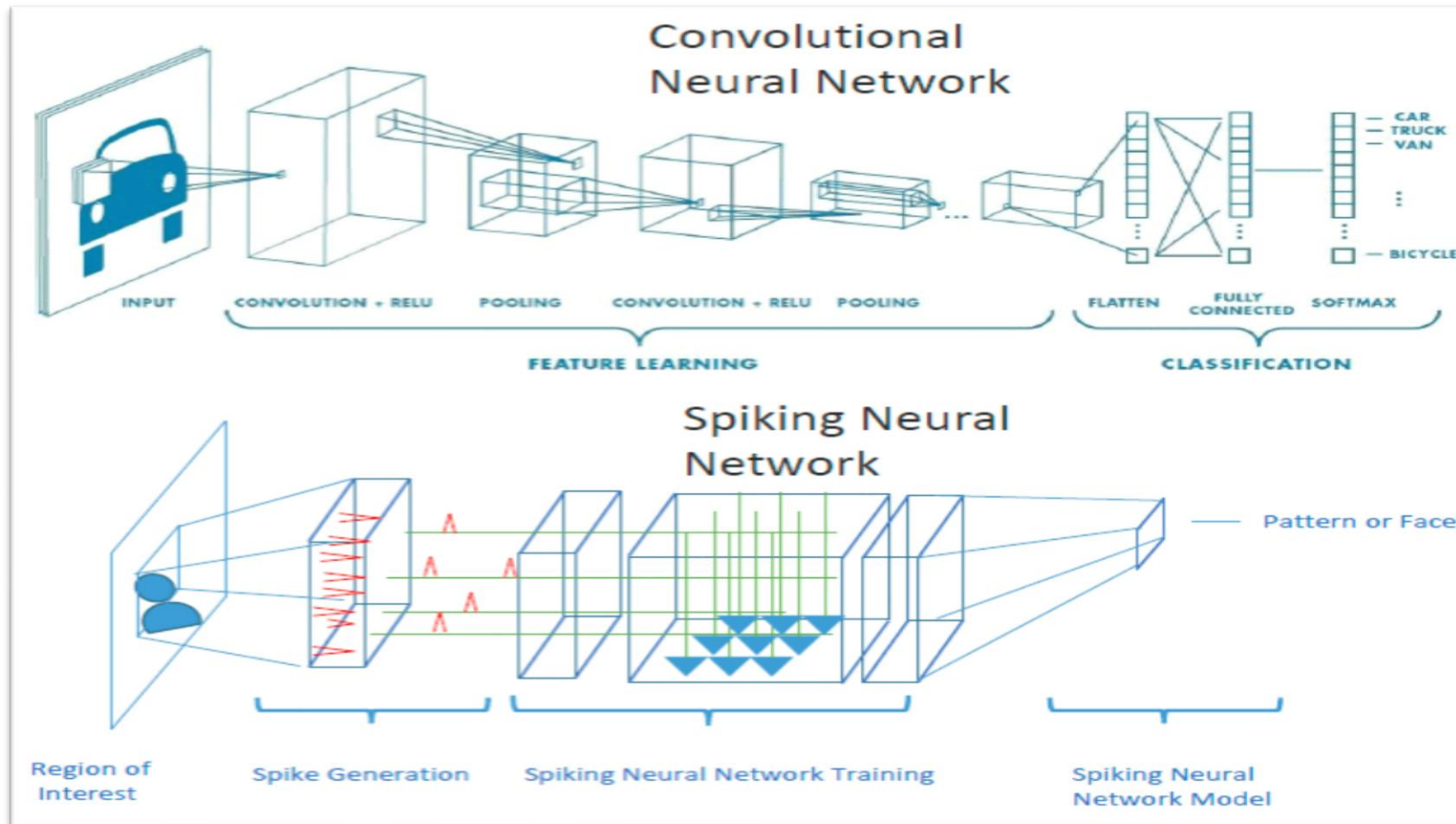


<http://ogaps.tamu.edu>

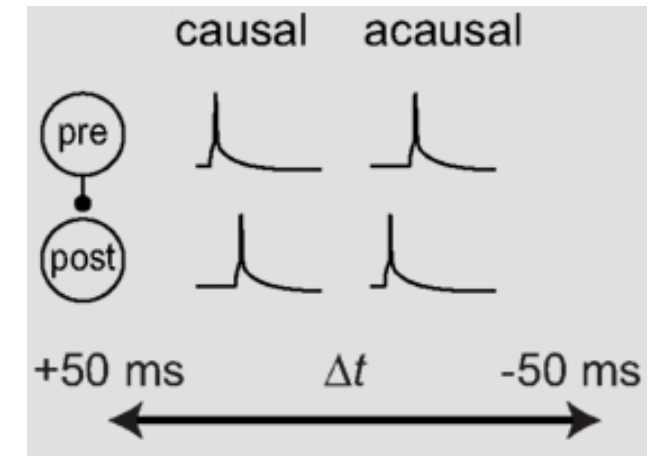
Image Source: A. S. Alexander, D. A. Nitz, *Current Biology*, 2017

# Generate insights into nature

- Using **Spiking Neural Network** to build biological non-implausible models to test hypothesis about the brain



## Spike Timing Dependent Plasticity



# Why chose “Navigation”?

- A fundamental aspect of our intelligence:
  - self-localize in the environment (landmark utilization)
  - update one’s position on the basis of self-motion (path integration)
- Easy to test and compare with existing data and models





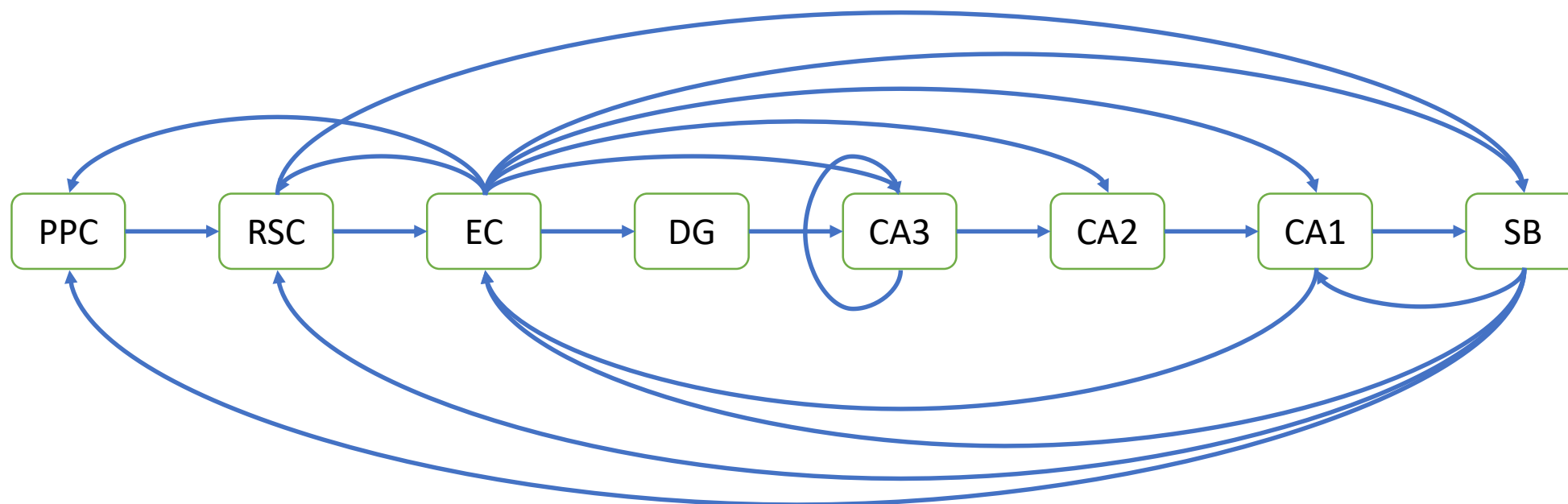
# The Findings from a Rat's Brain

- Connections
- Functions
  - Spatial
  - Temporal
- Lateralization
- Building-Blocks



