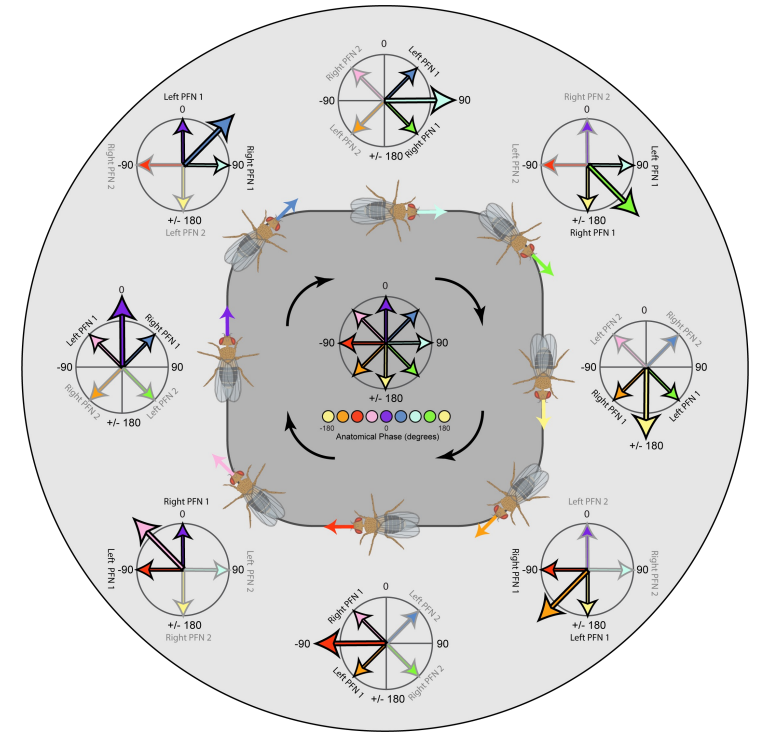
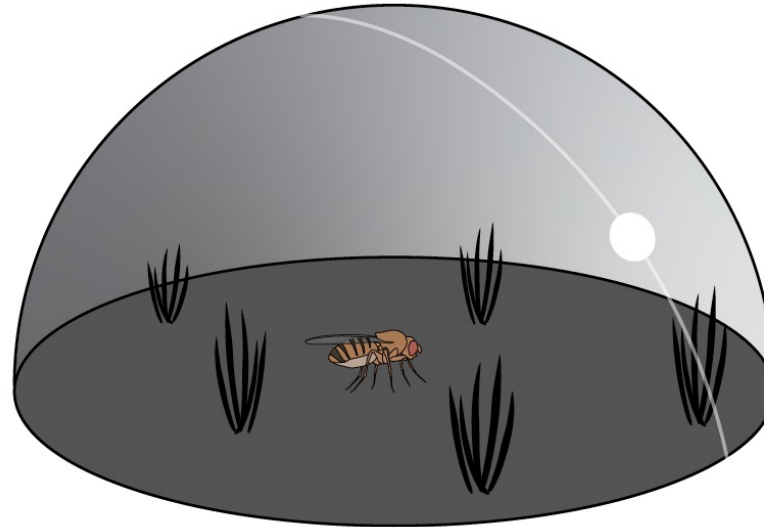
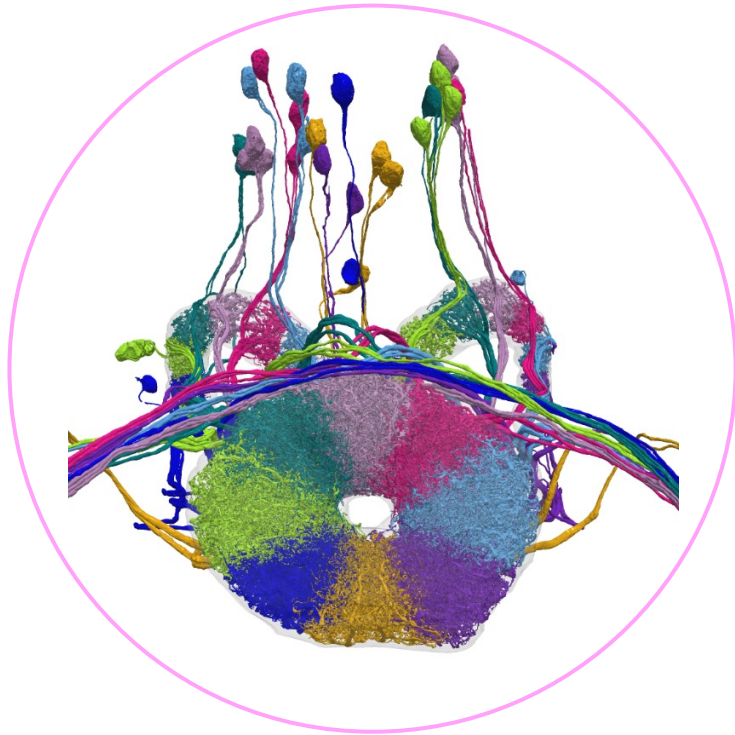


How connectomes can help us understand navigational attractor dynamics

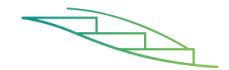


Vivek Jayaraman

IPAM, UCLA Workshop: Mathematical Approaches for Connectome Analysis

February 12th, 2024

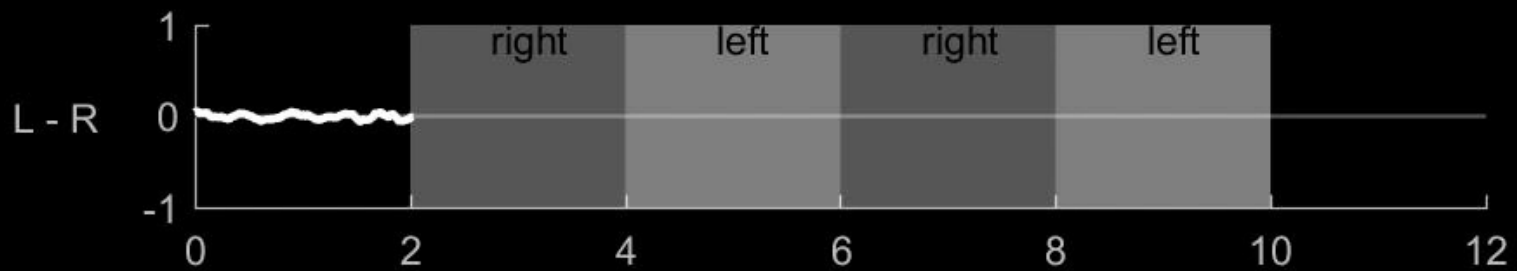
hhmi



janelia
Research Campus

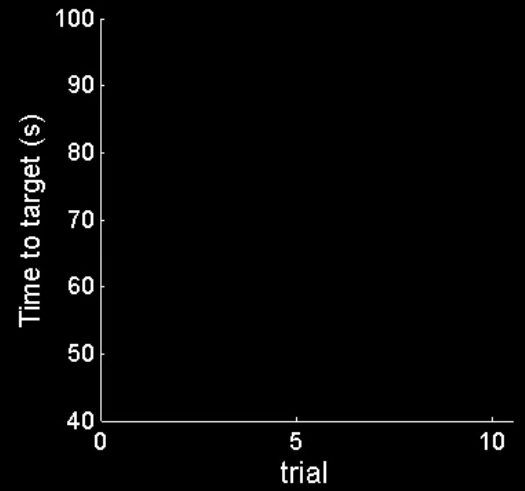
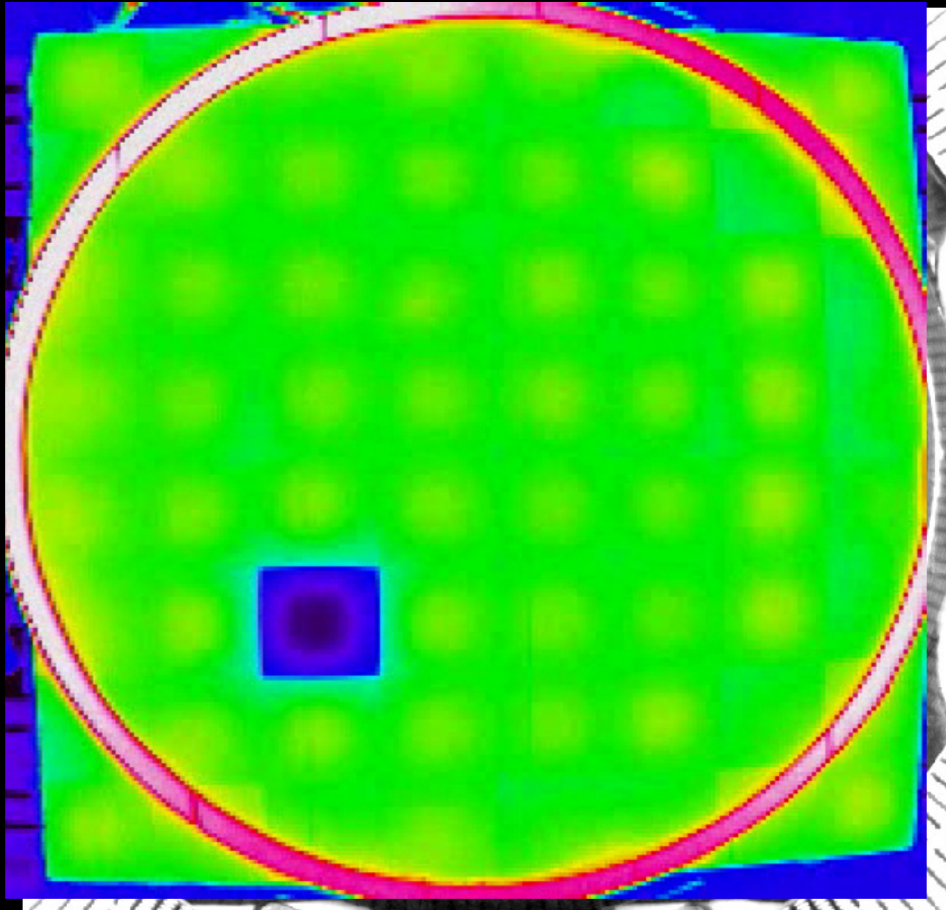


measuring
wing-beat
shadow



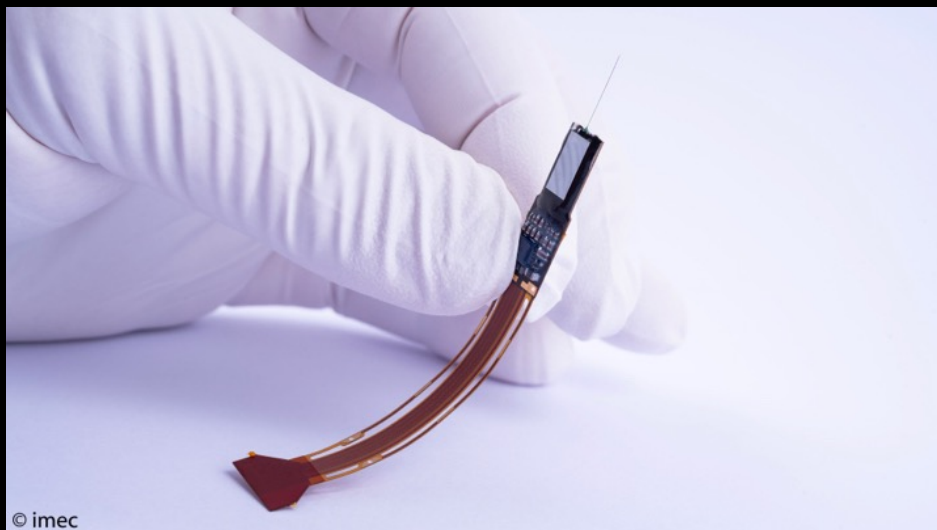
2x slower

Thermal place learning

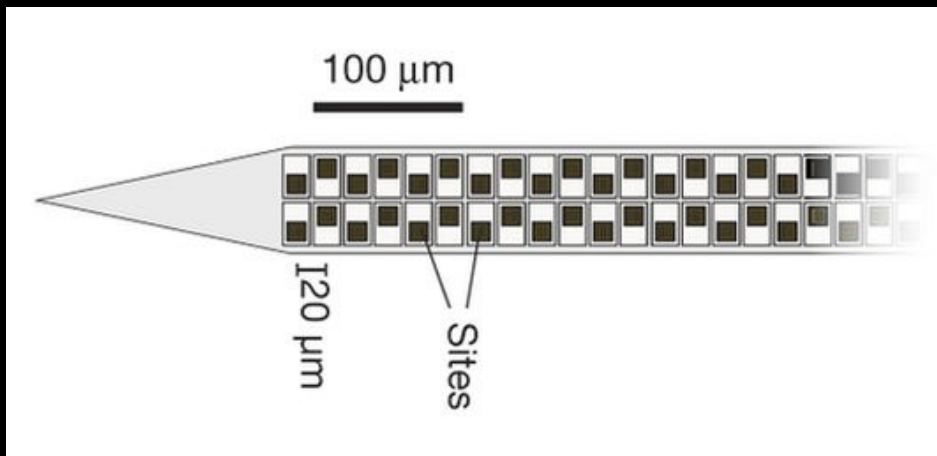


* tracking by Ctrax (Branson et al. 2009)

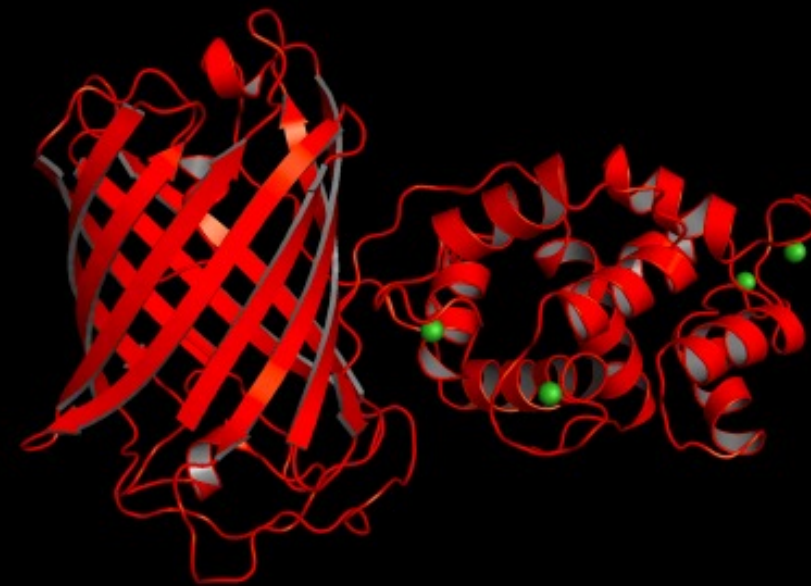
Ofstad, Zuker & Reiser,
(2011)



© imec

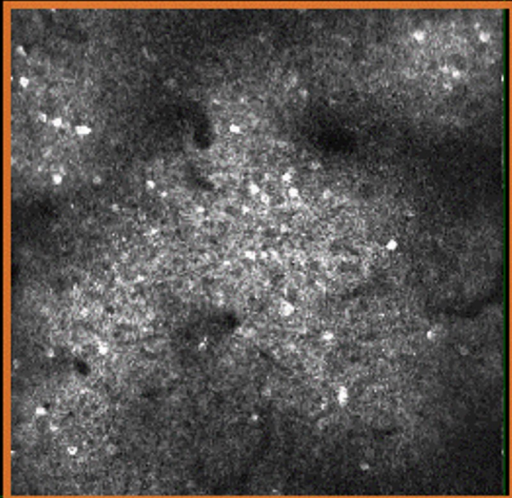
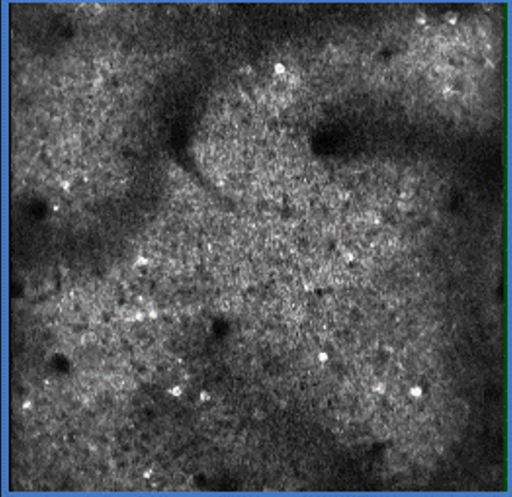
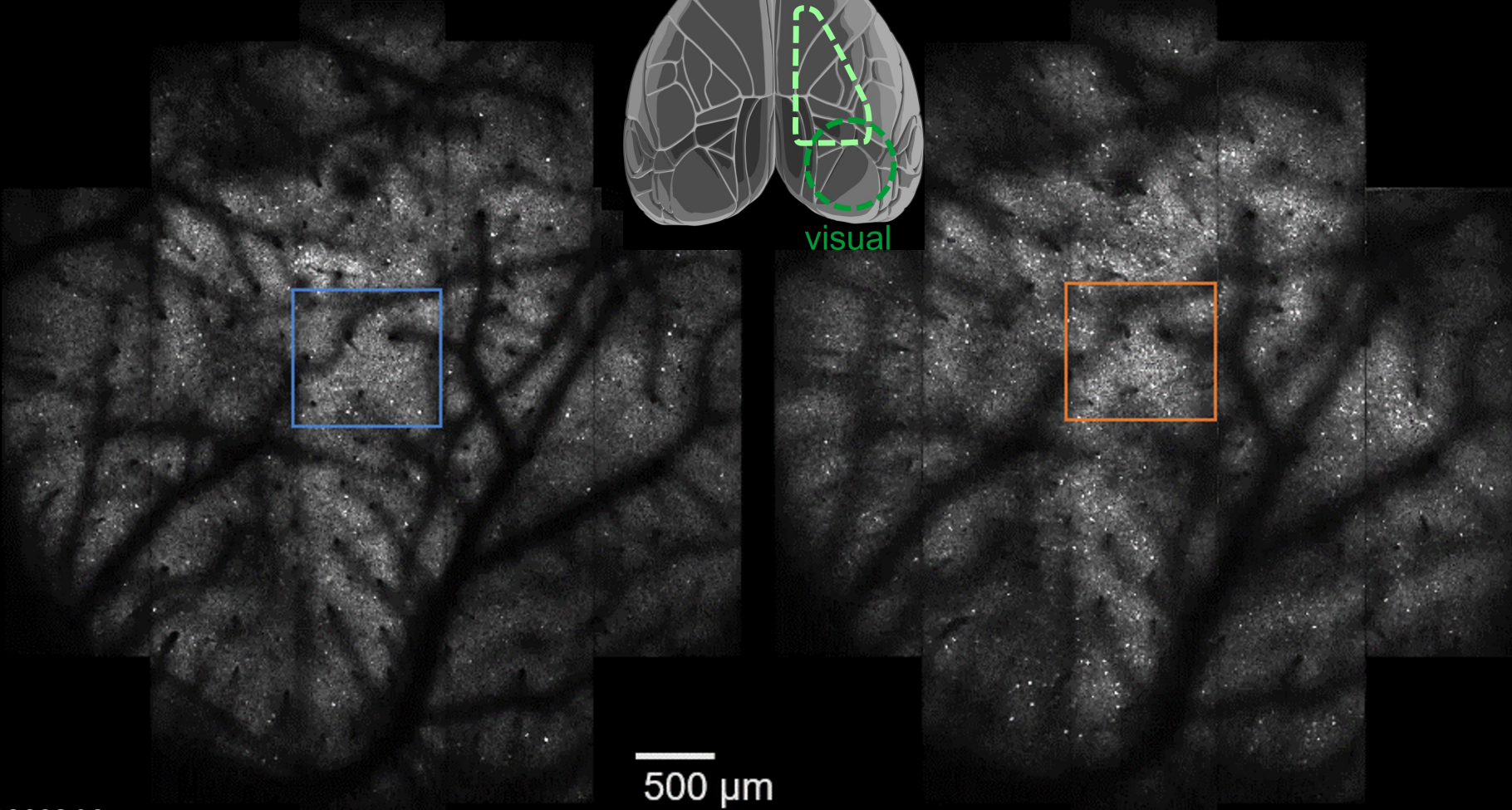
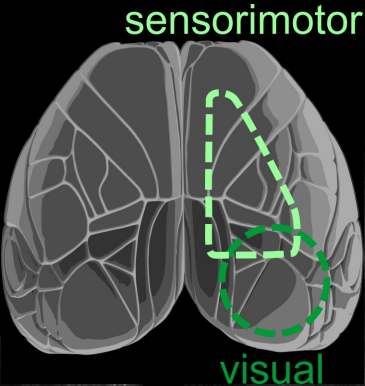


NeuroPixels project
(Janelia, imec, Allen Institute, UCL)



Janelia GENIE team

50,000 simultaneously-recorded neurons

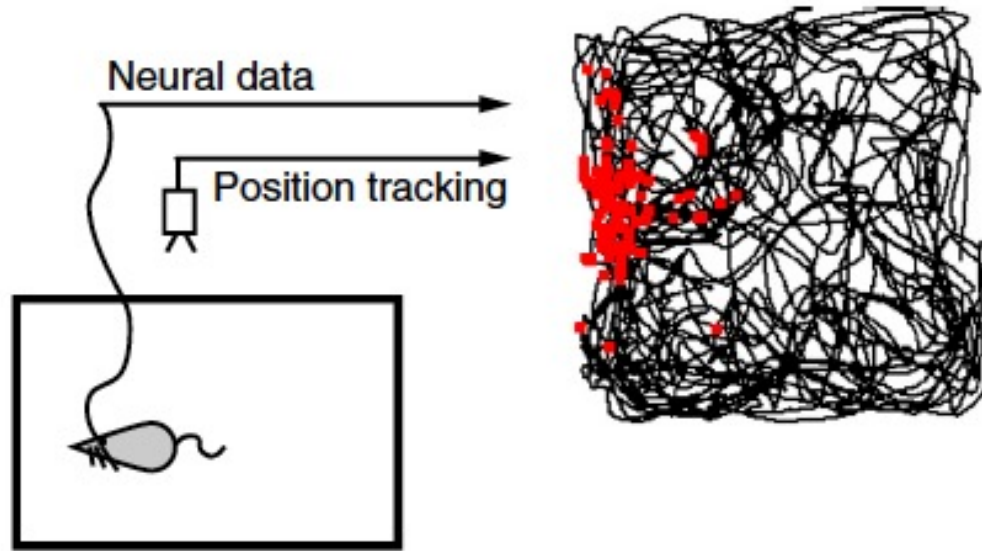


3x realtime

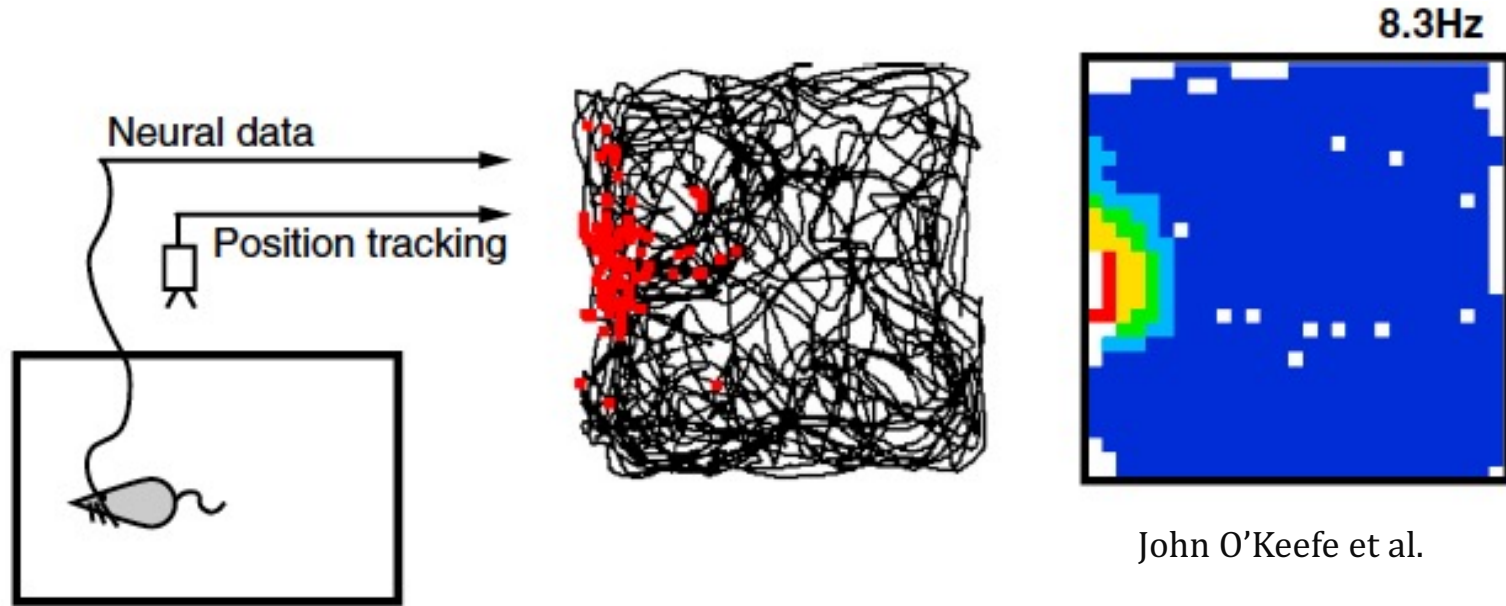
100 μm

Mesoscope:
Sofroniew*, Flickinger* et al, 2016
Tsyboulski*, Orlova* et al, 2018

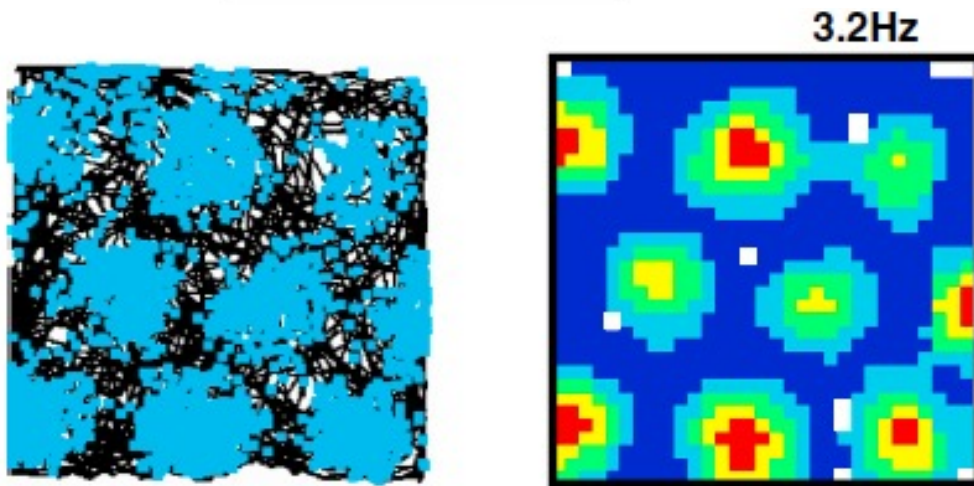
Internal representations for flexible navigation



Internal representations for flexible navigation

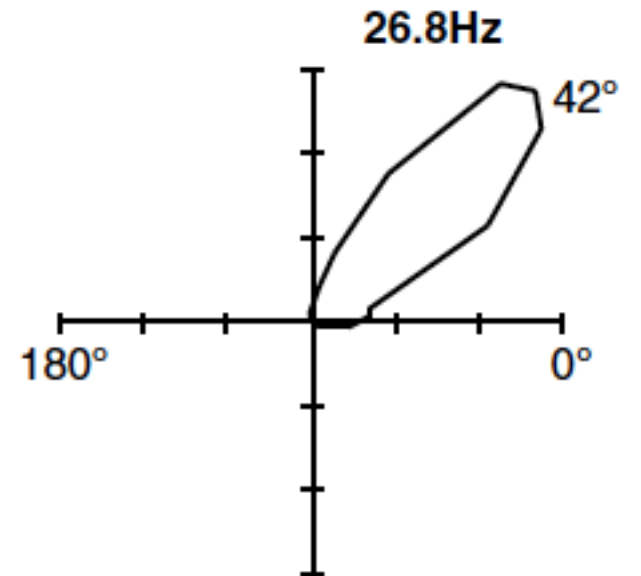


John O'Keefe et al.



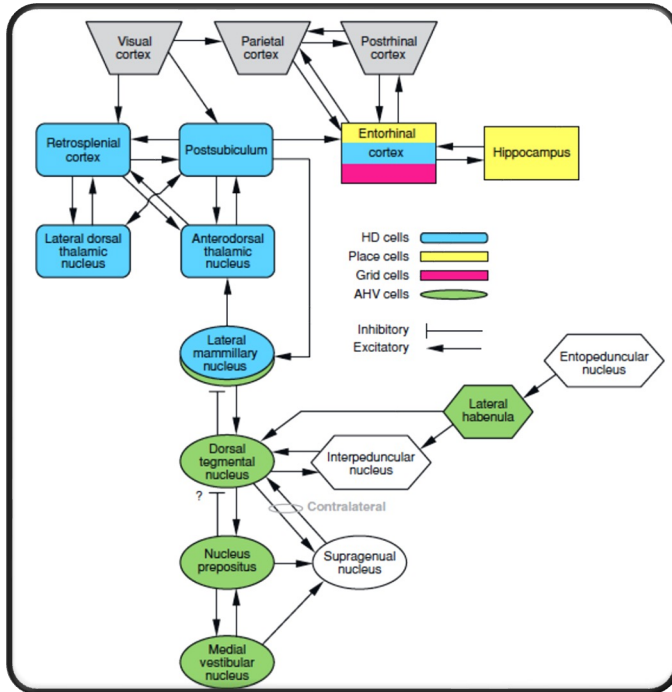
Edvard & May-Britt Moser et al.

Barry & Burgess, Curr. Biol. (2014)

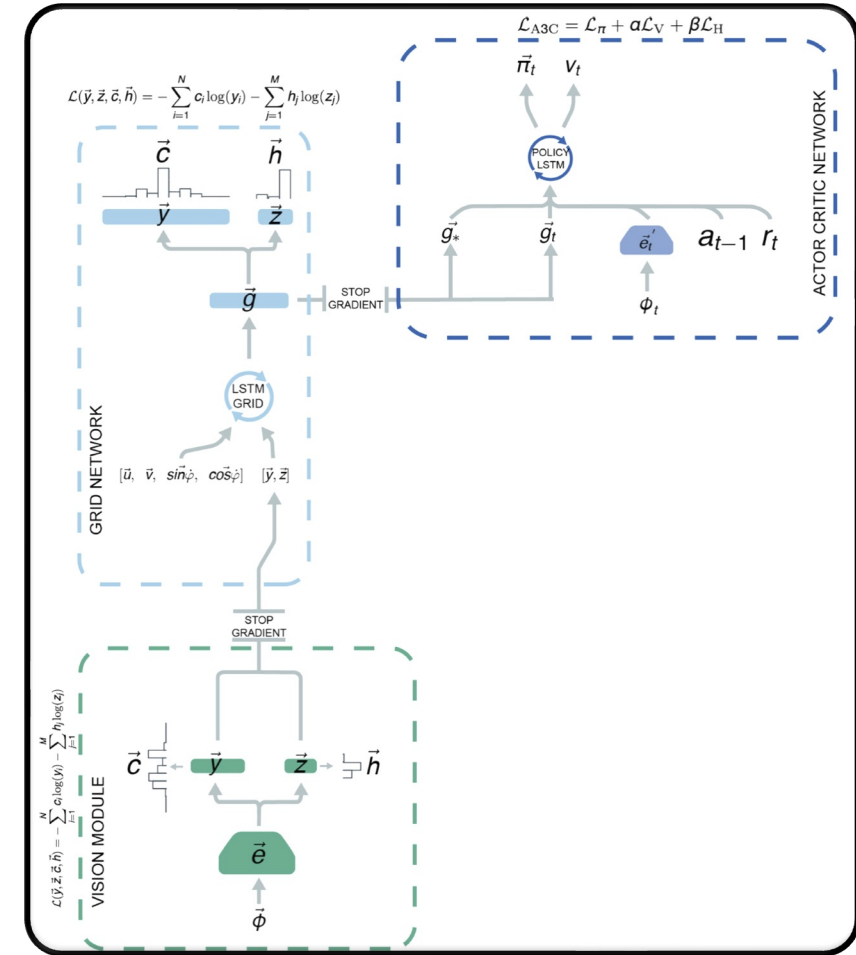
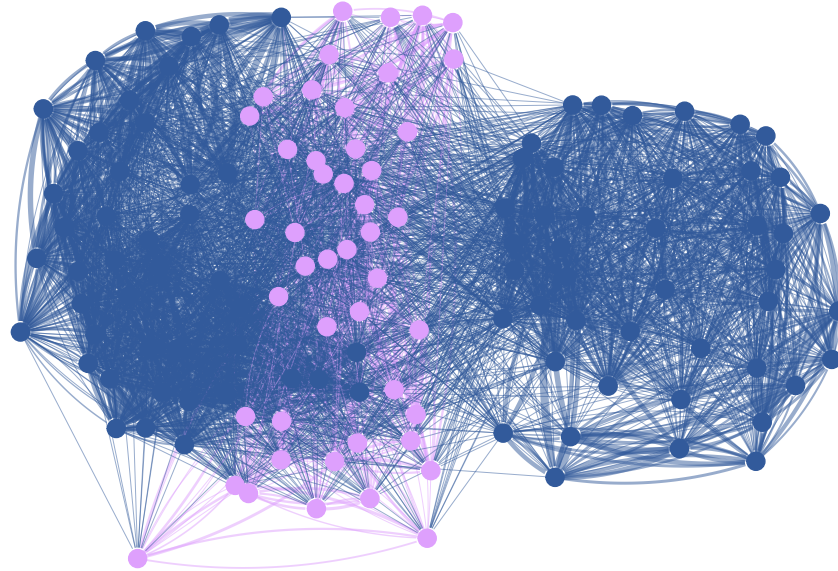


Jeff Taube & James Ranck et al.

These representations are generated within densely recurrent brain networks

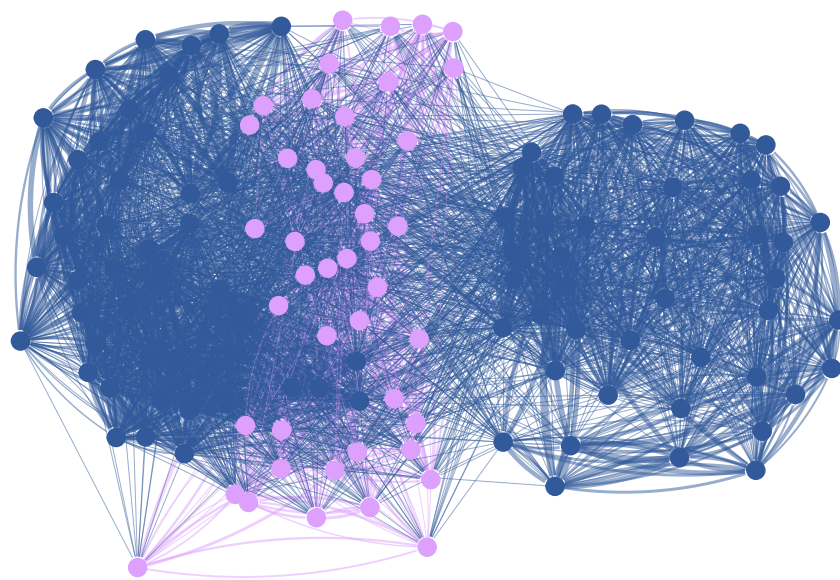


Taube (2007)



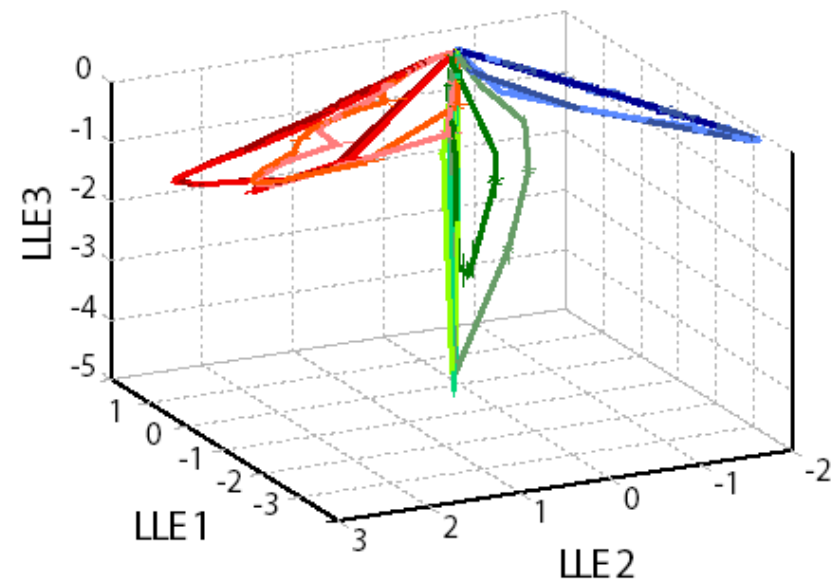
Banino et al. (2018); Cueva & Wei (2018)
see also: Uria et al. (2020); Cueva & Wei (2020)

conjunctive coding



mixed selectivity

manifolds

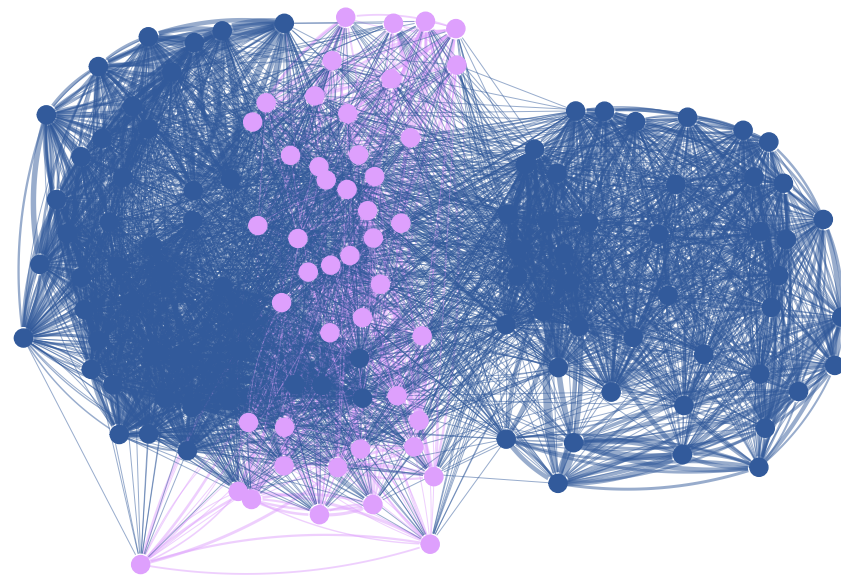


Stopfer*, Jayaraman* & Laurent (2003)

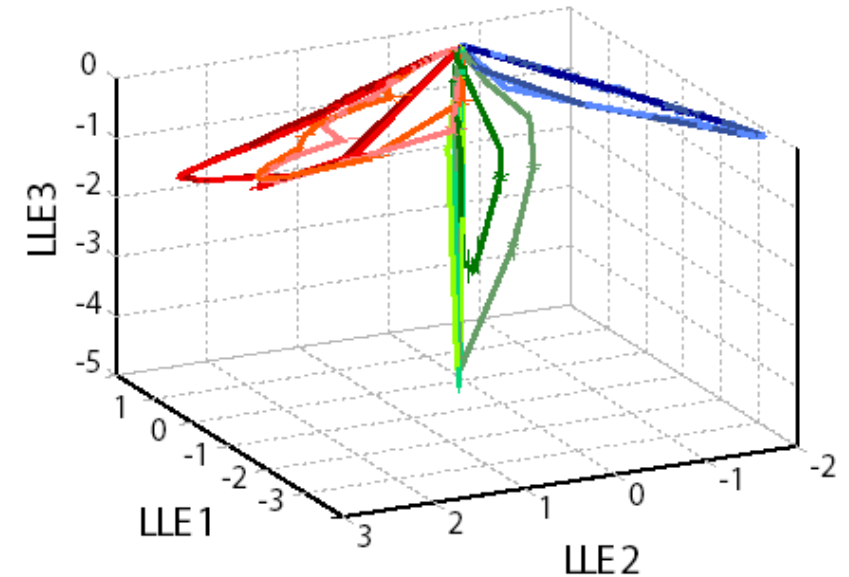
How do these representations arise?

conjunctive coding

mixed selectivity



manifolds



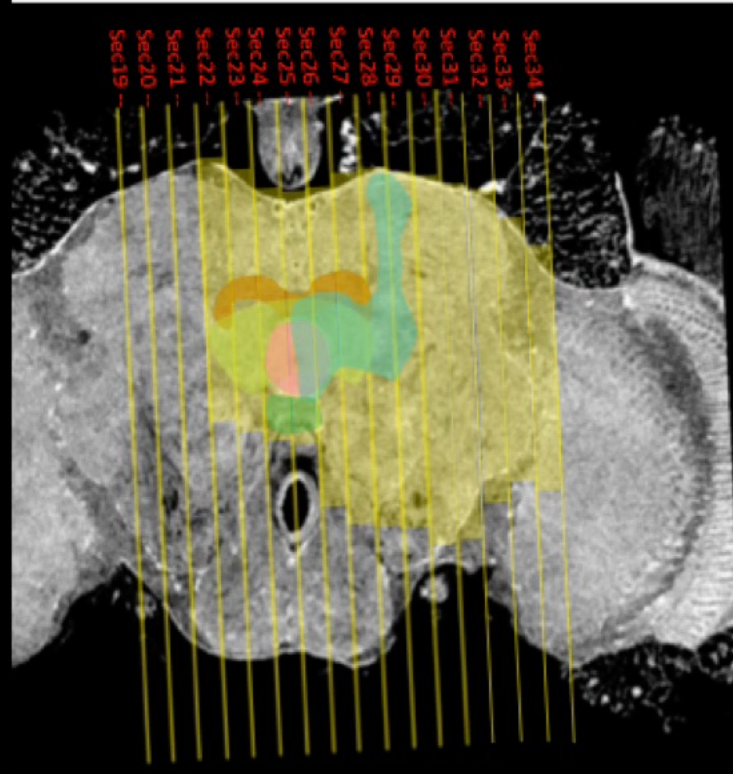
Stopfer*, Jayaraman* & Laurent (2003)