<http://serious-science.org/genetic-manipulation-in-stem-cells-275>

# Connection



Posterior Parietal Cortex (PPC), Retrosplenial Cortex (RSC), Entorhinal Cortex (EC), Dentate Gyrus (DG), Cornu Ammonis 3 (CA3), Cornu Ammonis 2 (CA2), Cornu Ammonis 1 (CA1), Subicular Complex (SC).

# Functional Neuron Groups

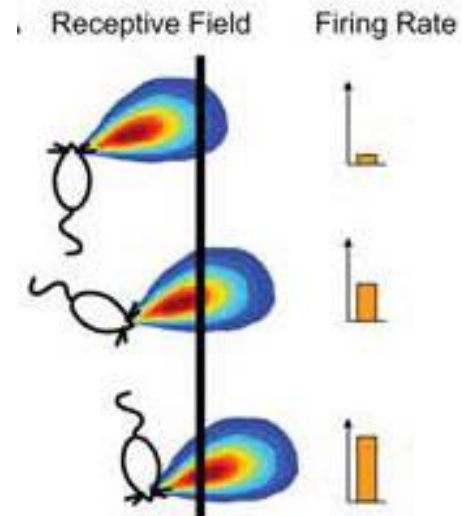
A. Spikes on trajectory



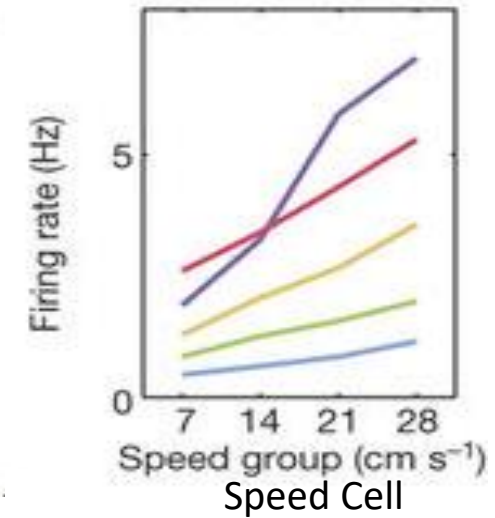
B. Rate maps



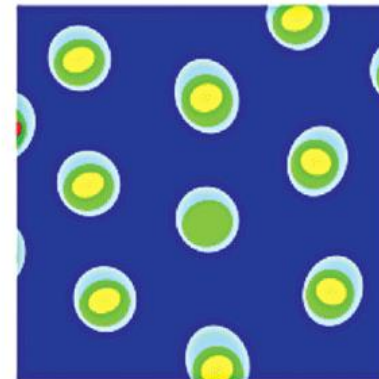
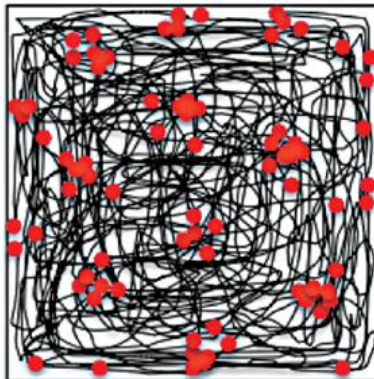
Place Cell



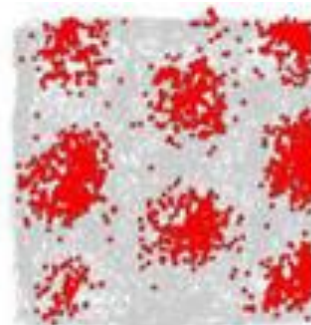
Boundary Vector Cell



Speed Cell



Grid Cell



Grid x Head Direction Cell



Head Direction Cell

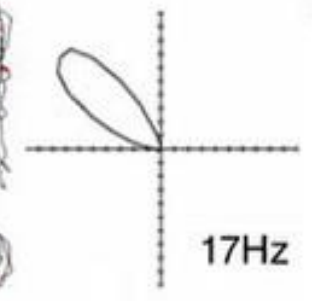


Image Source: E. I. Moser, M. Moser, N. Burgess, J. O'Keefe, et al.

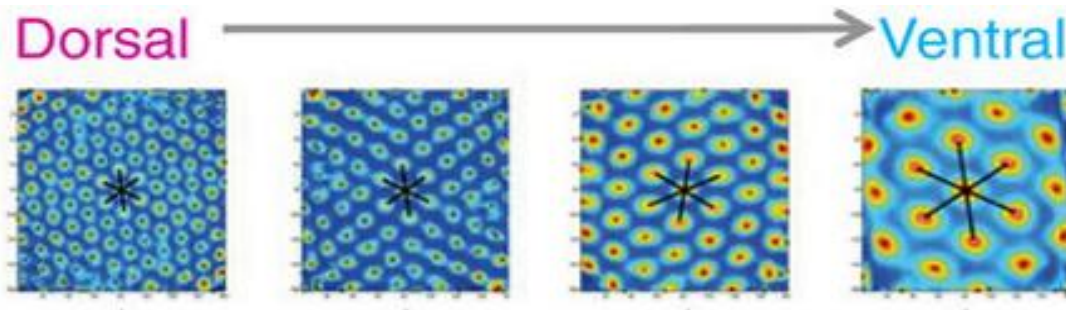


# Functions

Allo/Ego-centric	Encoded Information	PPC	RSC	EC	DG	CA3	CA2	CA1	SC
Allo & Ego	Cue (x Head direction)	✓							
Route (Allo & Ego)	Route	✓	✓						
Ego	Head Direction	✓	✓	✓					✓
Ego	Head Direction x Self-motion	✓	✓						
Ego	Self-motion	✓	✓						
Allo & Ego	Multiple Stimuli		✓						
Ego	Speed		✓	✓				✓	
Allo	Grid			✓					✓
Allo & Ego	Grid x Head Direction			✓					✓
Allo	Border			✓					✓
Allo & Ego	Boundary Vector								✓
Allo	Object x Place			✓					
Allo	Order x place			✓					
Allo	Place cells				✓	✓	✓	✓	
Allo	Social Information						✓		