Fly “Hemi-Brain” Connectome Project

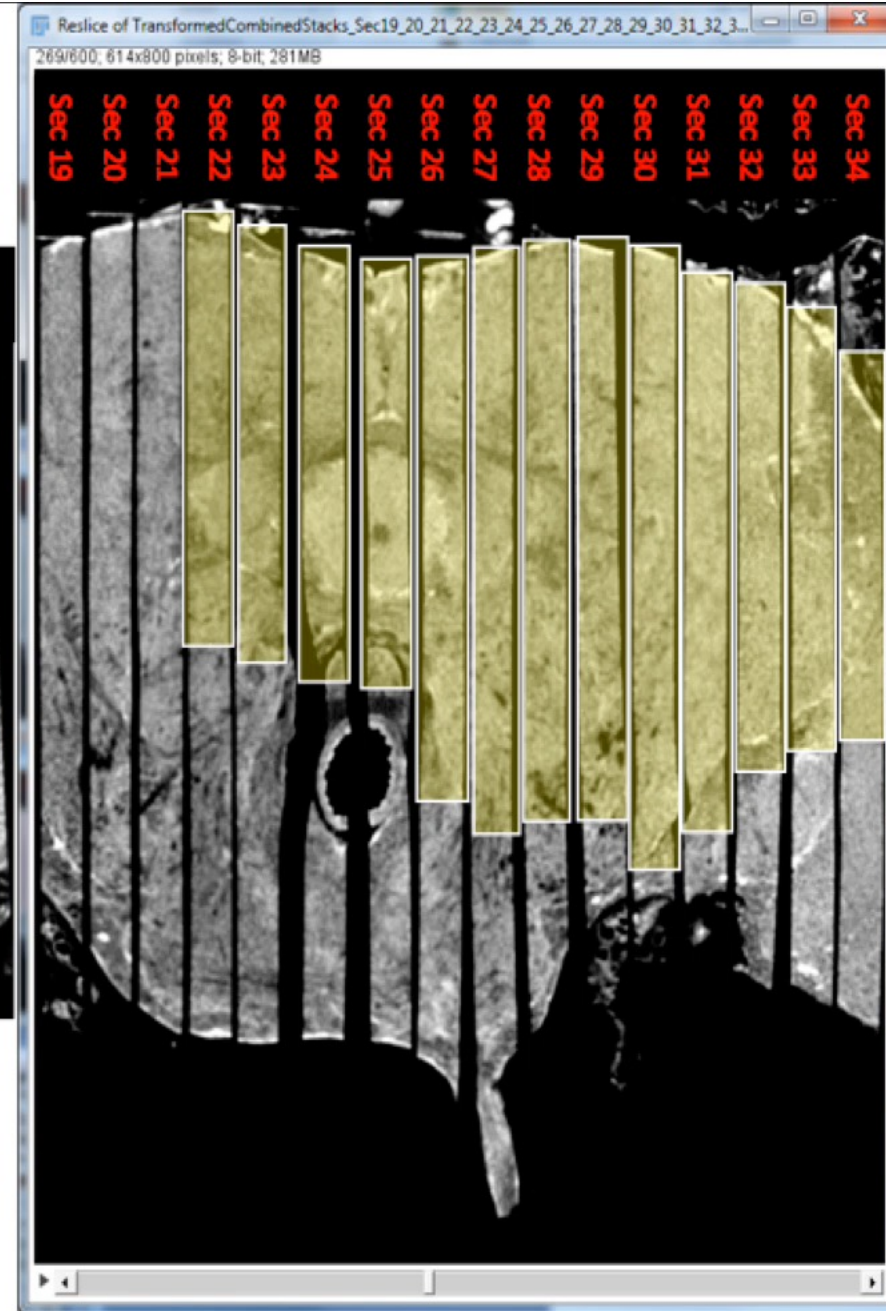
janelia
flyEM

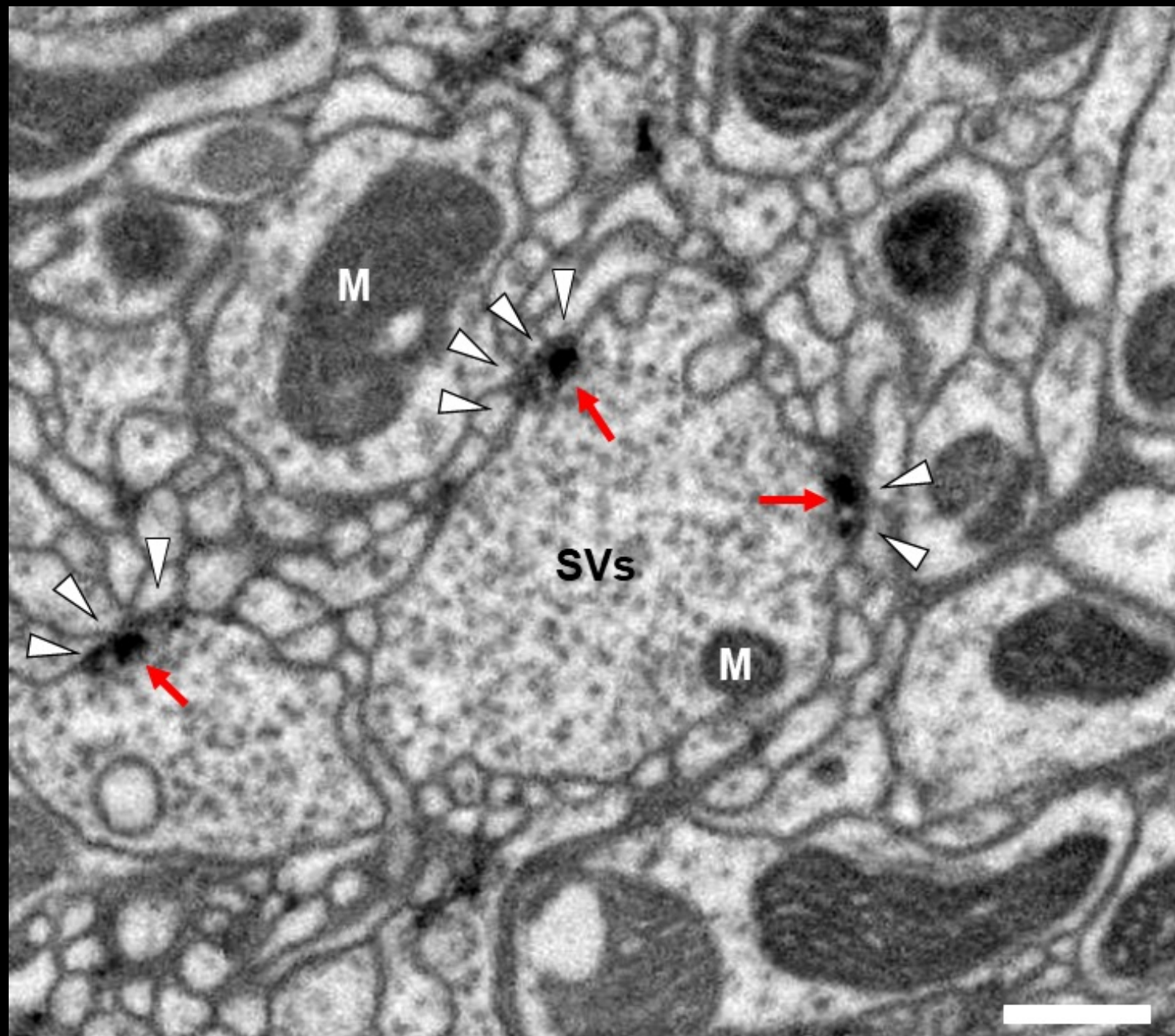
Google

volume imaged = $16 \times 10^6 \mu\text{m}^3$



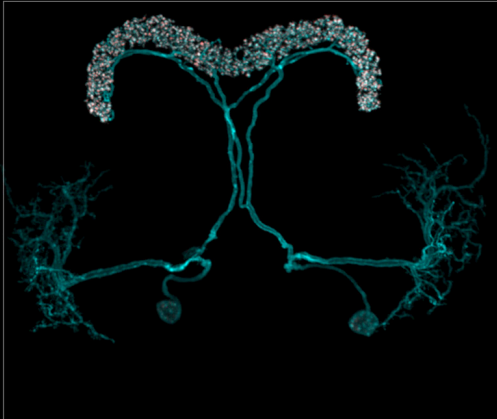
Central Complex & Mushroom Body
of a female fly highlighted





Neurons come in different types

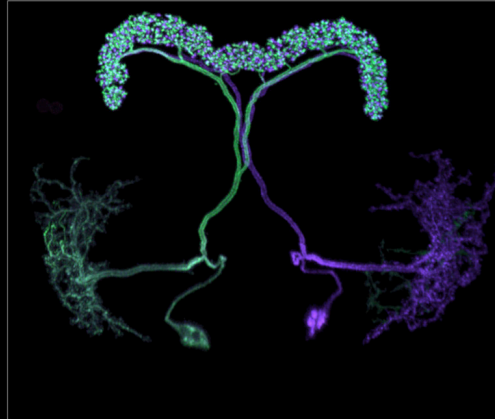
cell polarity determination



membrane

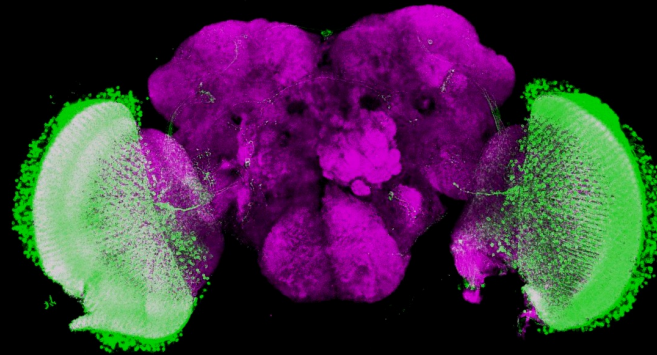
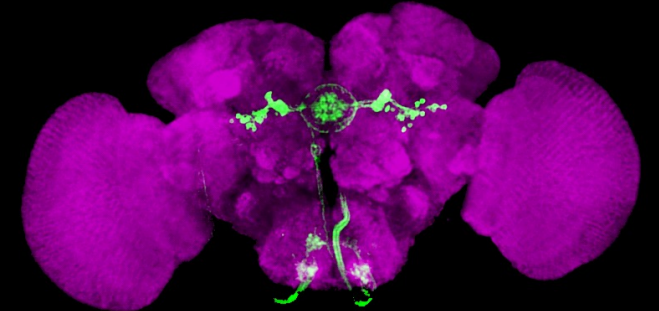
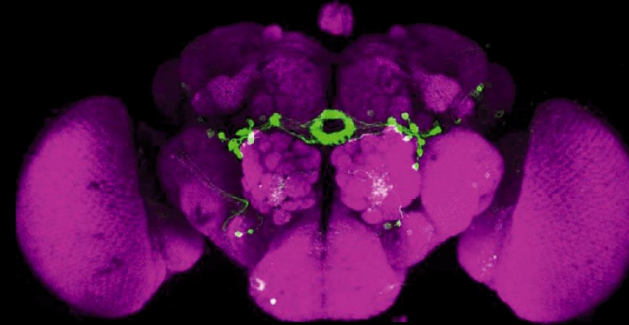
synapses

MCFO stochastic labeling



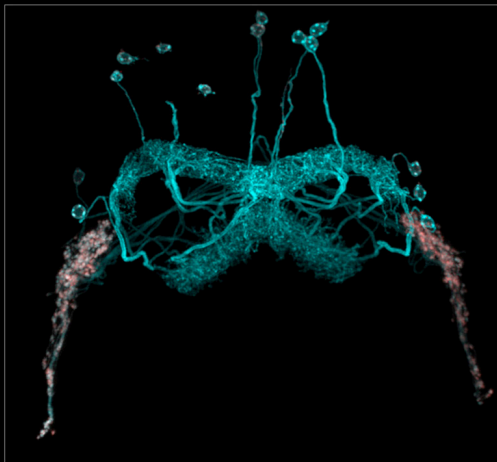
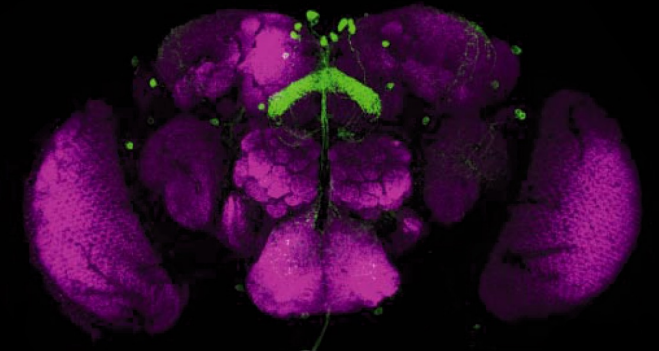
cell 1

cell 2



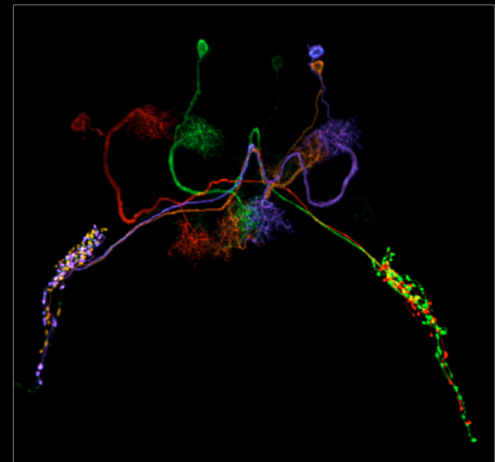
myrGFP

reference stain



membrane

synapses



cell 1

cell 2

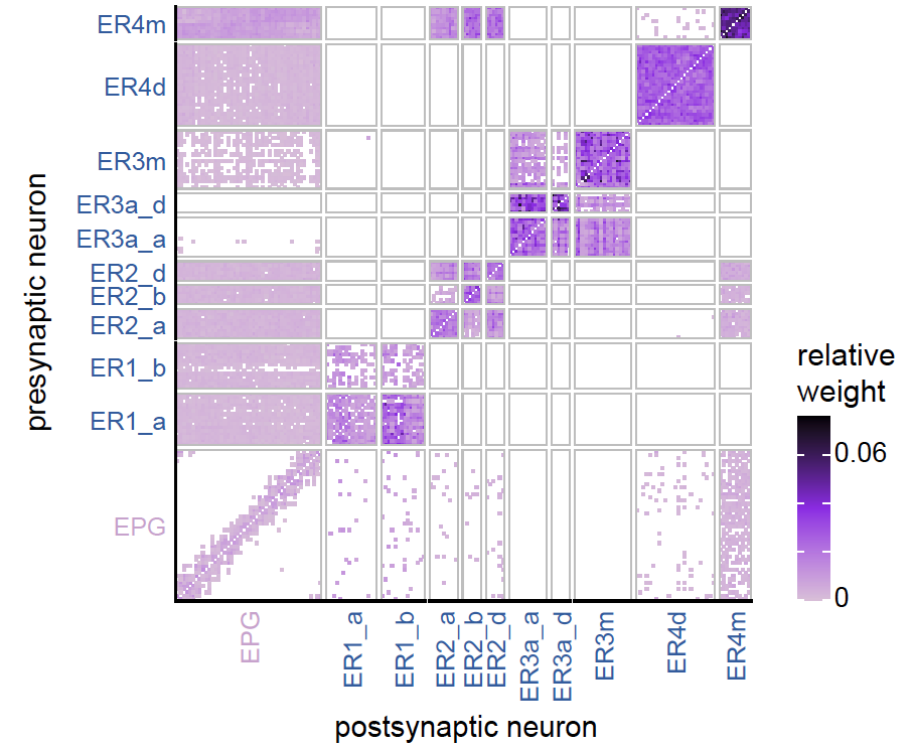
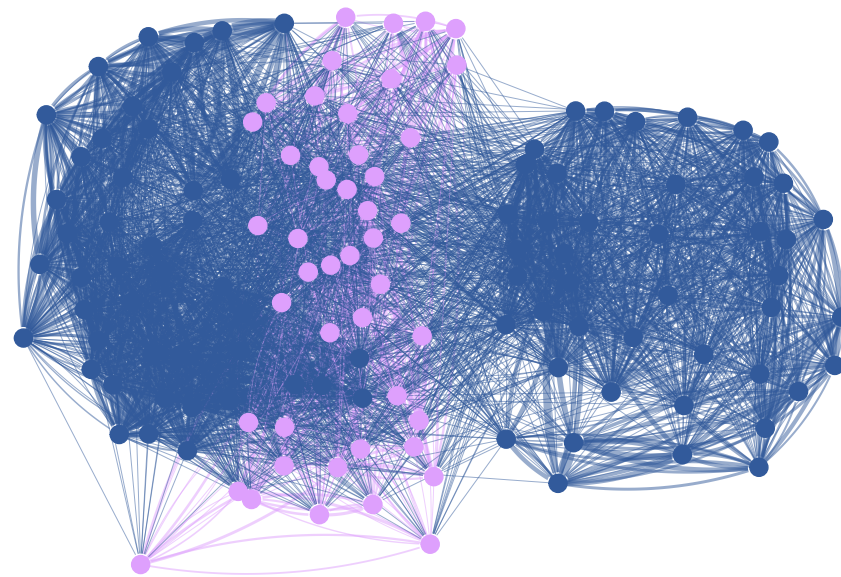
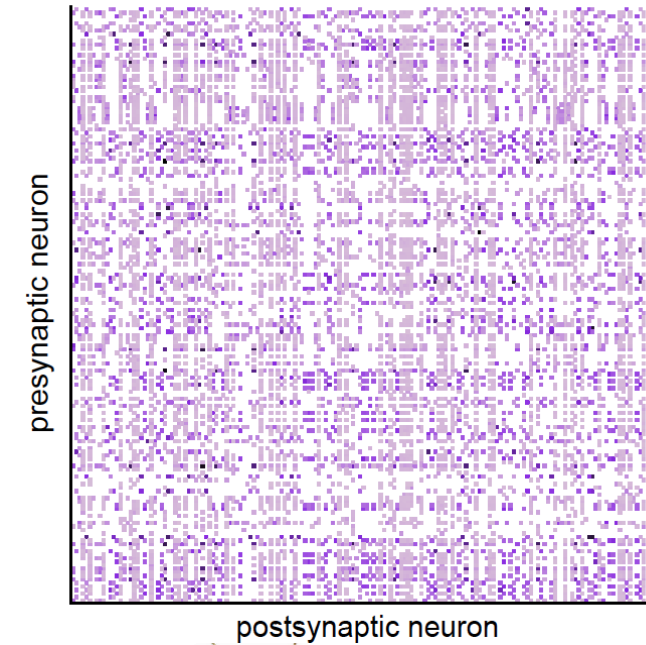
cell 3

cell 4



Rubin lab
Dickson lab

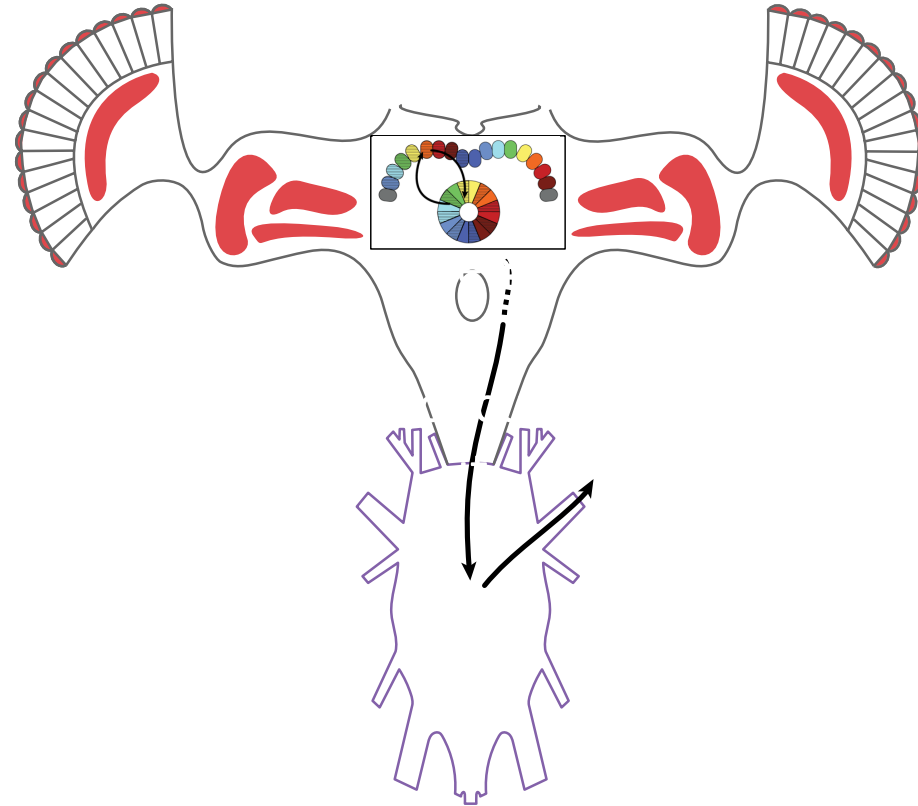
Cell types matter



Knowledge of cell type

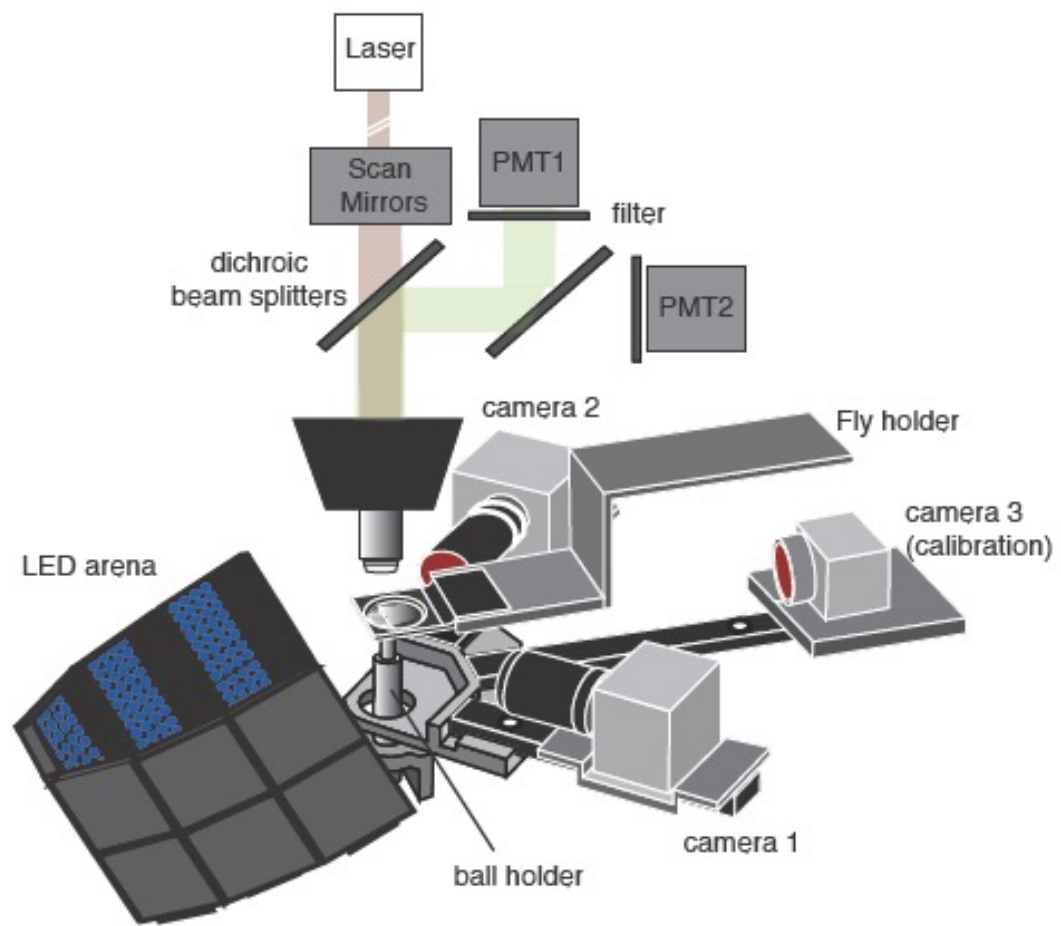
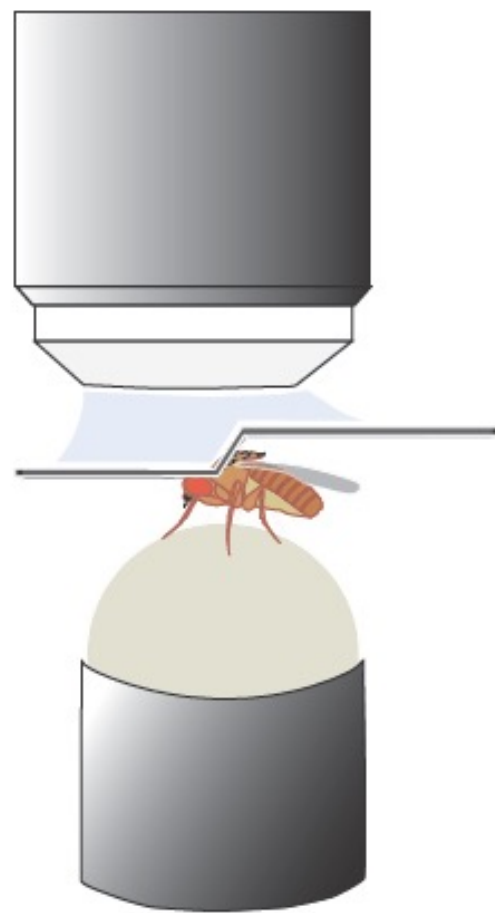


The central complex: internal-representation-driven flexibility

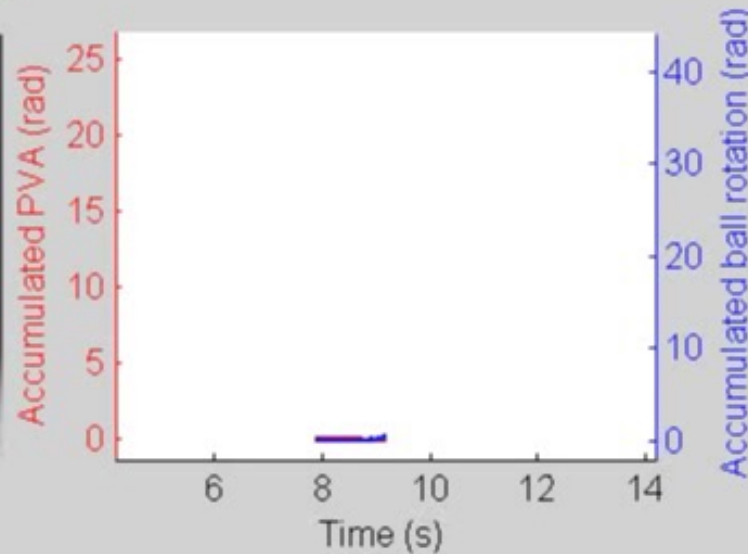
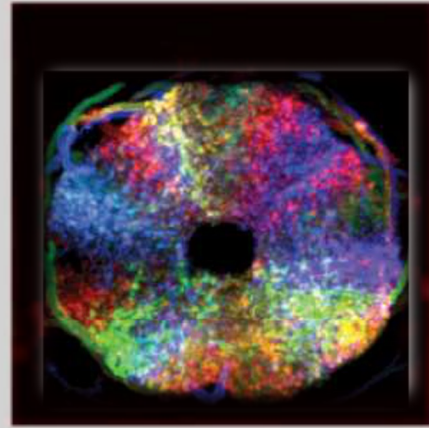
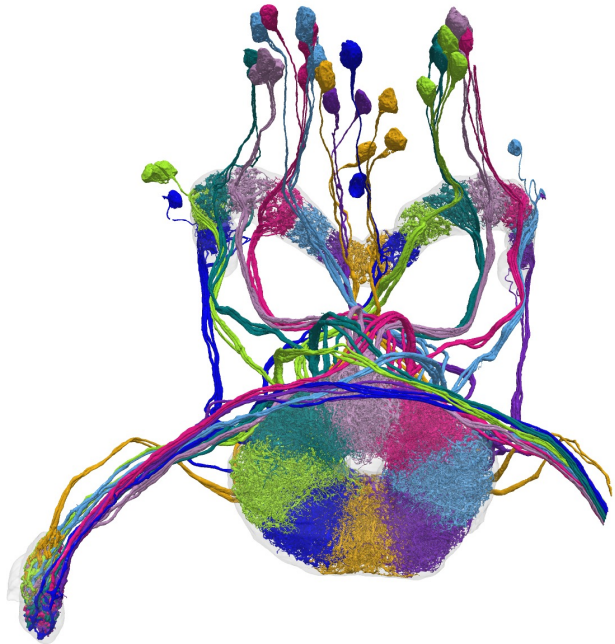


Adapted from M.A. Frye & M.H. Dickinson (2003)

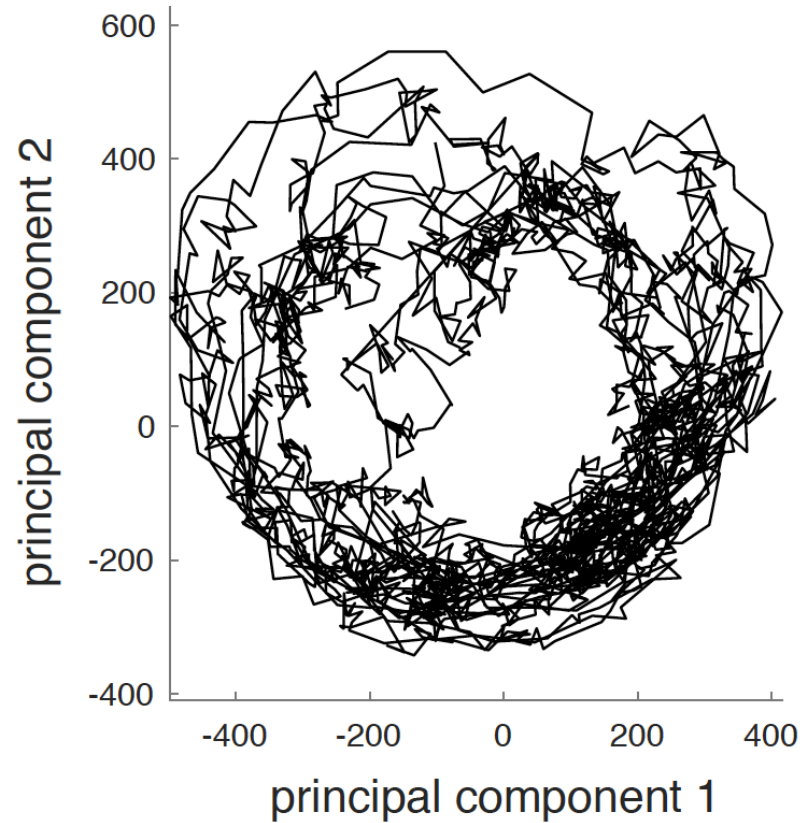
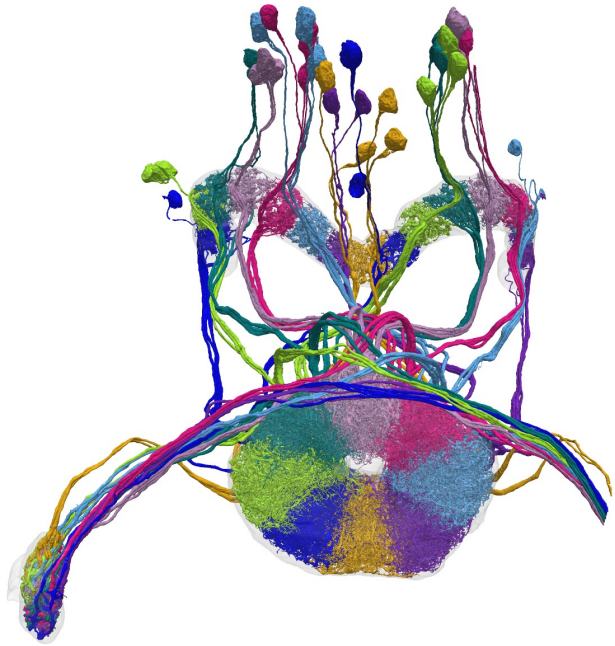




A compass that updates with self-motion



Population activity dynamics lie on a ring



Ring attractor networks: theory-rich area

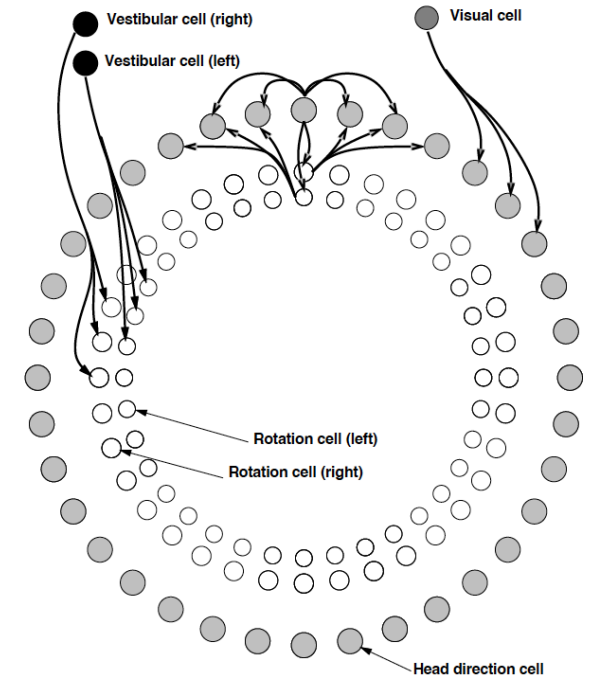
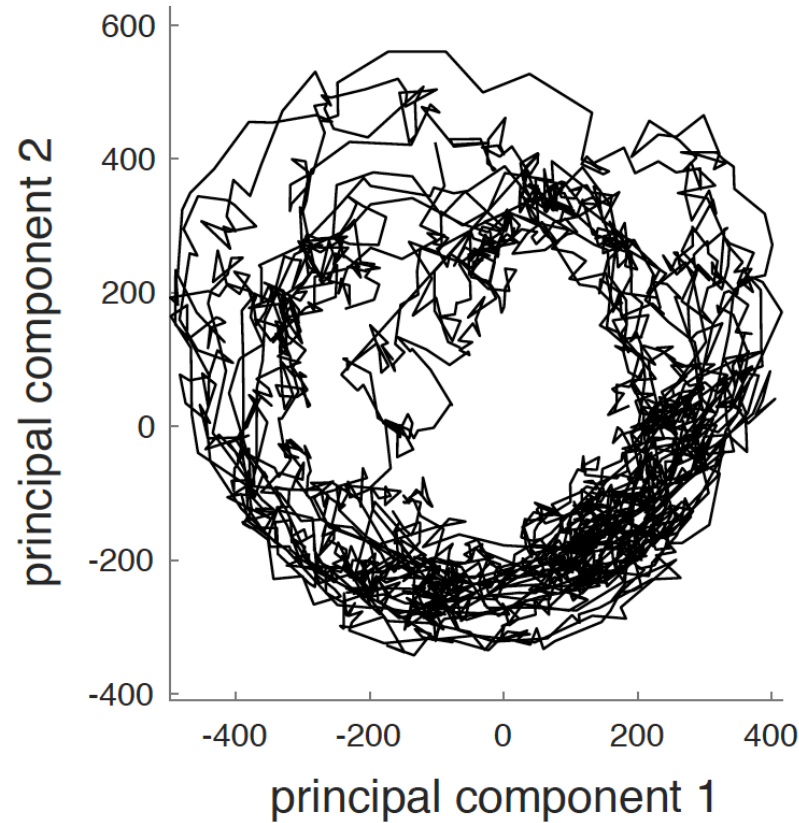
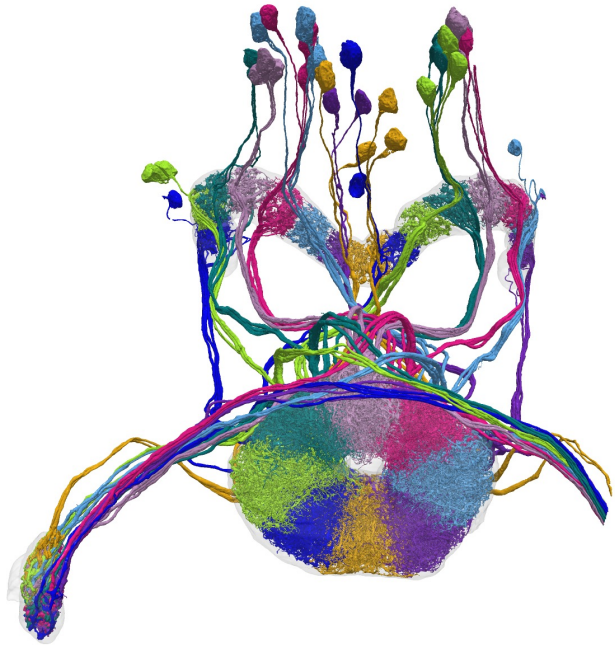
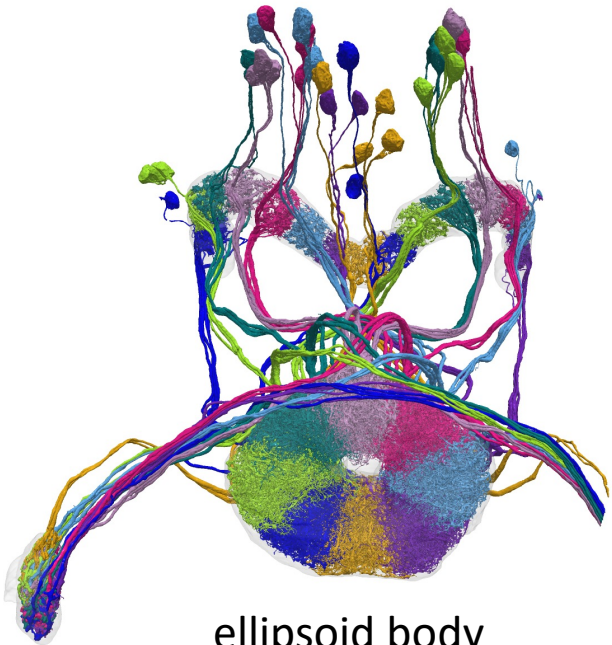


Figure 3: Architecture of the head direction cell model.

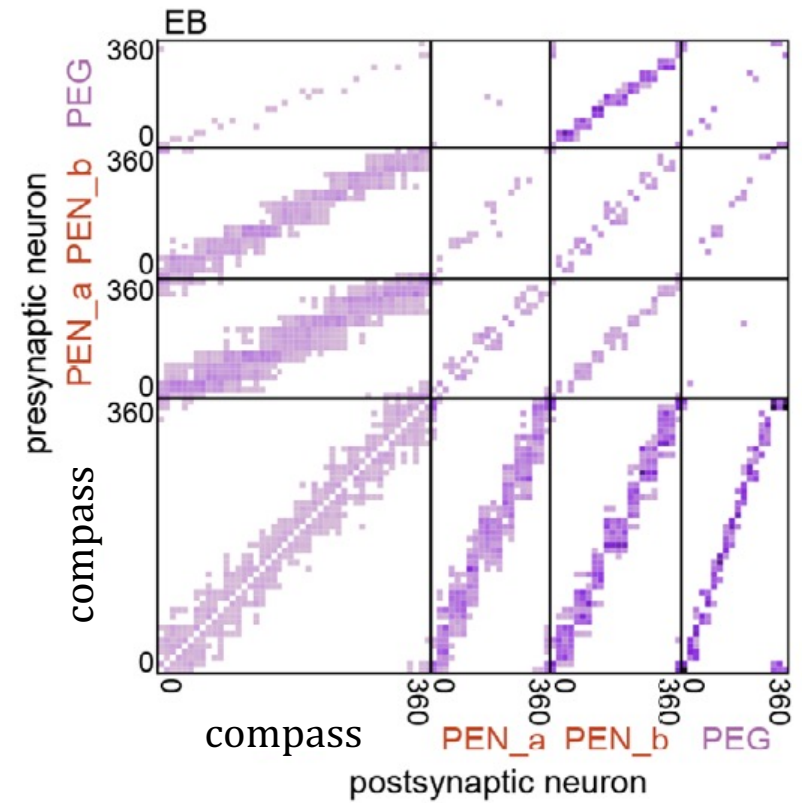
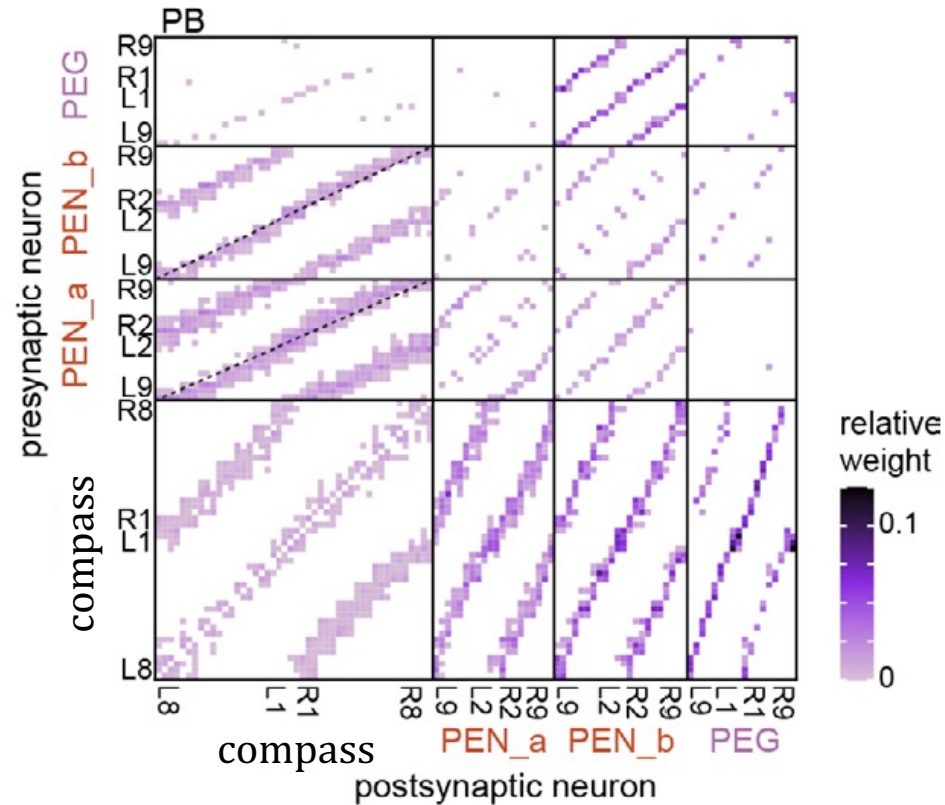
Ben-Yishai et al. (1995); Skaggs, McNaughton et al. (1995); Zhang (1996); Hansel and Sompolinsky (1998); Xie, Hahnloser & Seung (2002); Wu and Amari (2005); Wimmer, Compte et al. (2014); Noorman et al. (2022); ...

Looking at the connectome with a theory-inspired lens

protocerebral bridge
(PB)

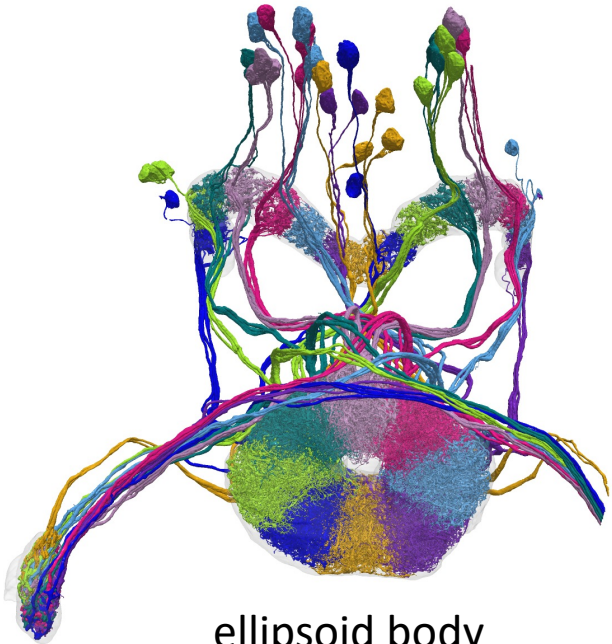


ellipsoid body
(EB)

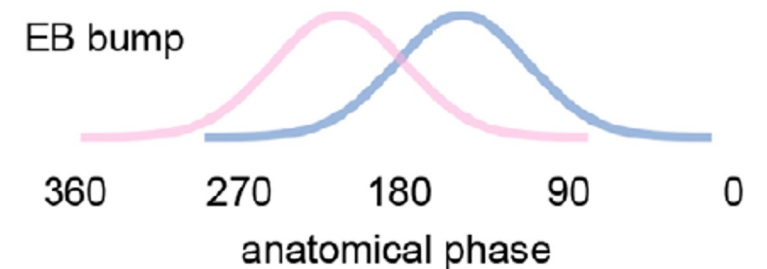
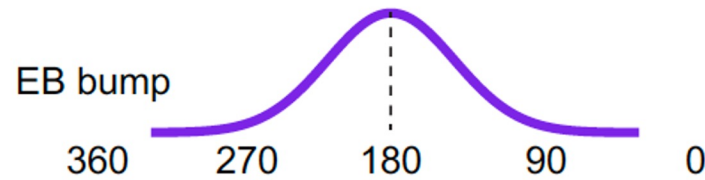
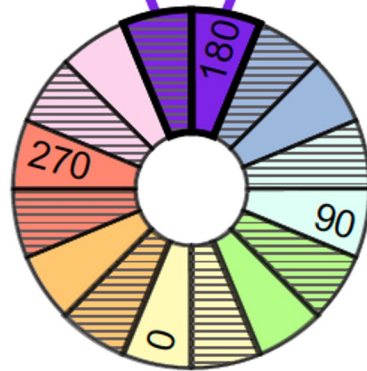
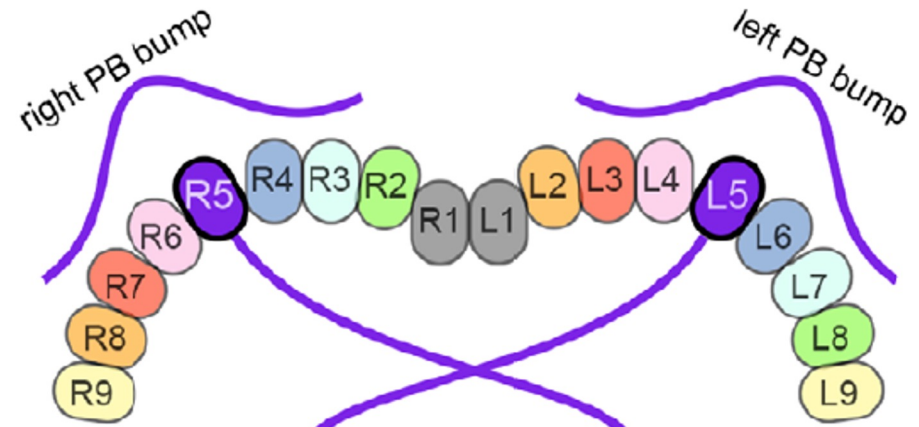
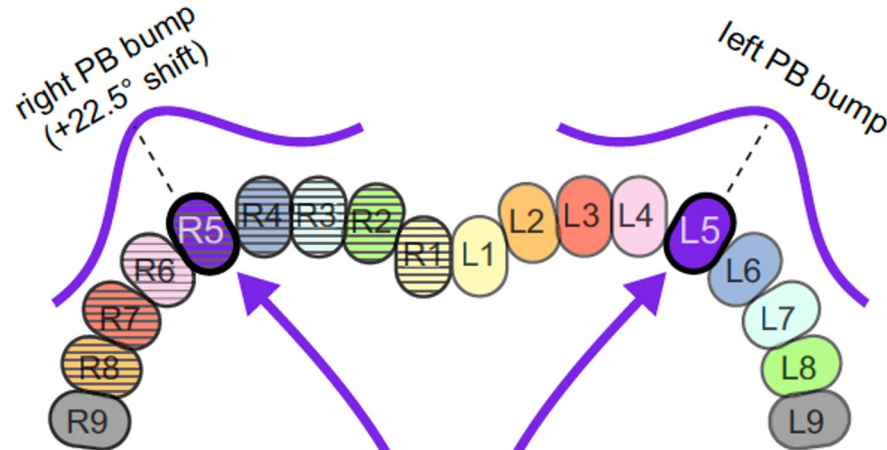