# Spatial Scales

- Different groups of neurons encode different scales



- Scale Independent

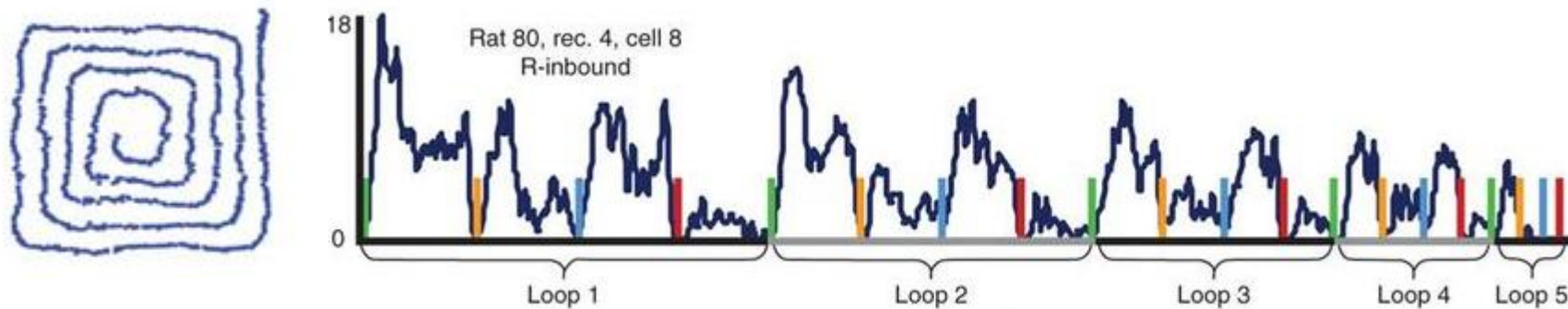


Image Source: H. Stensola, *Nature*, 2012; D. Nitz, *Nature*, 2012

# Mystery Rhythms

- Theta Rhythms (4-7Hz)
  - Theta phase precession of place cells
  - Theta rhythm interference underlies grid cells
- Slow and Fast Gamma Rhythms (25-60 Hz; 60-100 Hz)
  - Modulate the synchronization between CA1 - CA3, or CA1 – MEC
  - Associated with long / short-path encoding
  - Slow gamma phase precession of place cells

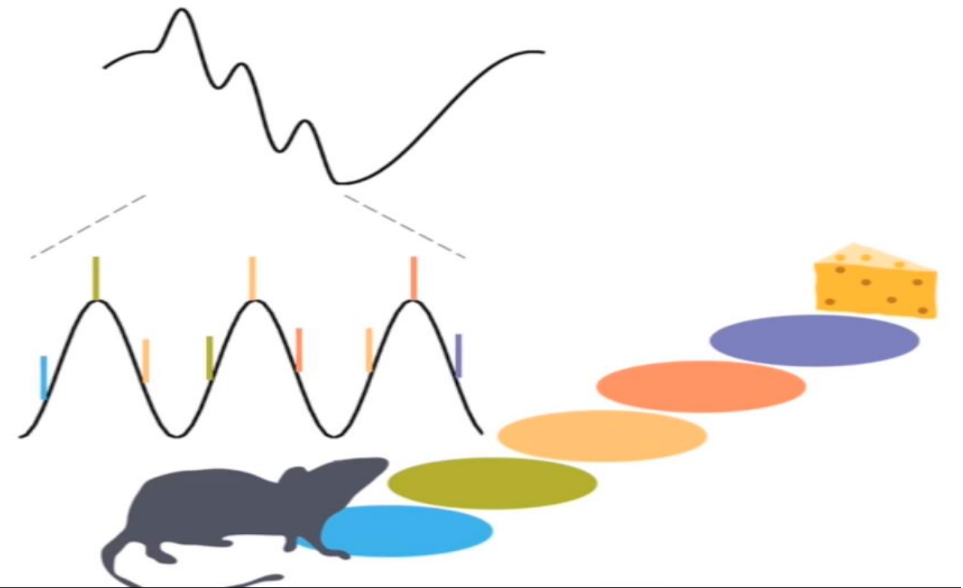
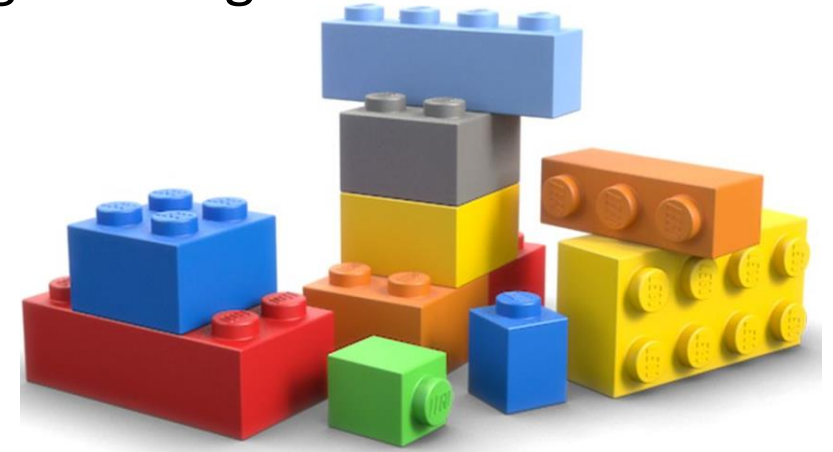


Image Source: C. Zheng, *Cell*, 2016

# Building Blocks

- Rigid Building Blocks
  - Describing basic elements of spatial cognition
  - Can be light independent/scale independent/motion independent etc.
- Dynamic Building Blocks
  - Modulated by the rigid building blocks
  - Can undergo “partial remapping” corresponding to changes



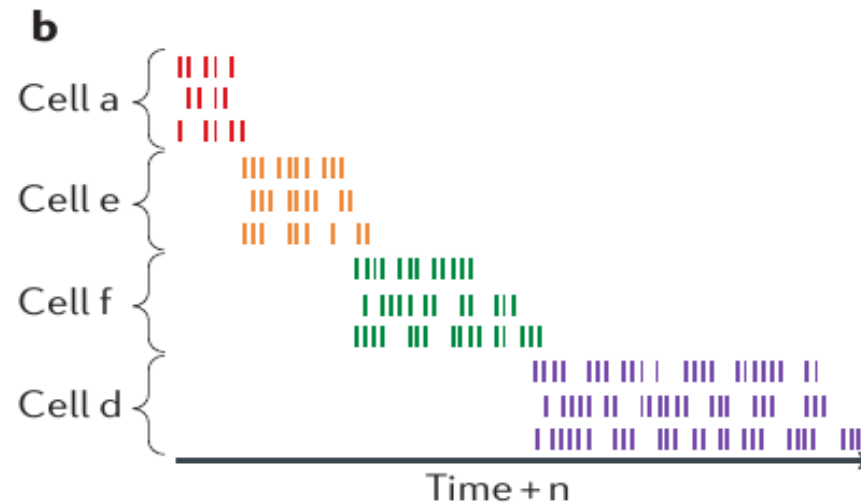
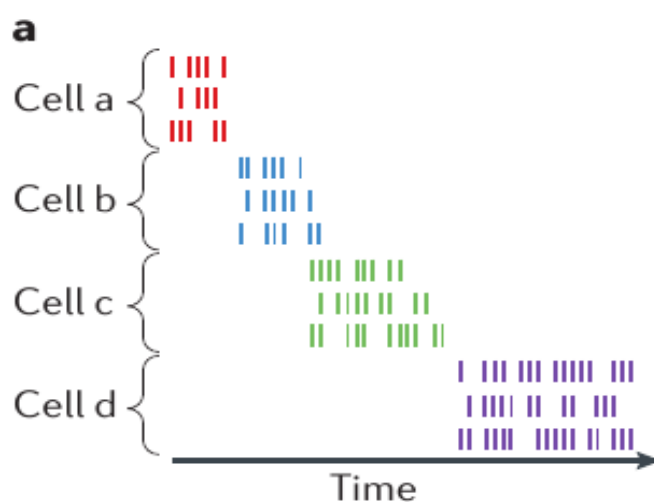
# Lateralization – not obvious in HPC