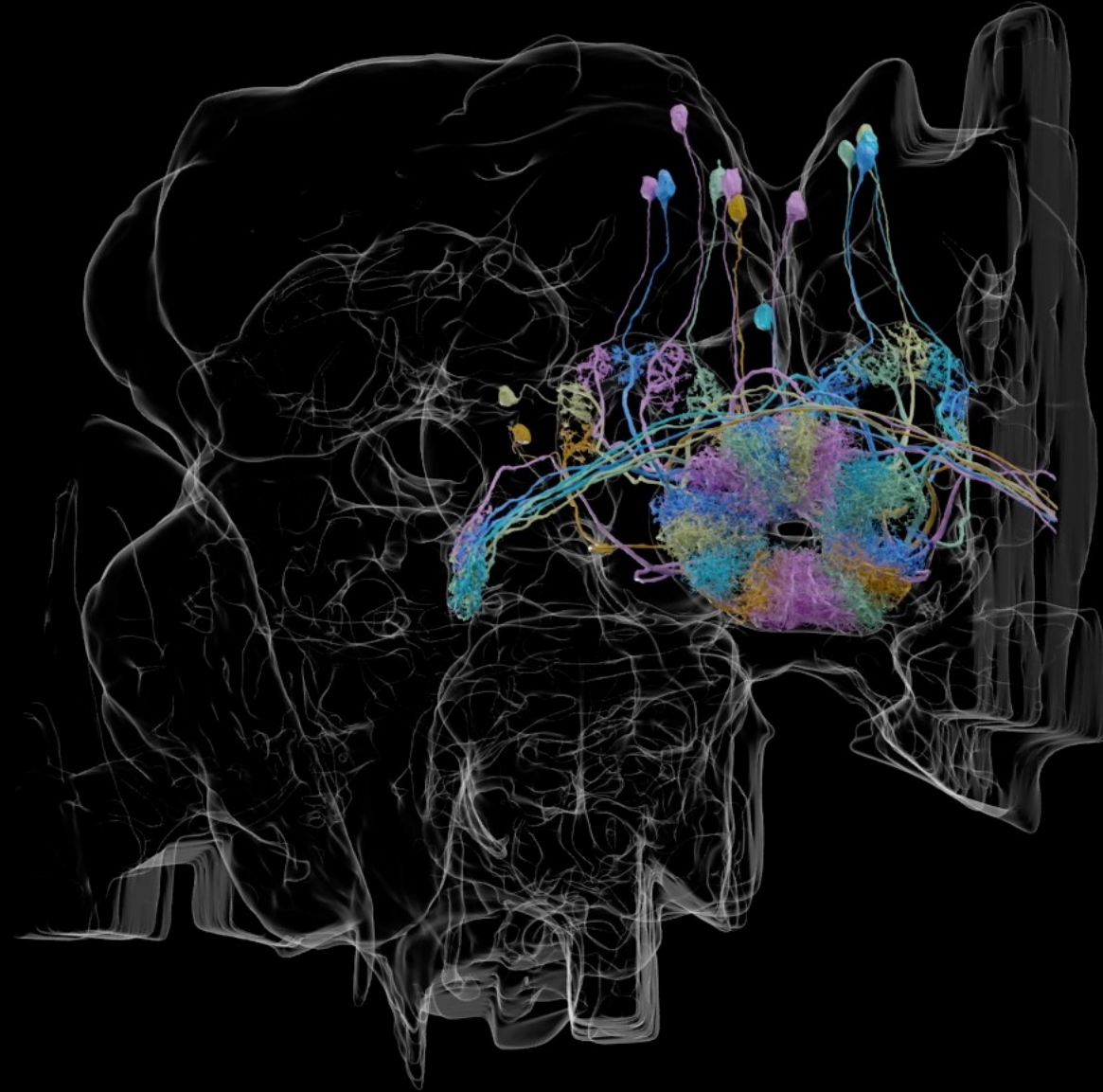
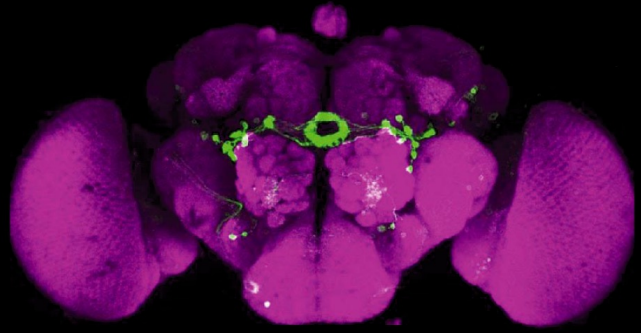
Phase-shifted population updates the compass

protocerebral bridge
(PB)



ellipsoid body
(EB)

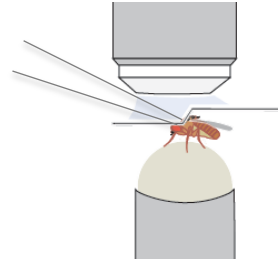
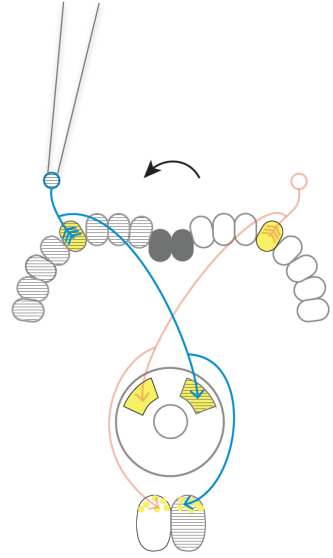
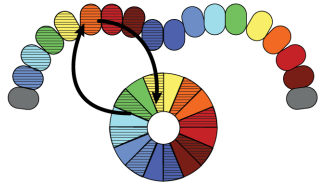




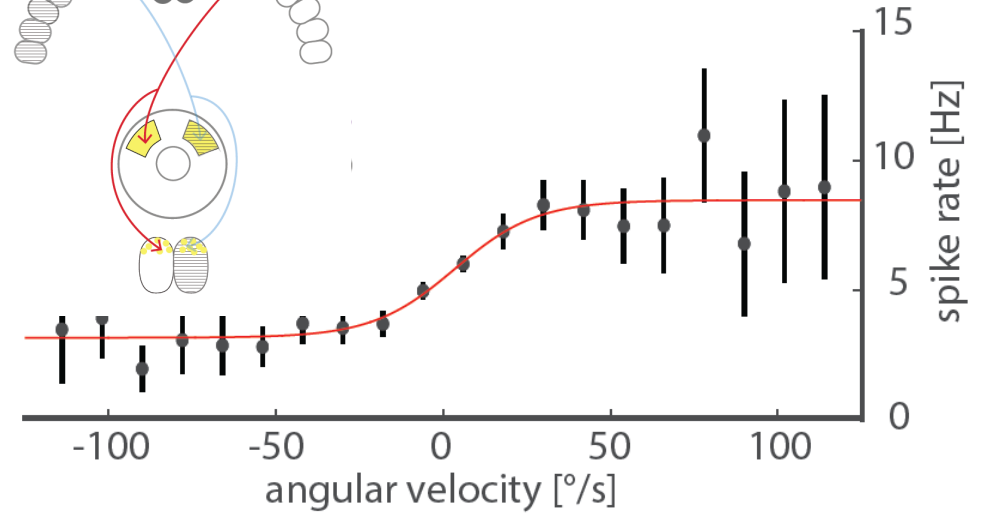
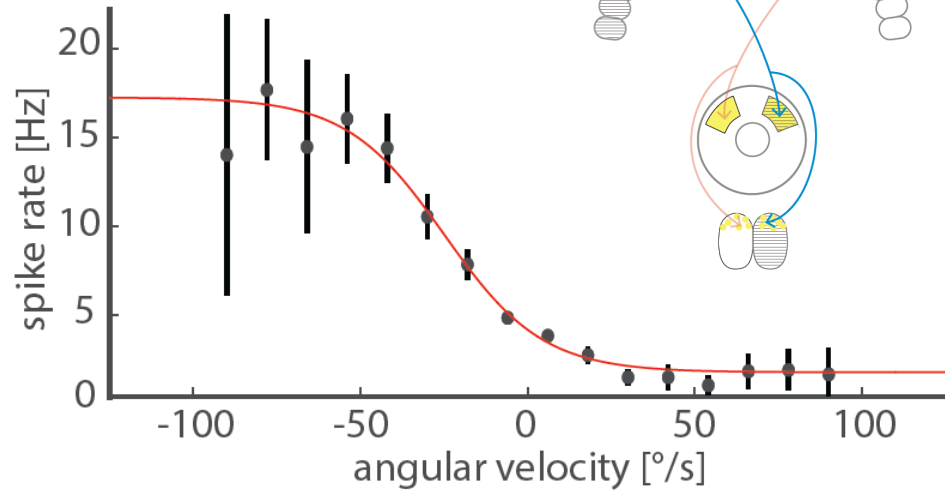
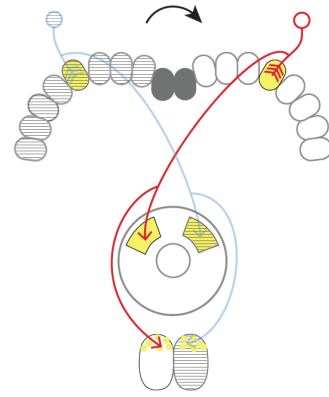
Video credits:
Philip Hubbard &
Shin-ya Takemura



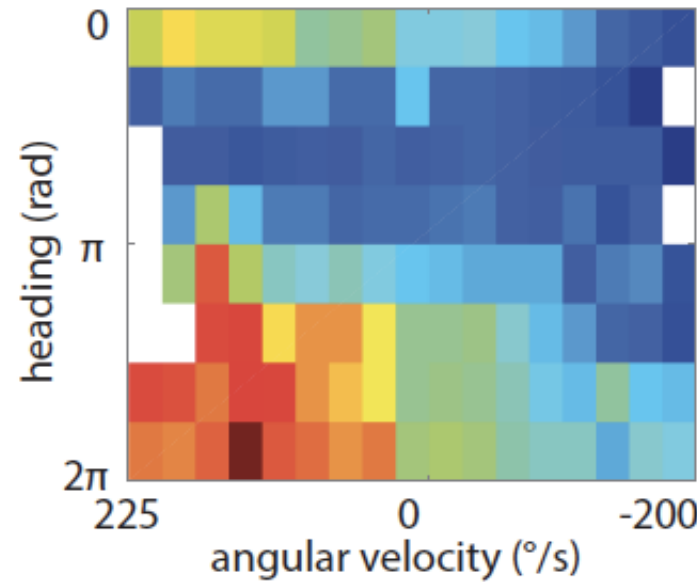
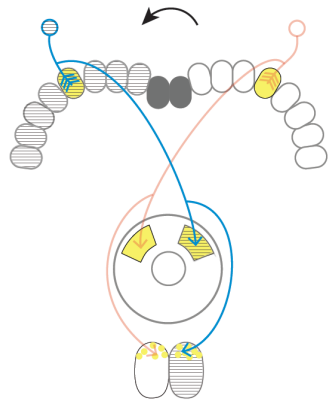
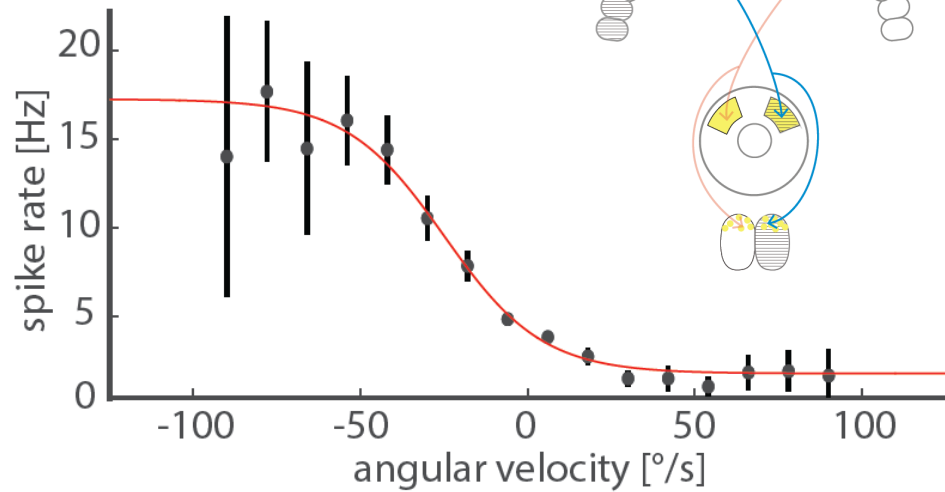
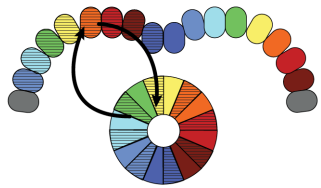
Scheffer et al. (2020); Hulse et al. (2021)



PEN neurons

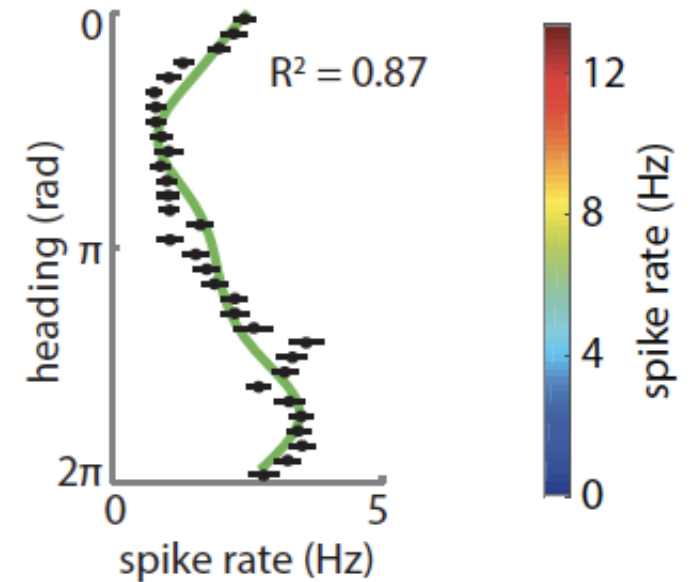


A conjunctive encoding of heading & velocity

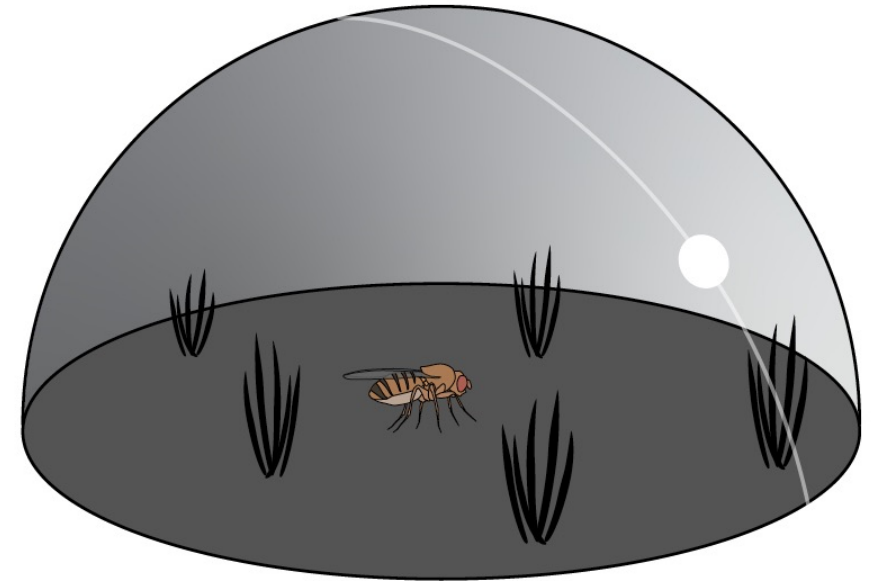
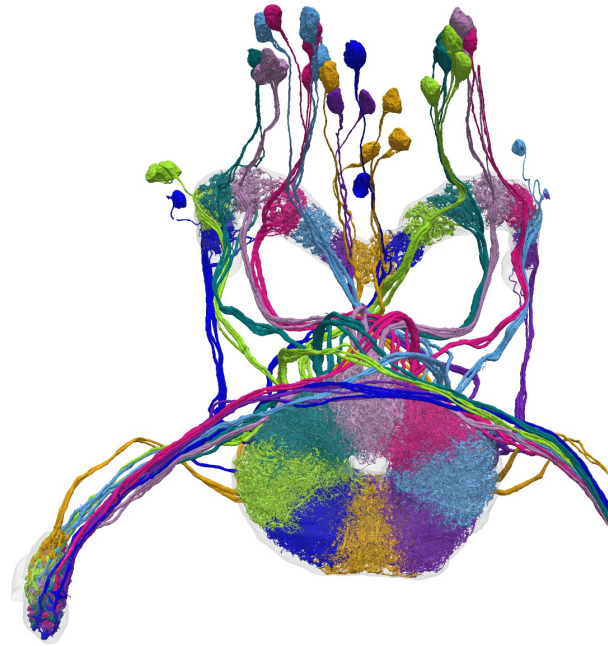


Left

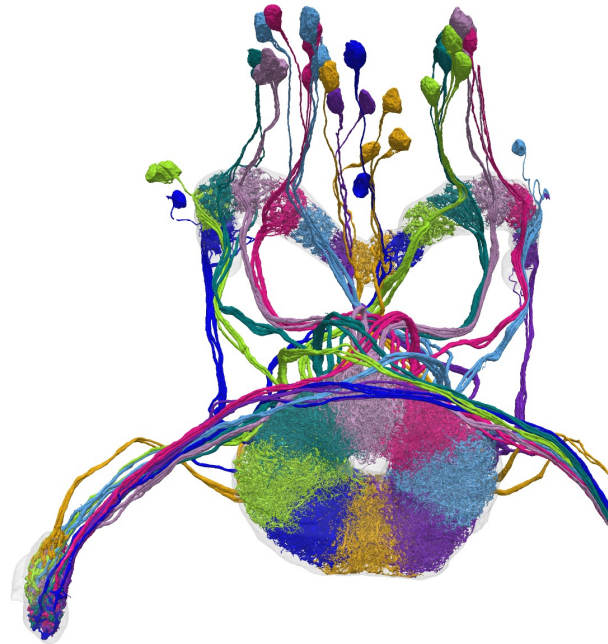
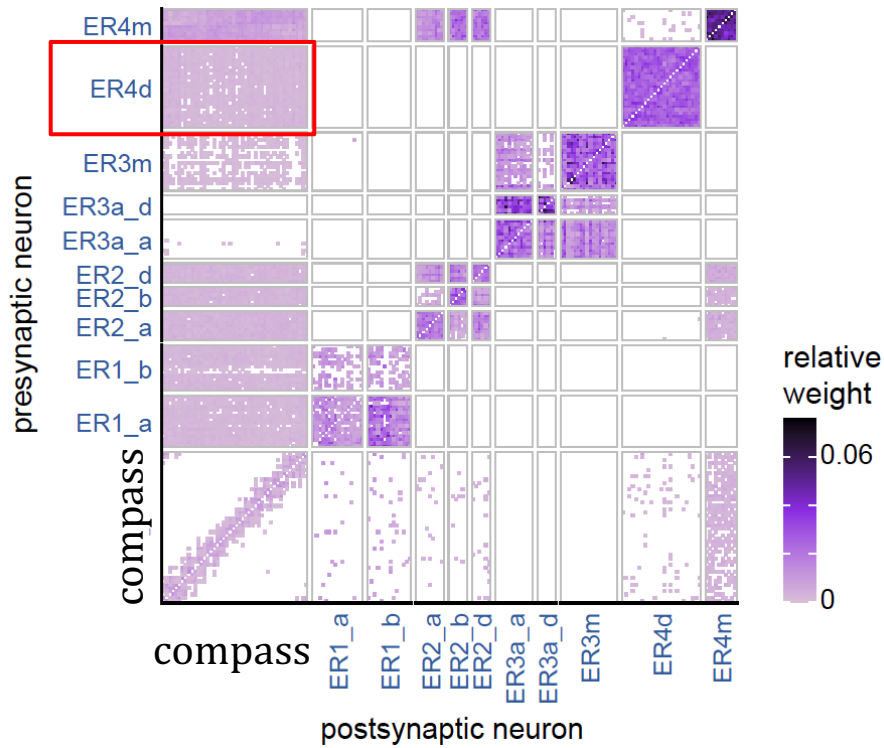
Right