	Left HPC	Right HPC
Human	Less involved in short term memory of object-location associations	More involved in short term memory of object-location associations
	London taxi drivers have smaller left hippocampus comparing to the right side	London taxi drivers have larger right hippocampus
	More involved in egocentric sequential information encoding	More involved in allocentric spatial information encoding
	Smaller left EC volume is found in patients who are progressing to Alzheimer than just in a stable mild cognitive impairment state	No difference
	No difference	Activity decreased when retrieving more remote autobiographical memories, and more involved in recollective autobiographical memories retrieval
Rodent	Left CA3 silencing impaired long-term memory	Right CA3 silencing does not impair long-term memory
	Microinjecting ANG II (a type of hormone) to the left hippocampus increased learning and memory performance more	Increased less in learning and memory performance when ANG is injected
	The left DG is more active during object exploration comparing to the right one	The right DG is less active in object exploration comparing to the left one
Avian	Domestic chicks with damaged left hippocampus could still find the food buried in the center of the arena given geometric cues	Domestic chicks with damaged right hippocampus could not find the food buried in the center of the arena given geometric cues



# Time Representation

- Time Cells



- Firing Timings
- Brain Rhythms
- CA2 ?

# The Attempts to Build an Artificial Rat

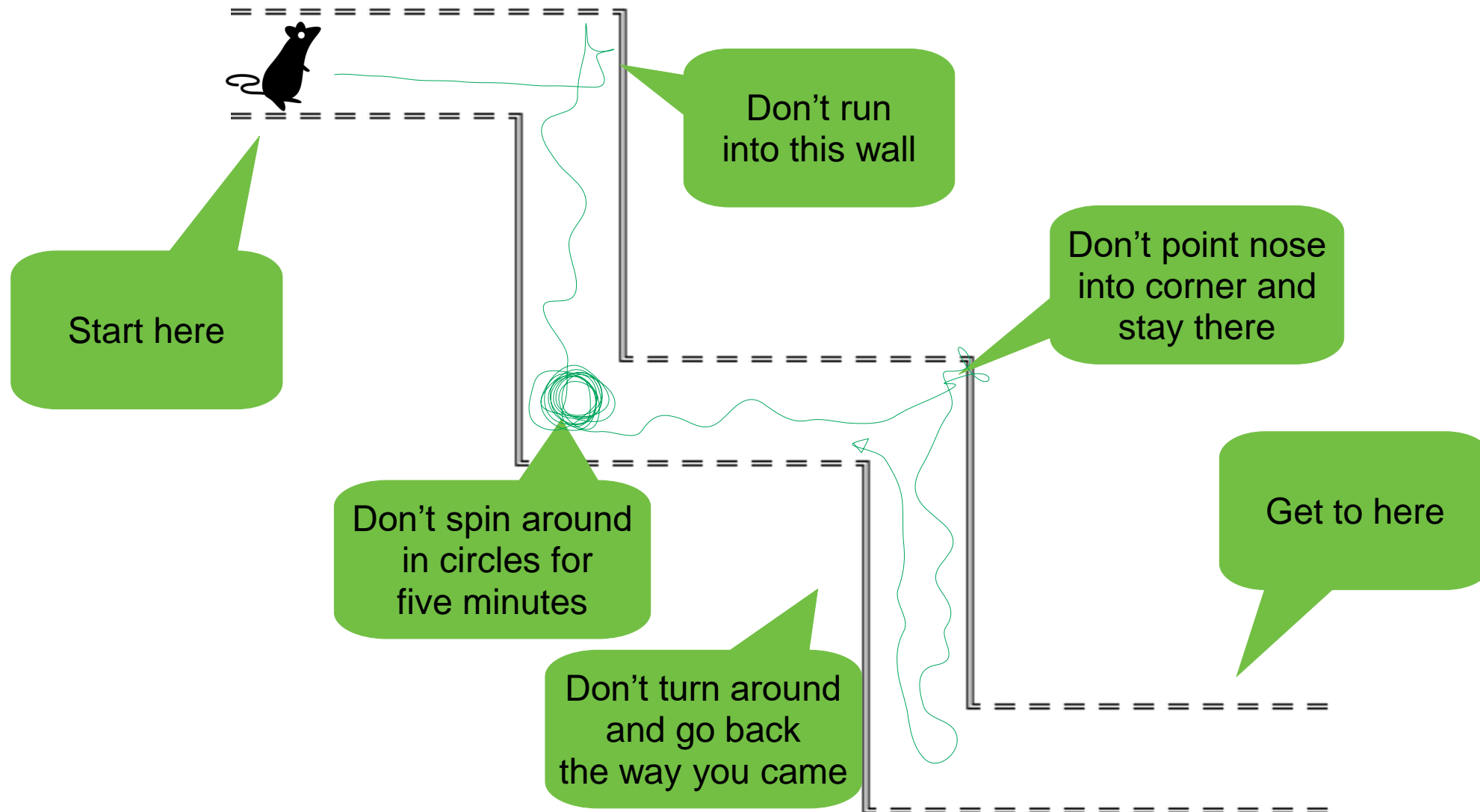
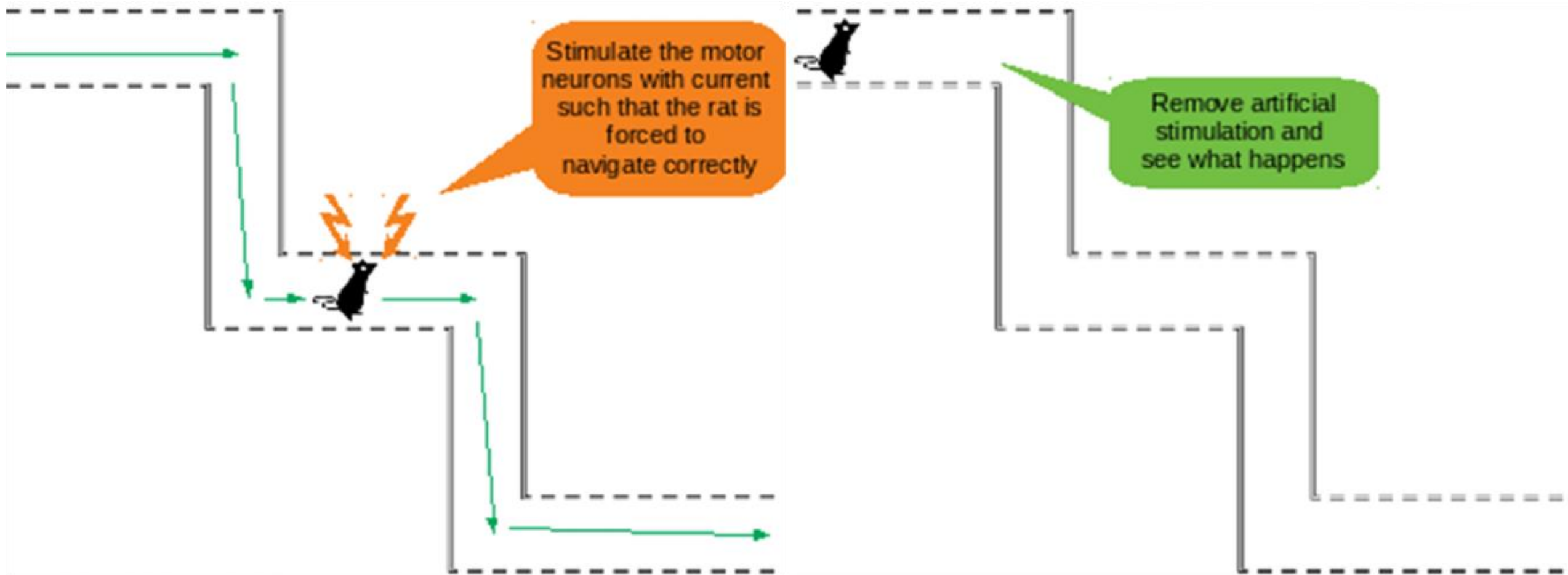


Image Source: Alex Rose, *ECS Talk*, 2018

# Training & Testing



# CARLsim3

- Izhikevich model + Spike Timing Dependent Plasticity + GPU

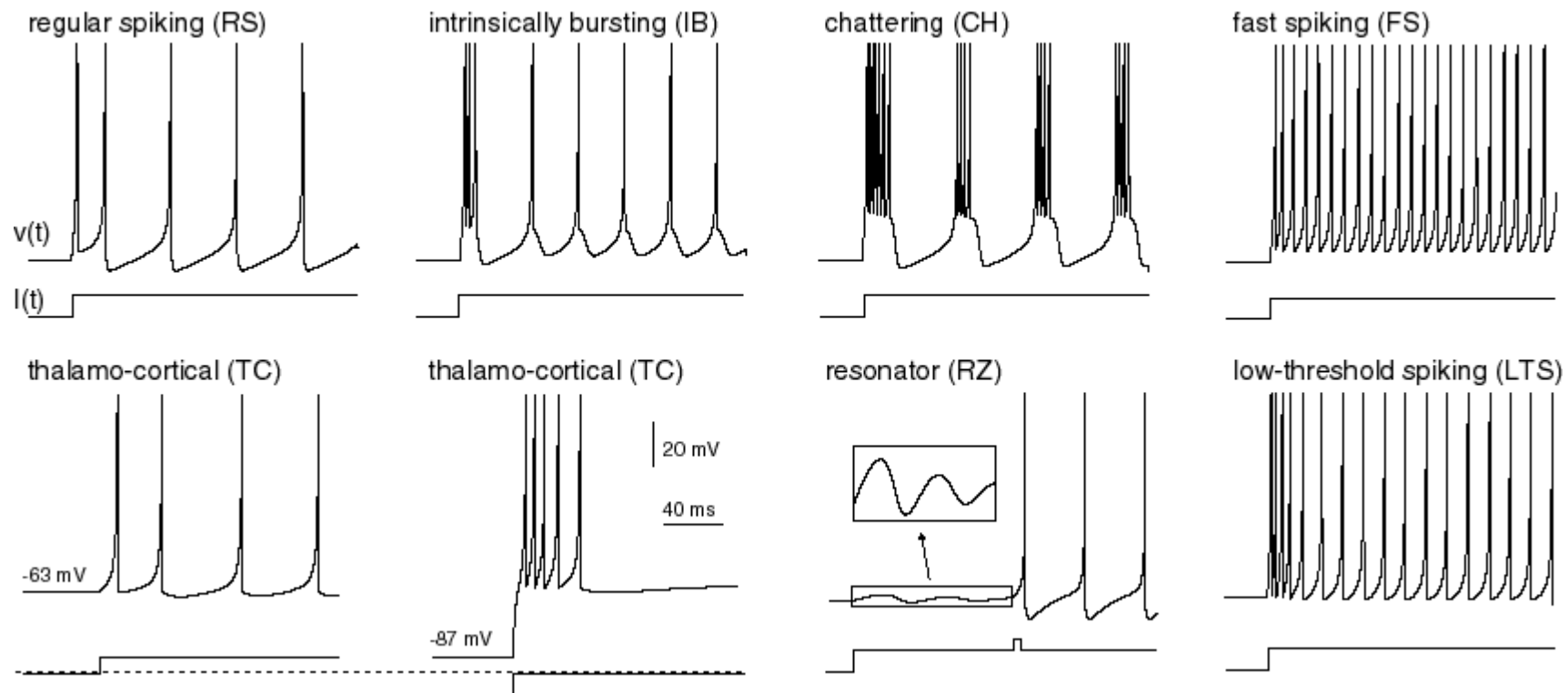
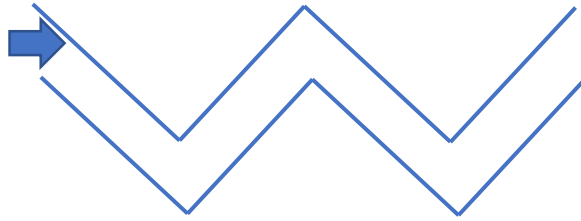


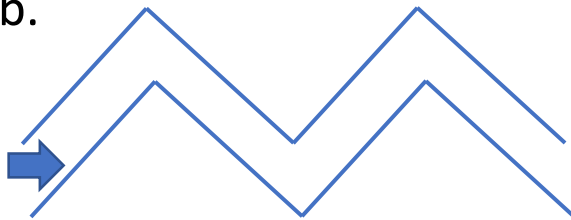
Image Source: E.M. Izhikevich, *IEEE Transactions on Neural Networks*, 2004

# Mazes

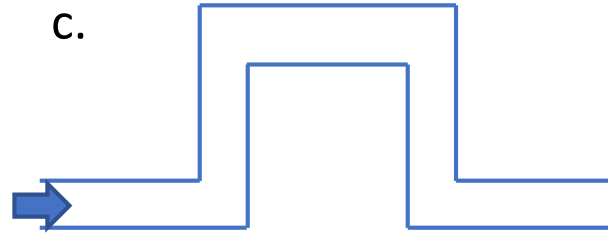
a.