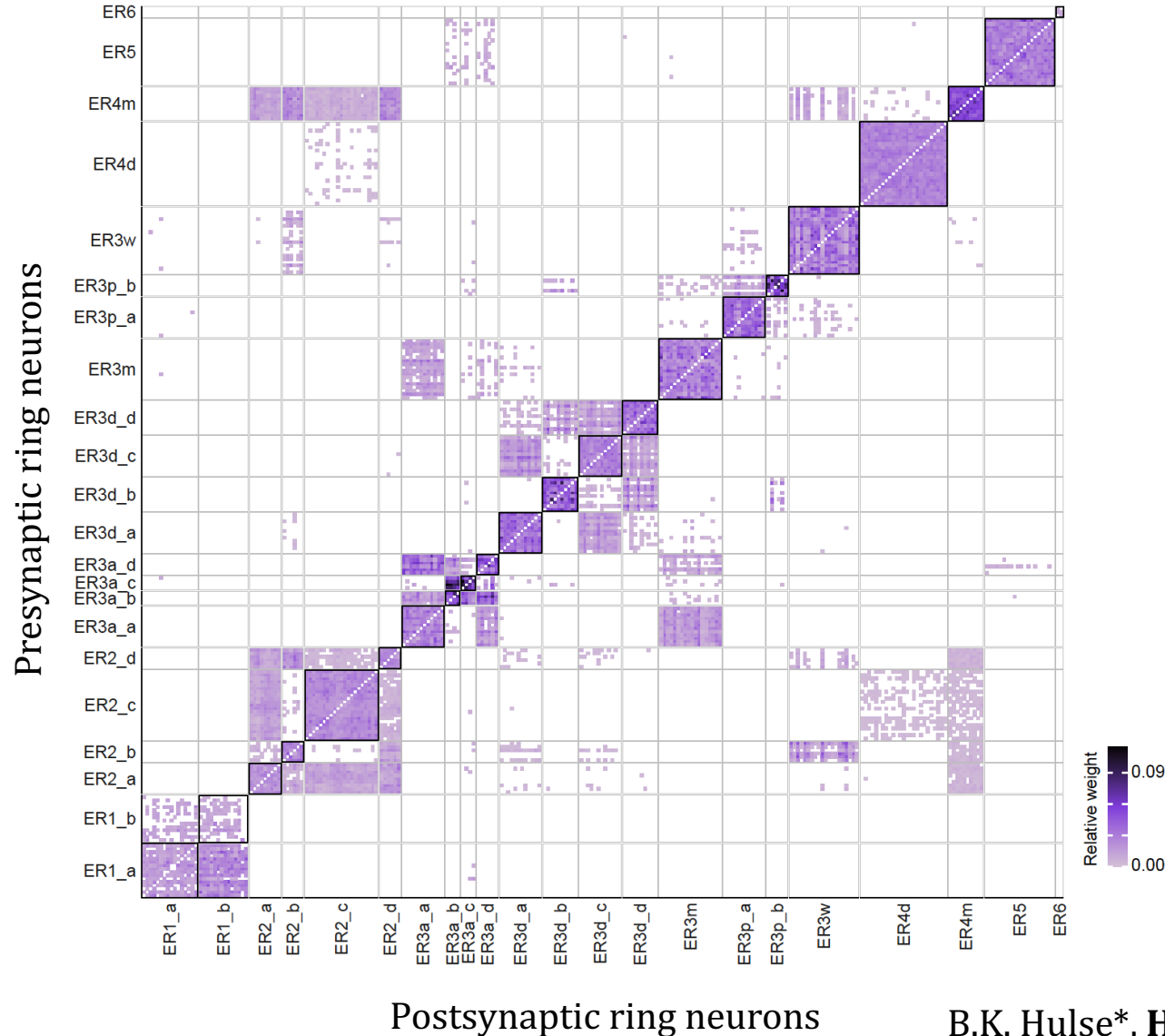
Self-motion input must be combined with localizing sensory input



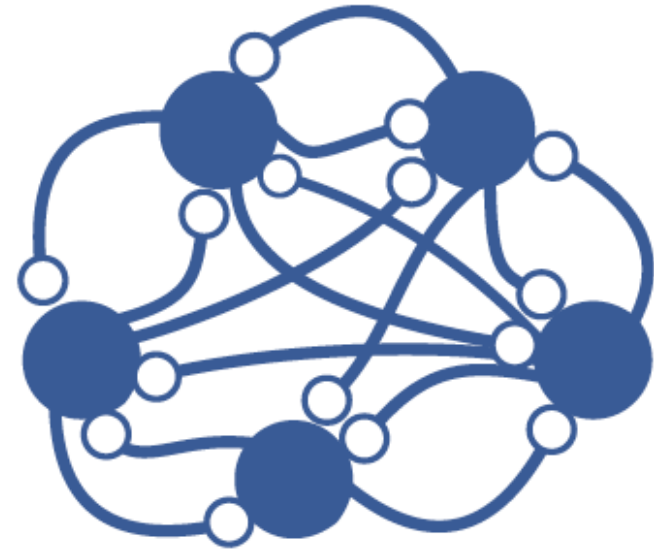
Most “sensory” neurons individually synapse onto all compass neurons



Input neurons synapse onto each other

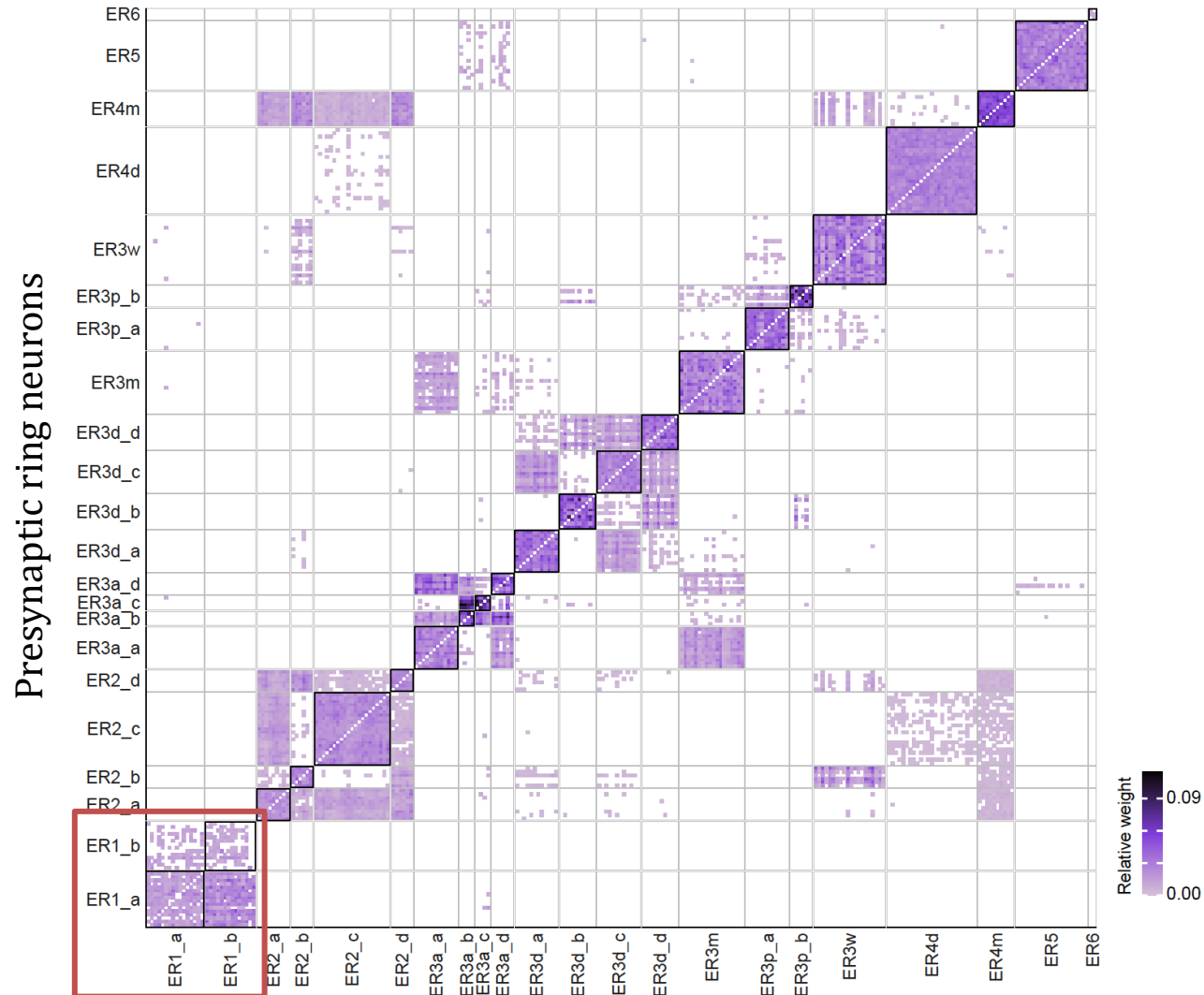


~All-to-all inhibition
within type

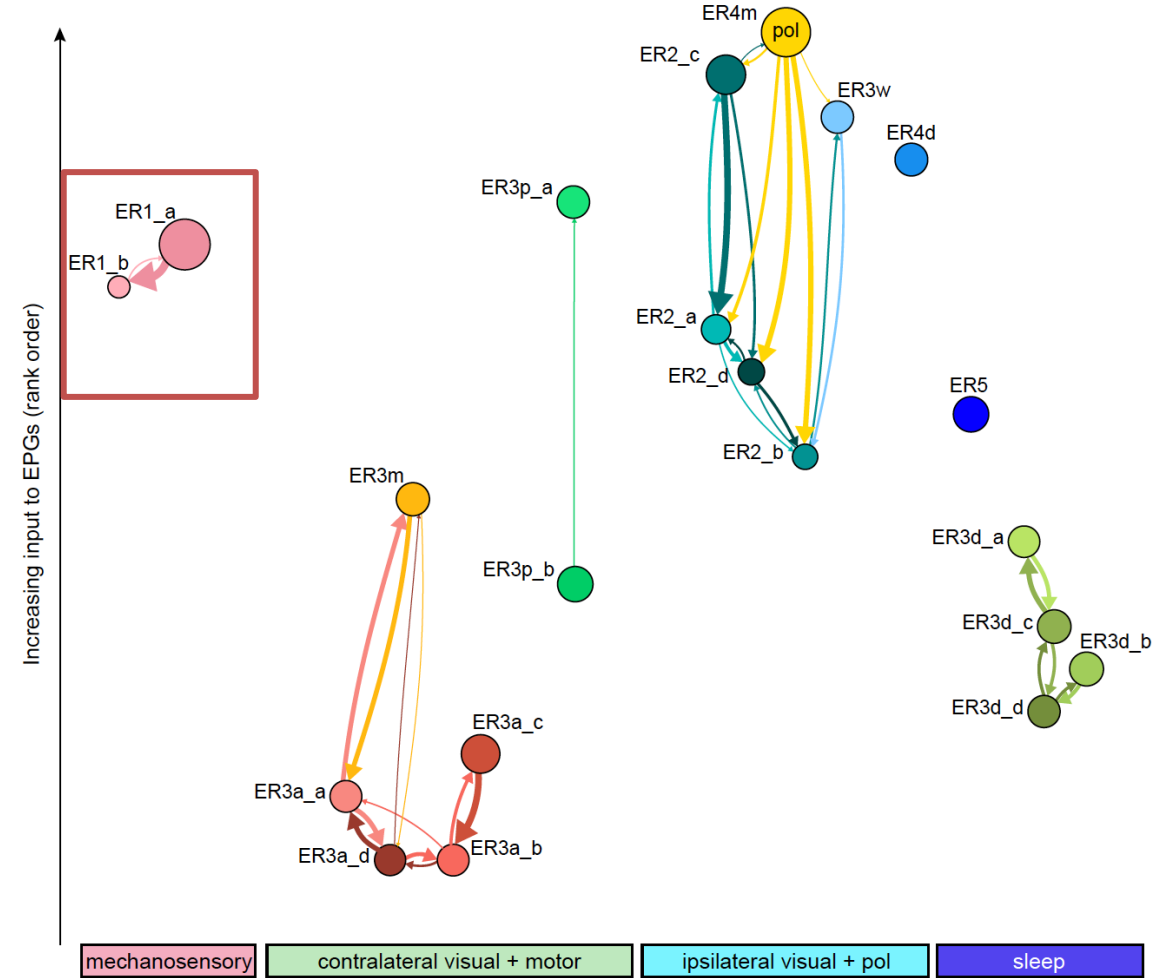


Stimulus selection/
noise suppression

A hierarchy of sensory inputs to the compass

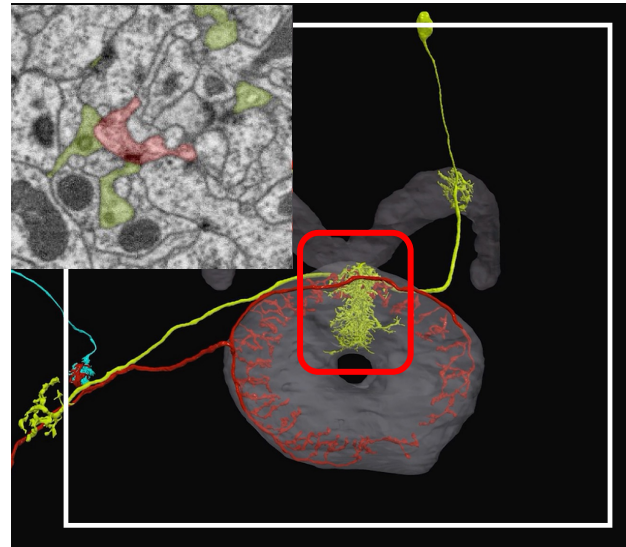


Postsynaptic ring neurons

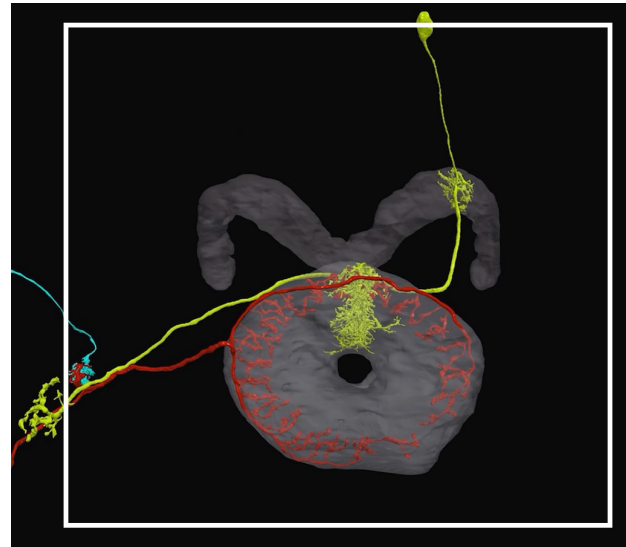
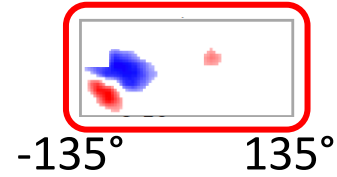


B.K. Hulse*, **H. Haberkern***, R. Franconville*, D.B. Turner-Evans* et al. (2021)

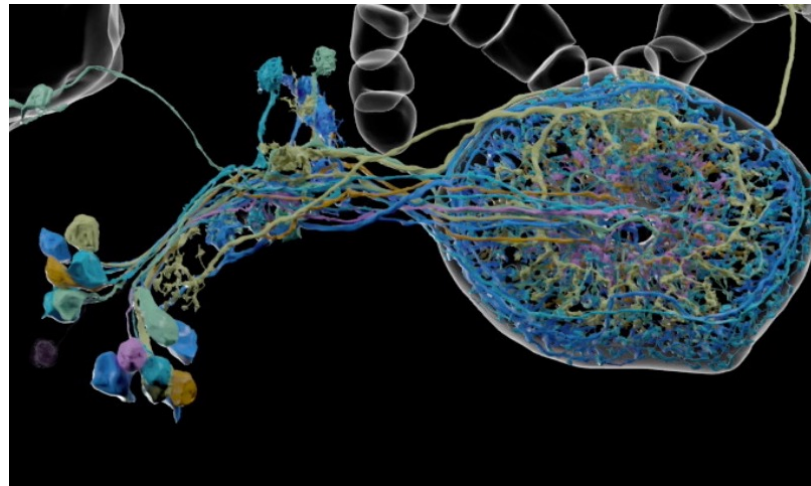
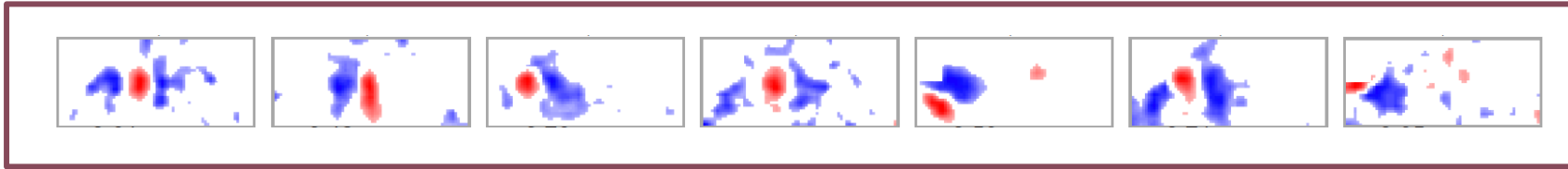
Each input “ring” neuron connects to all compass neurons



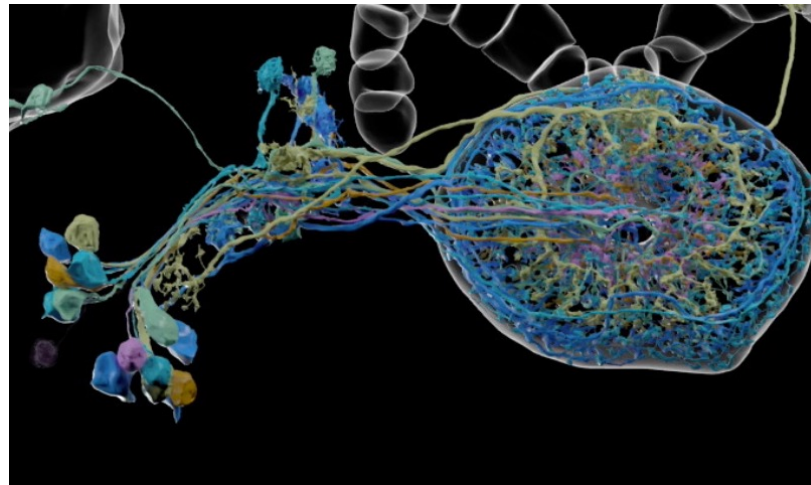
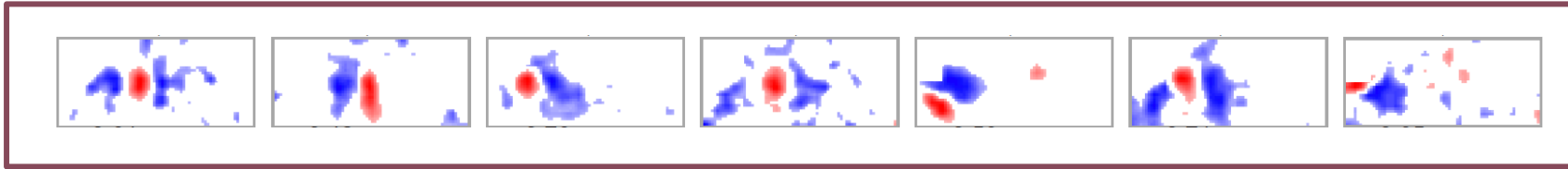
Visual feature input to the compass



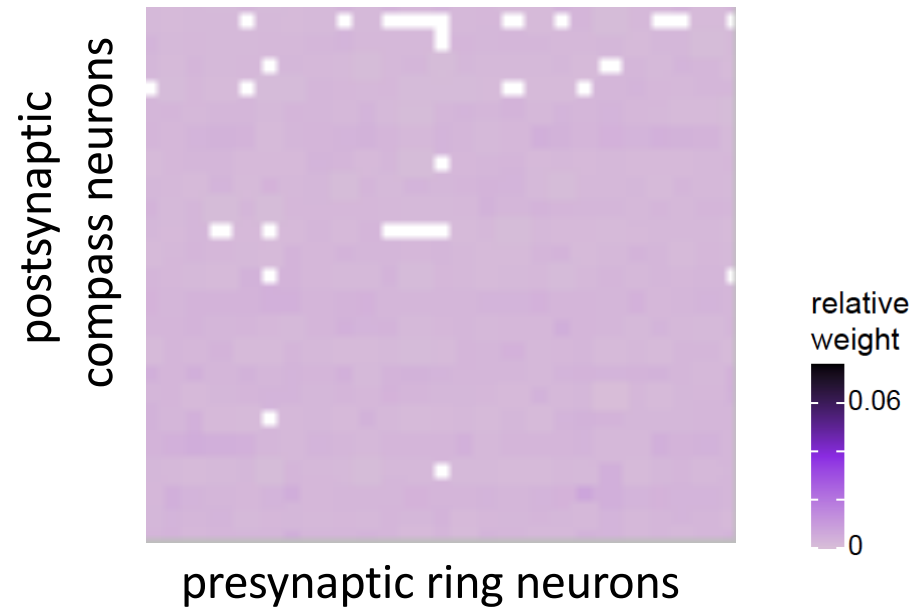
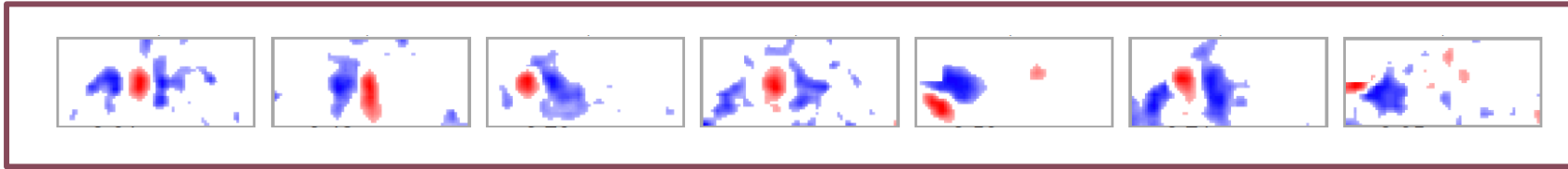
Sample visual receptive fields