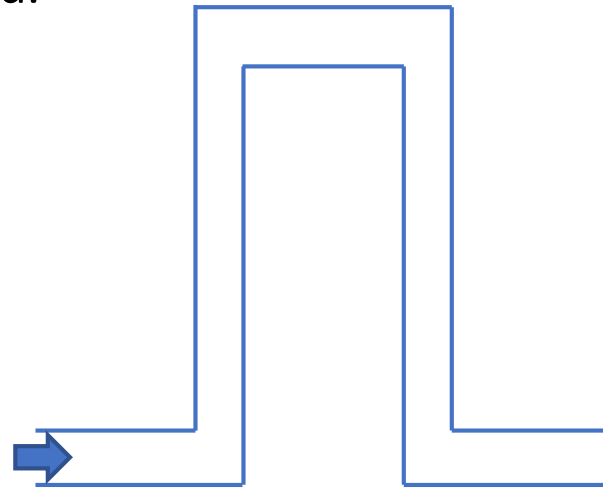
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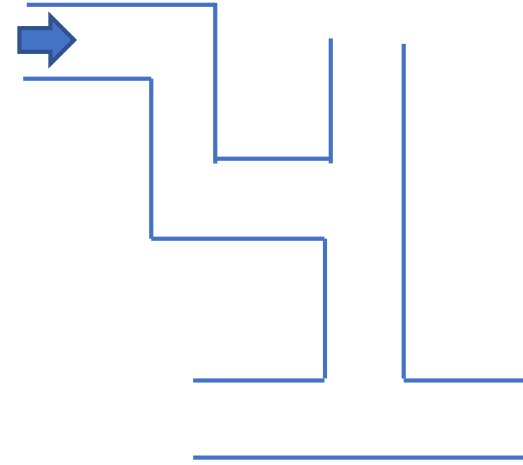
c.



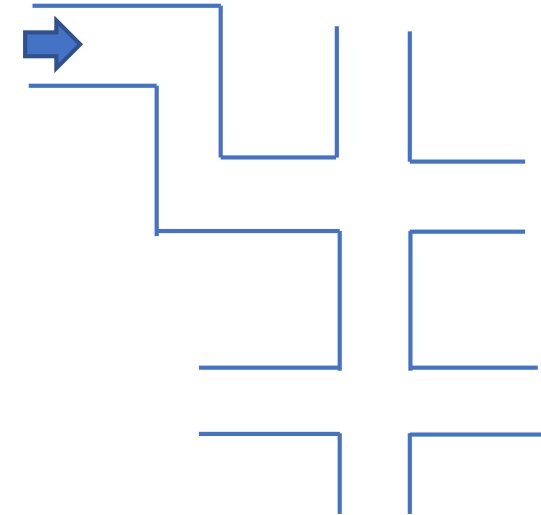
d.



e.

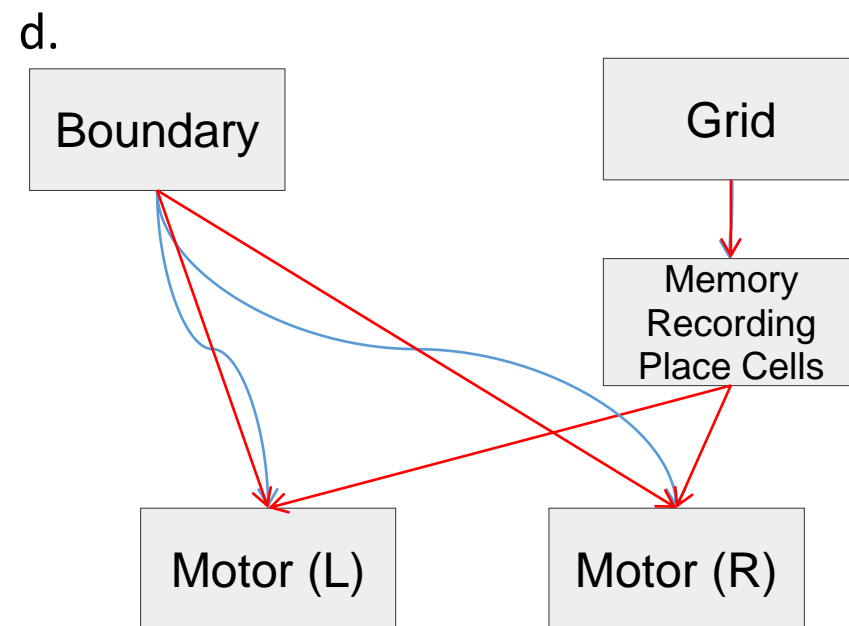
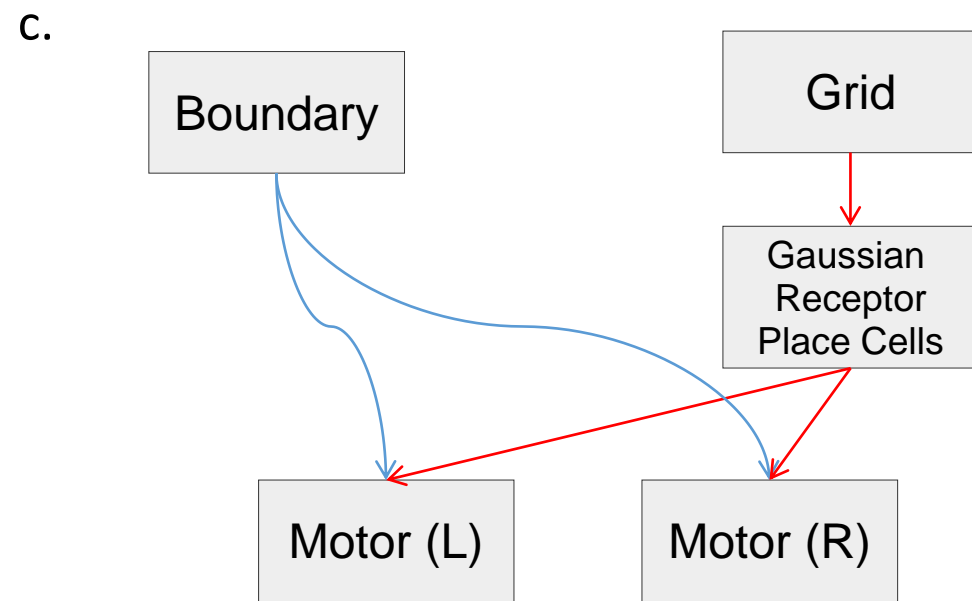
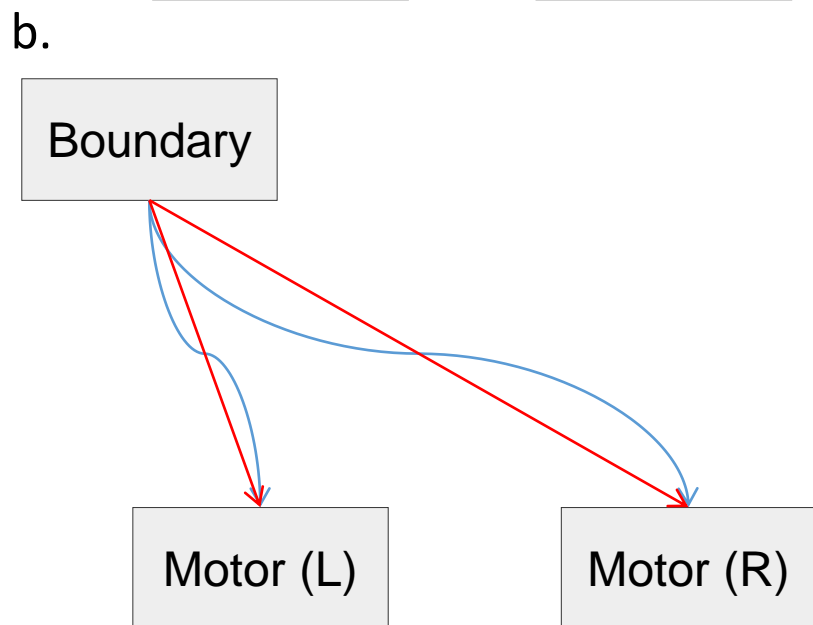
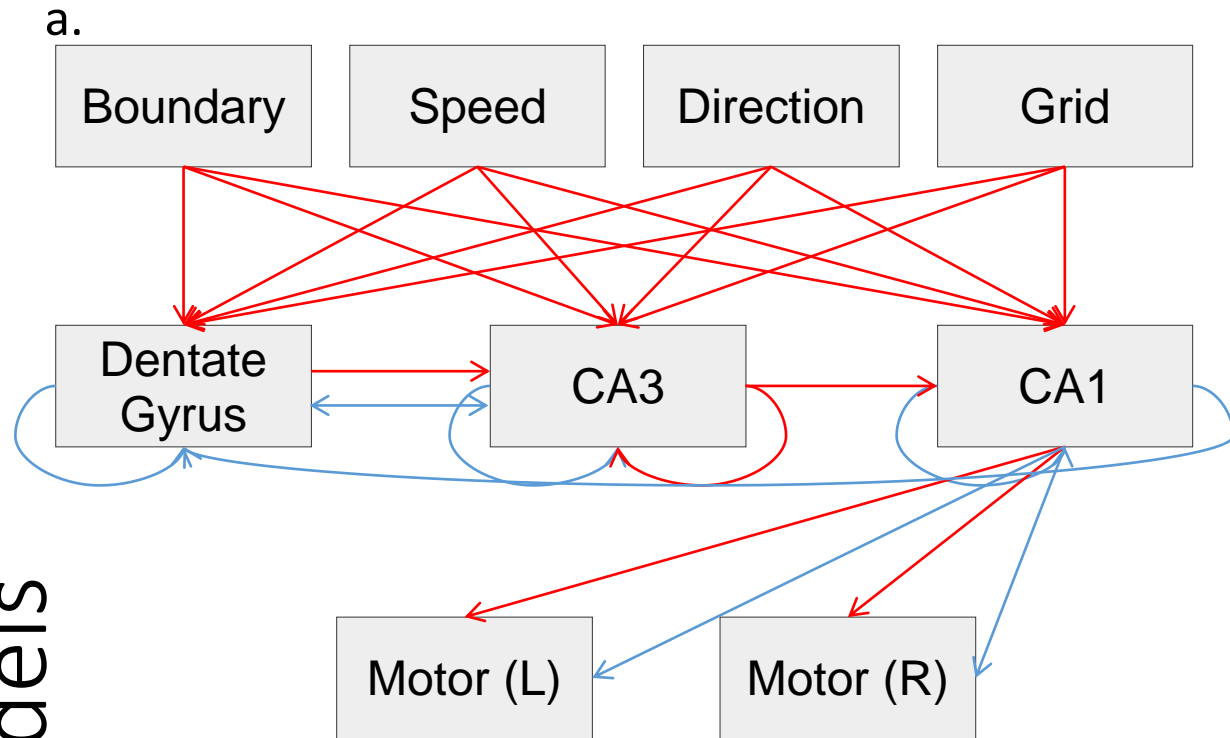