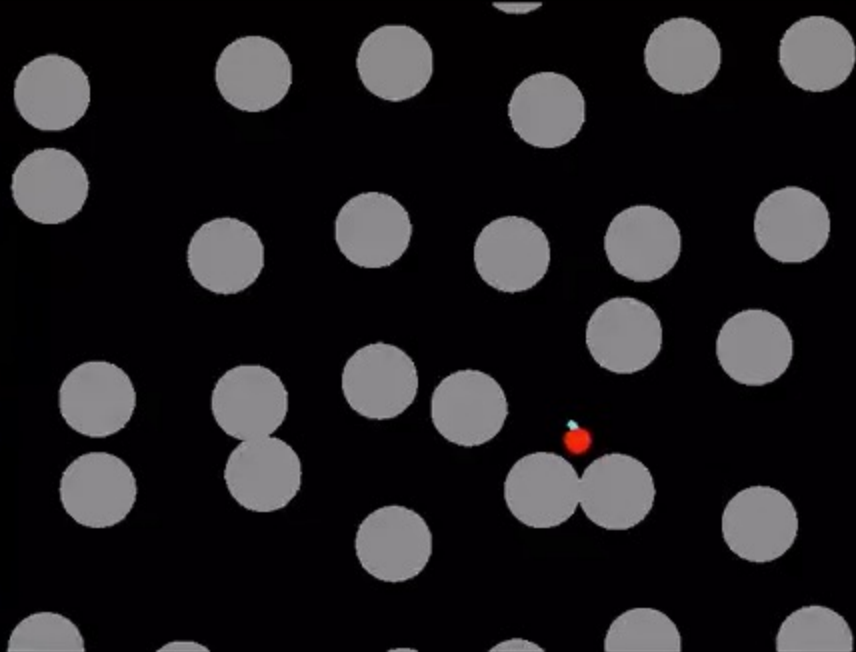
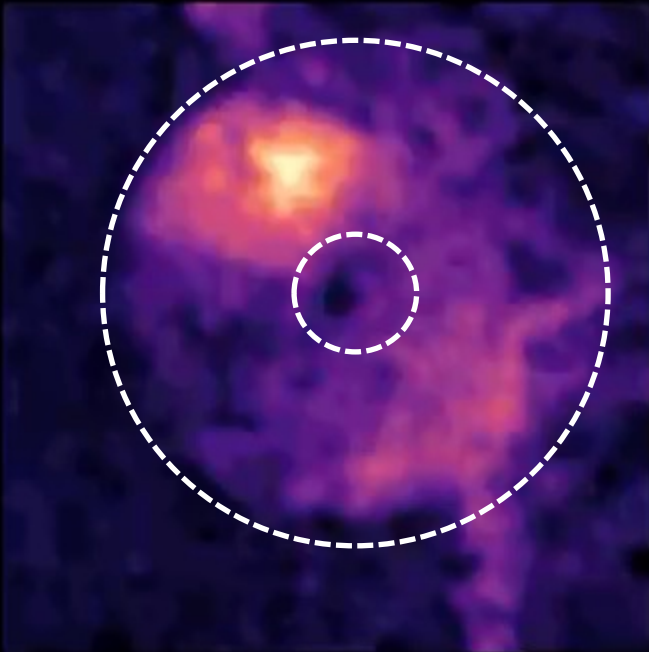


But these synapses are plastic

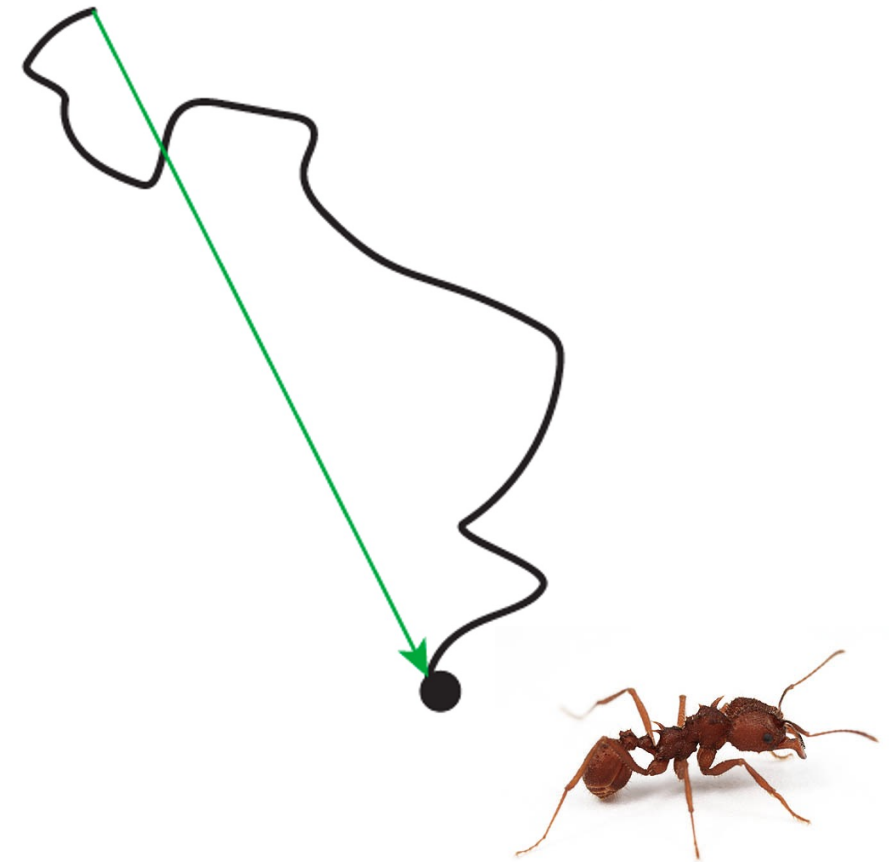
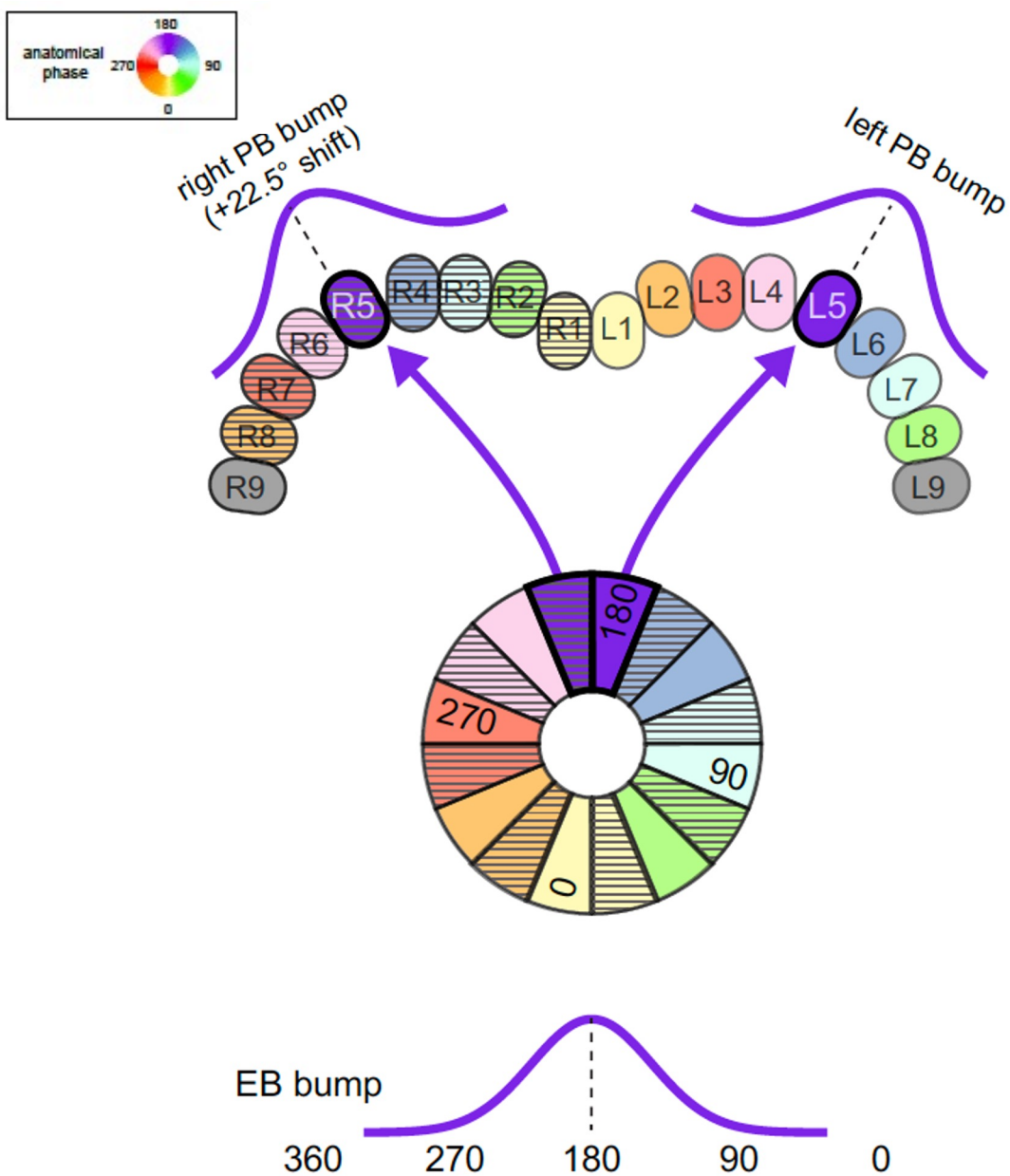


Mapping visual scenes onto the compass





A heading vector for goal-driven navigation



Wehner et al.

A heading vector for goal-driven navigation

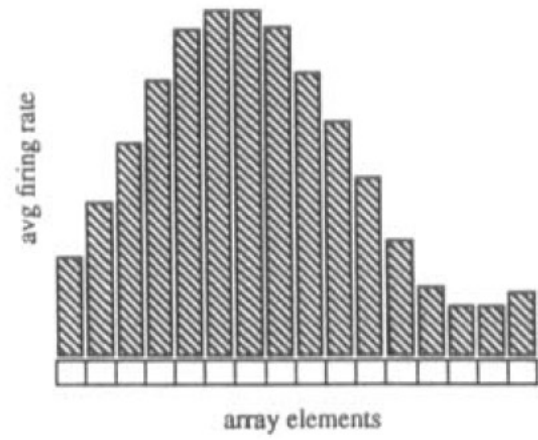
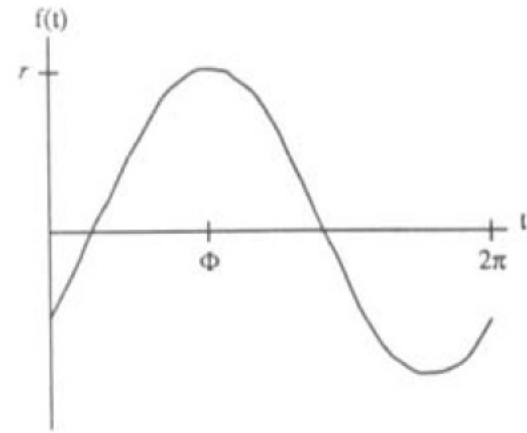
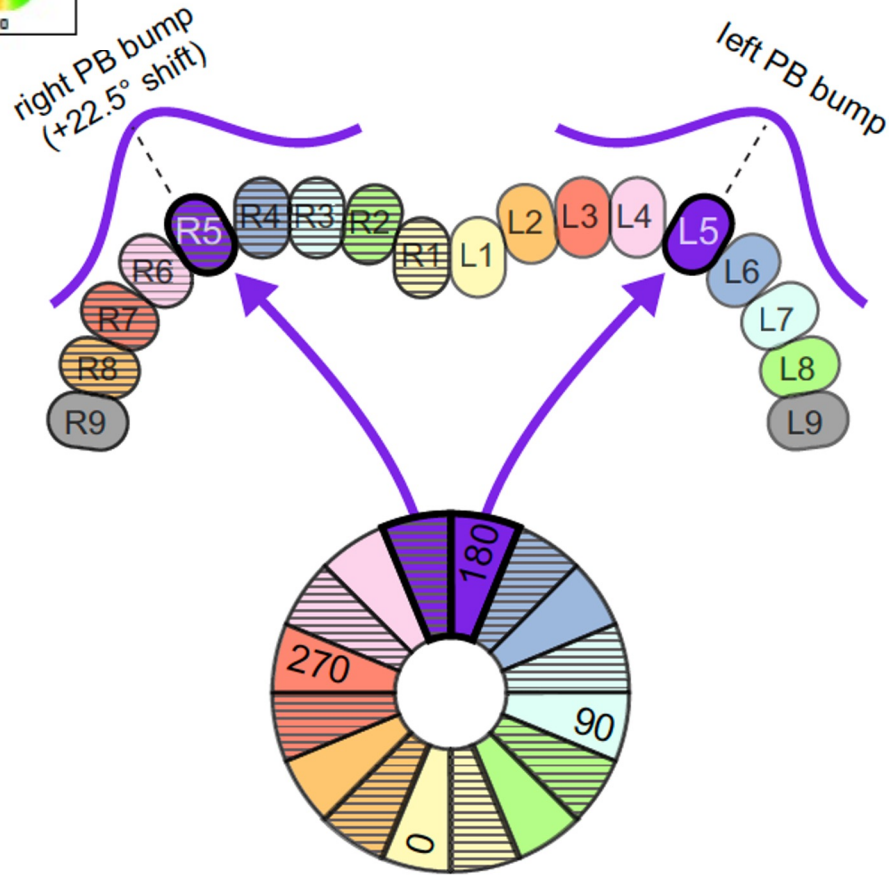
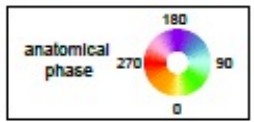
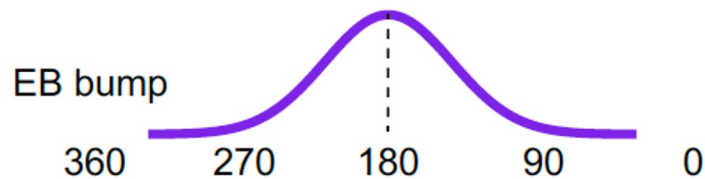


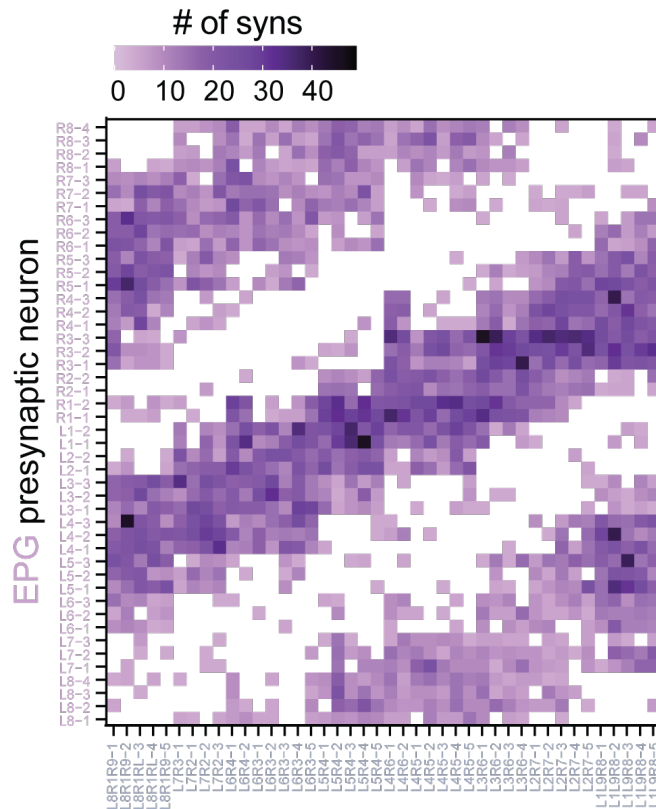
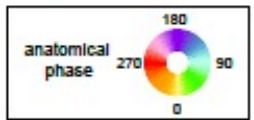
Figure 1: The phasor (r, ϕ) and its sinusoidal array representation.

Touretzky et al., Neural Computation (1993)

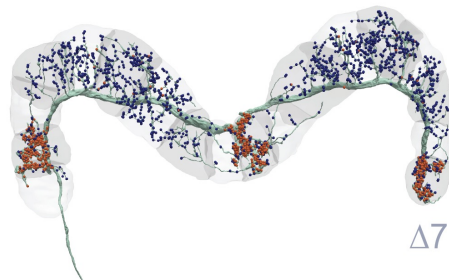
See also: Zipser and Andersen, 1988; Andersen et al., (1993); Salinas and Abbott, (1995); Pouget and Sejnowski, (1997); Pouget and Snyder, (2000); Todorov 2002



Heading activity bump is formatted as a cosine



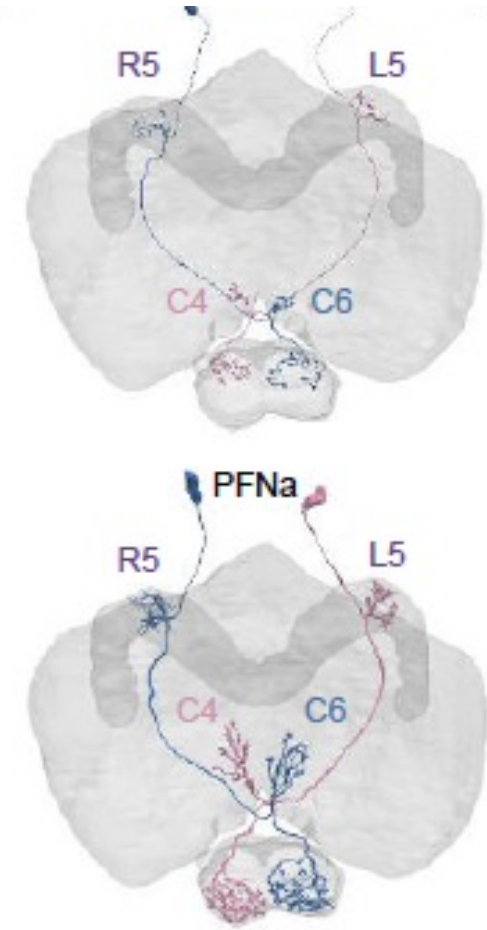
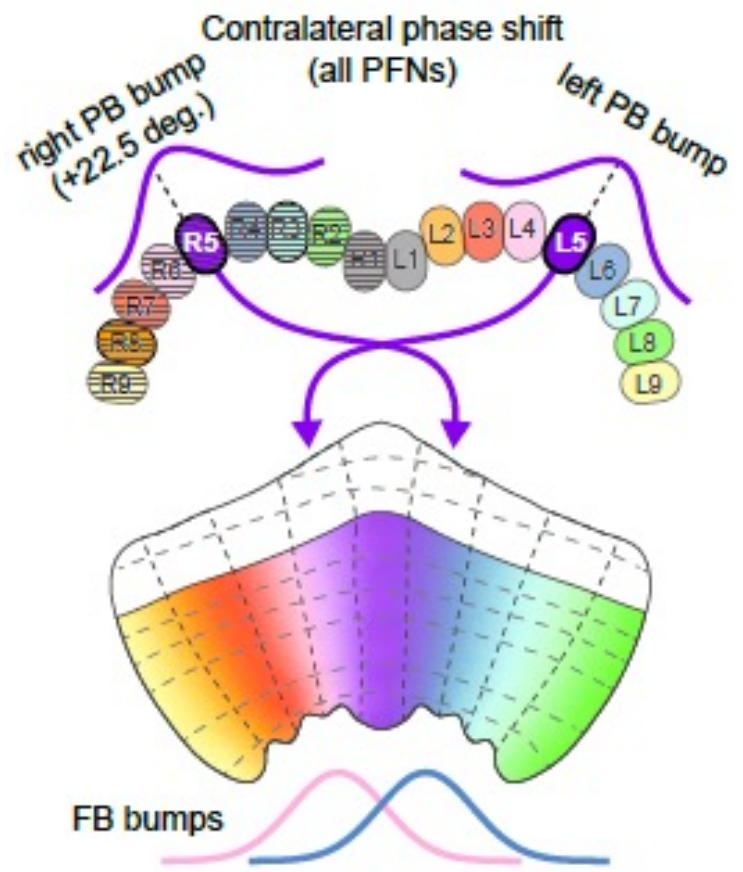
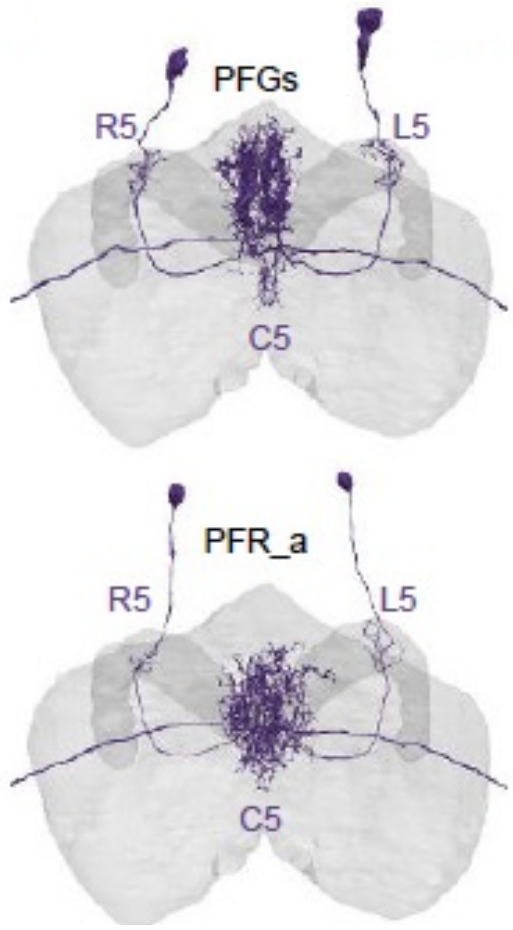
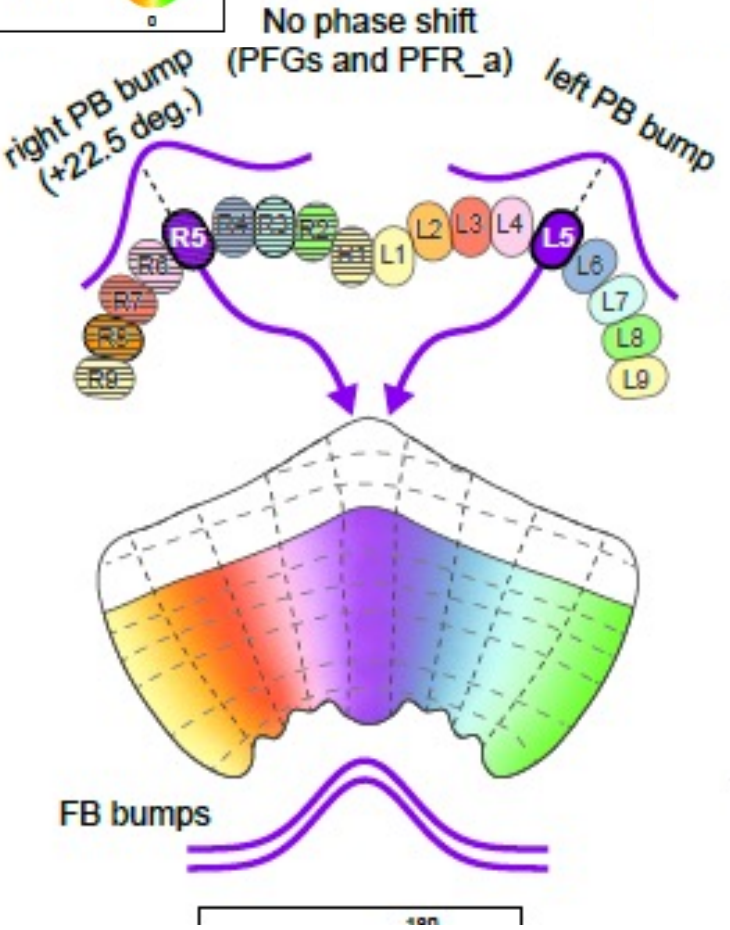
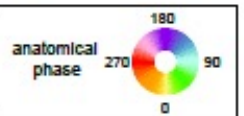
$\Delta 7$ postsynaptic neuron