f.





# Models



# Deep Neural Networks for Grid Cells

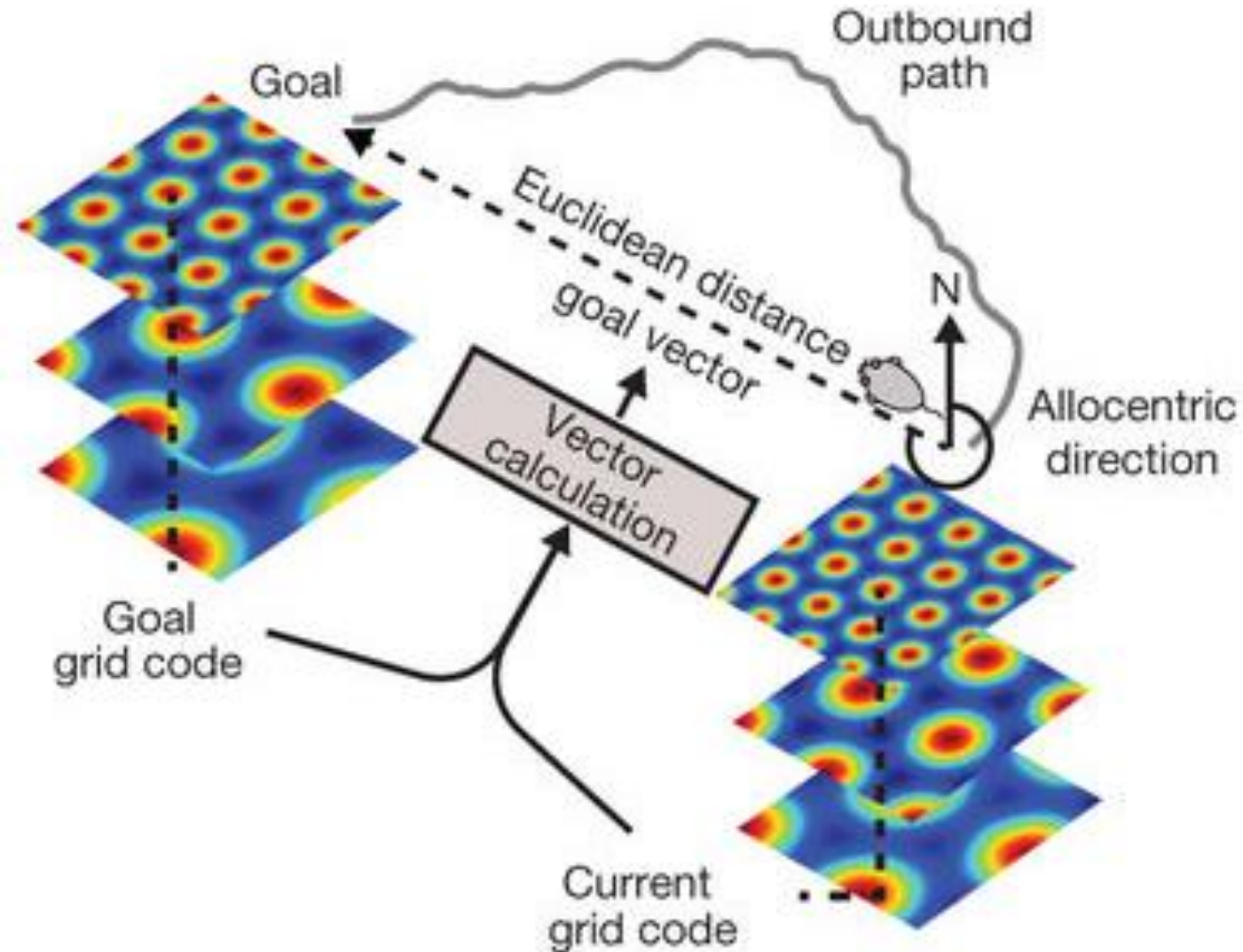


Image Source: DeepMind & UCL Team, *Nature*, 2018

# Conclusions

- Results:
  - Building-block mechanism ✓
    - Boundary cells, grid cells, place cells
  - Spiking Neural Network ✓
- Next:
  - Time representation
  - Lateralization
  - Other factors such as emotions



# Thanks !



# Models

- Izhikevich Model:

$$\begin{aligned} v' &= 0.04v^2 + 5v + 140 - u + I \\ u' &= a(bv - u) \end{aligned}$$

**if**  $v = 30 \text{ mV}$ ,  
**then**  $v \leftarrow c, \quad u \leftarrow u + d$

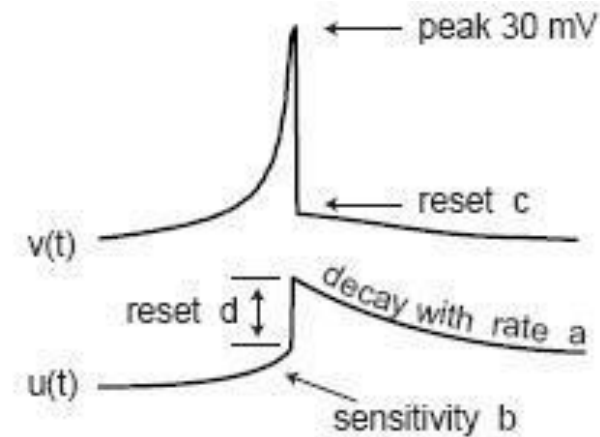


Image Source: E.M. Izhikevich, *IEEE Transactions on Neural Networks*, 2004

- STDP:

$$\frac{du}{dt} = \frac{-u}{STP\_tau\_u} + STP\_U(1 - u^-)\delta(t - t_{spk}) \quad (1)$$

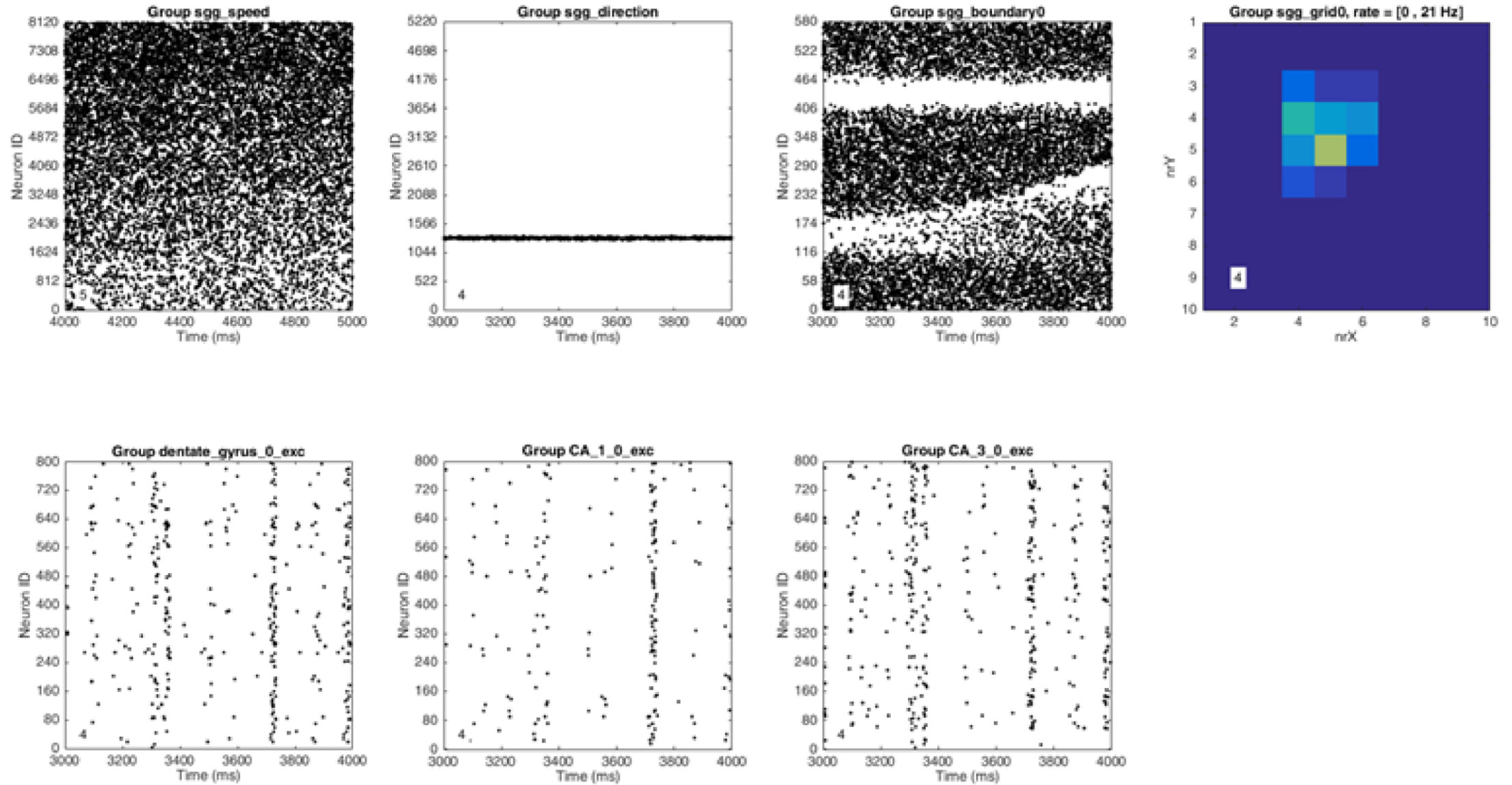
$$\frac{dx}{dt} = \frac{1 - x}{STP\_tau\_x} - u^+x^-\delta(t - t_{spk}) \quad (2)$$

$$\frac{dI}{dt} = \frac{-I}{\tau_S} + Au^+x - \delta(t - t_{spk}) \quad (3)$$

Image Source: CARLsim3 User Guide, UCI, 2016



# Complex Structure



# Spiking Boundary