See also: Lyu et al. (2022)

B.K. Hulse*, H. Haberkern*, R. Franconville*, **D.B. Turner-Evans*** et al. (2021)

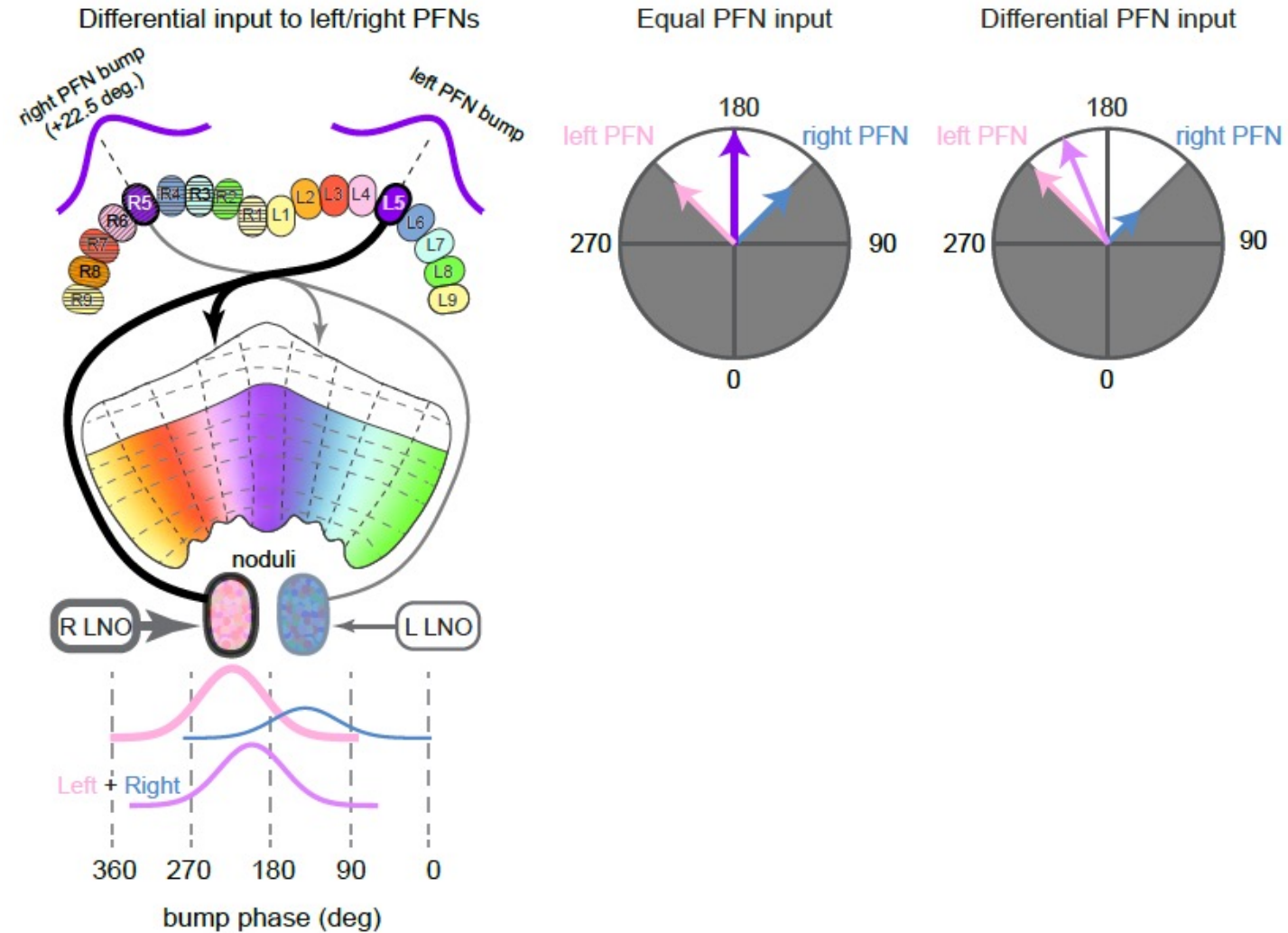
Anatomical phase shifts in the fan-shaped body (FB)



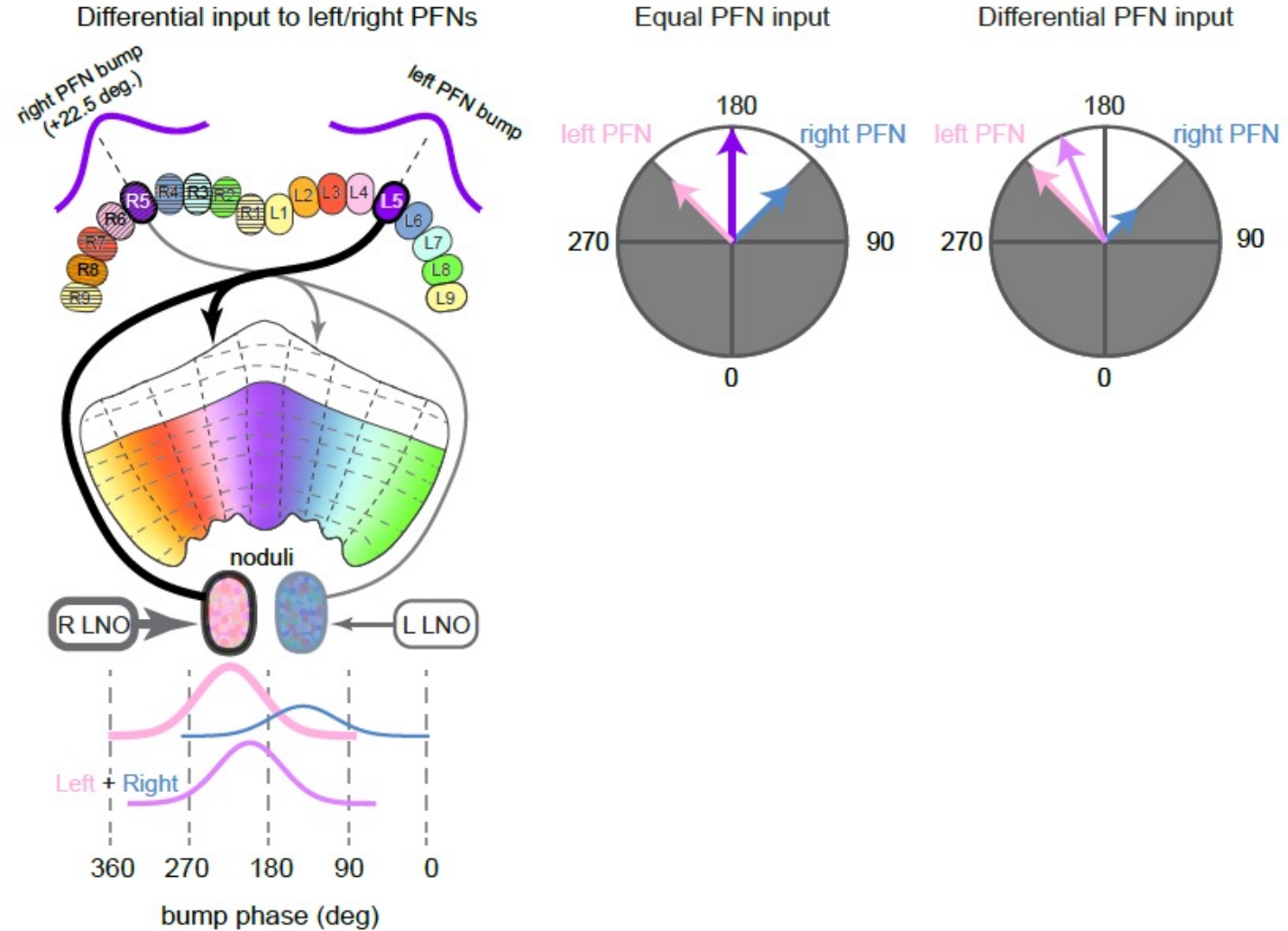
See also: Stone et al. (2017) (Heinze & Webb labs)

B.K. Hulse*, H. Haberkern*, R. Franconville*, D.B. Turner-Evans* et al. (2021)

A circuit motif for coordinate transformations



A circuit motif for coordinate transformations

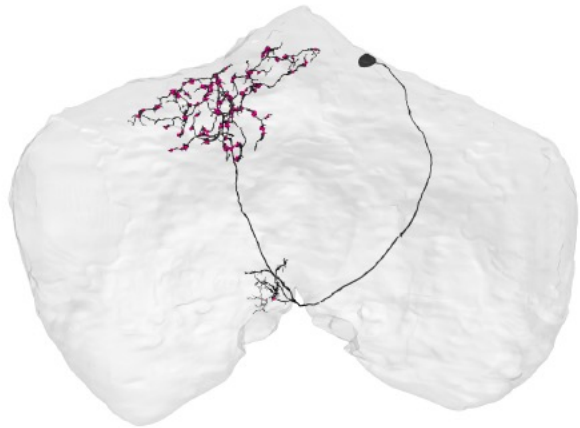


Stone et al., Current Bio. (2017)
Shiozaki, et al., Neuron (2020)
Currier et al., eLife (2020)

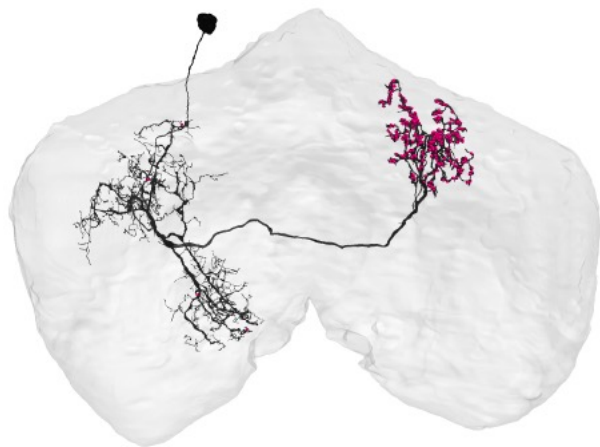
Self-motion input

See also: C. Lyu et al. (2022); J. Lu et al. (2022)

B.K. Hulse*, H. Haberkern*, R. Franconville*, D.B. Turner-Evans* et al. (2021)



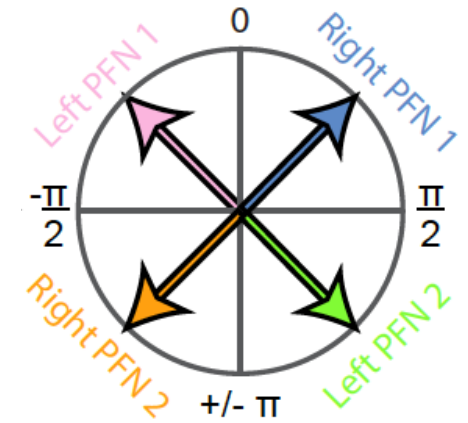
$v\Delta$ ($v\Delta D$)



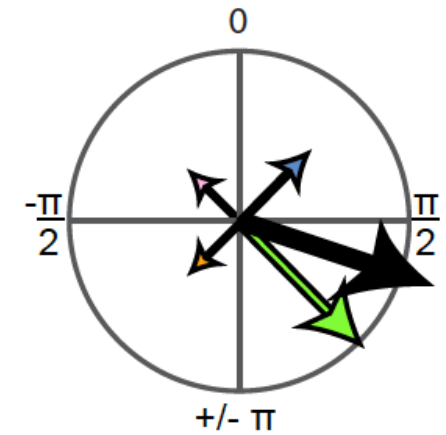
$h\Delta$ ($h\Delta C$)

= 180° phase shift!

Four vector basis set

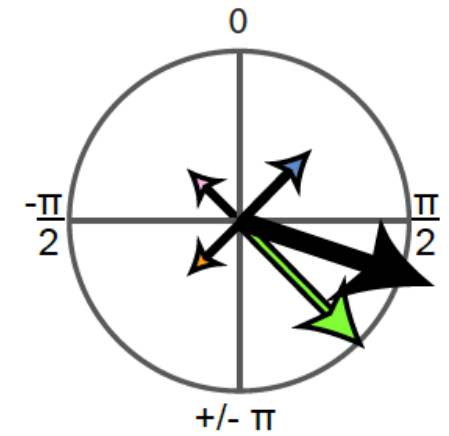
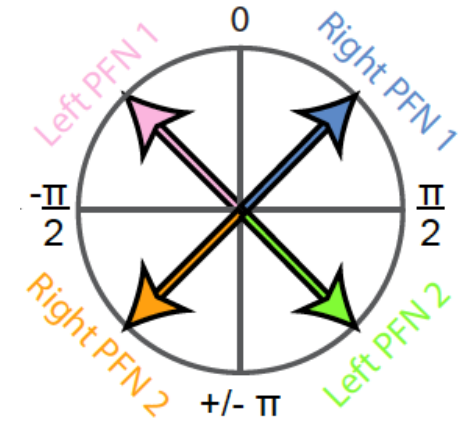
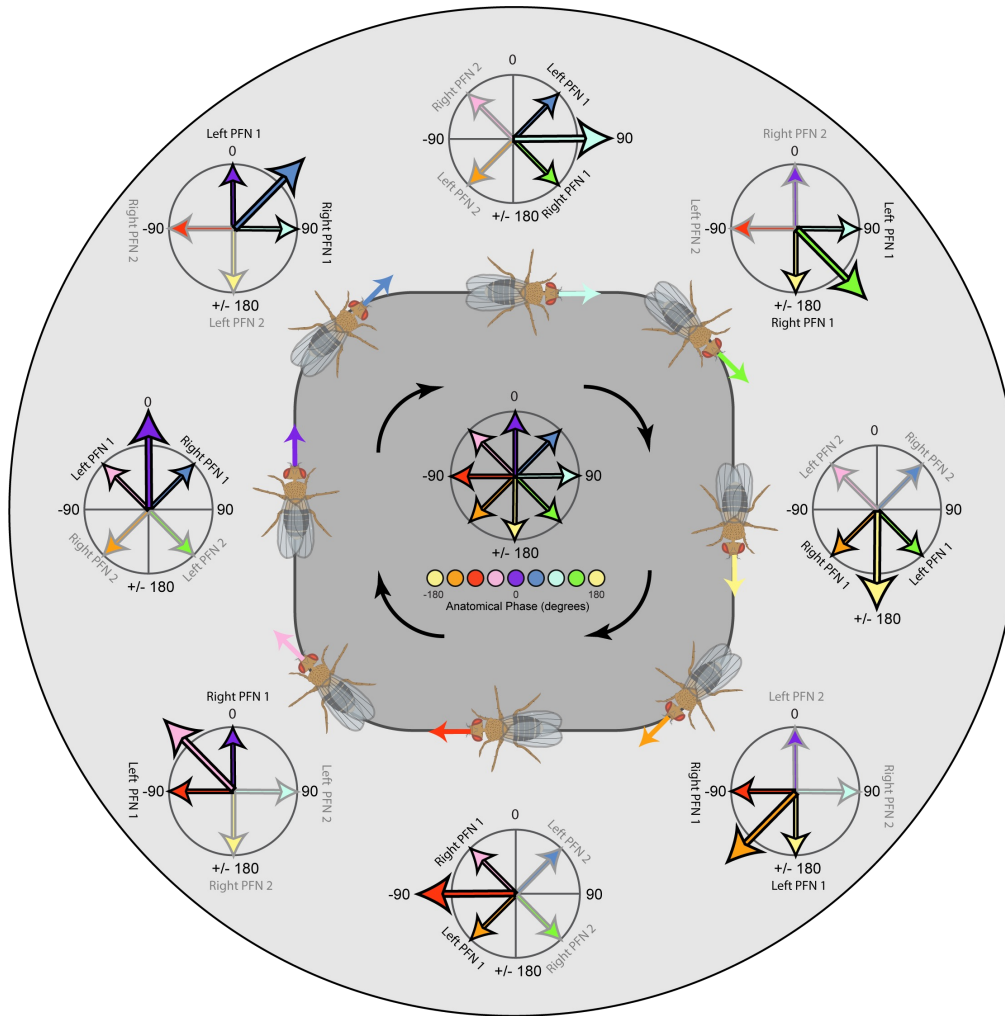
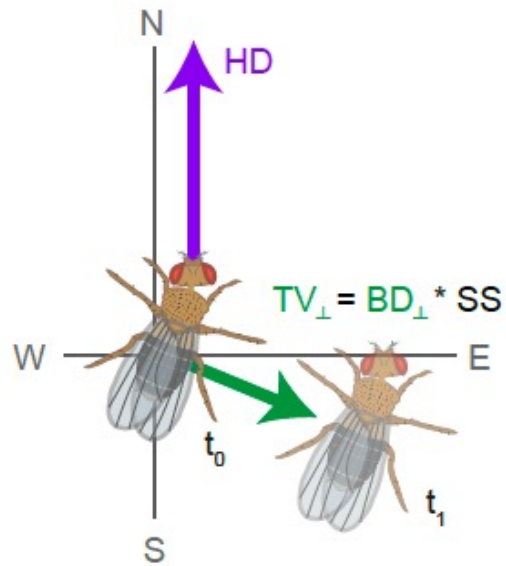


Differential NO input



A 4-vector basis set for arbitrary vector computation

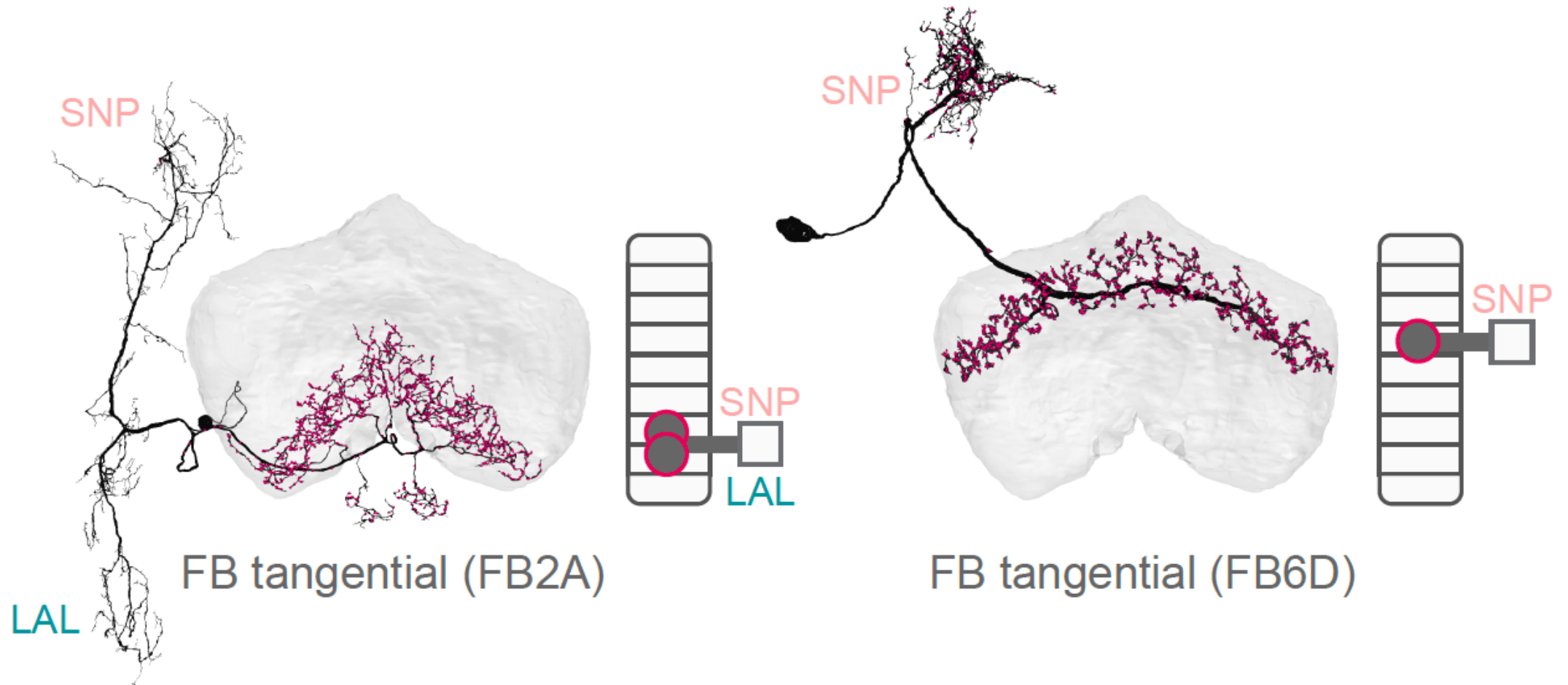
Sideslip right, head angle left



See also: Lyu et al. (2022); Lu et al. (2022)

B.K. Hulse*, H. Haberkern*, R. Franconville*, D.B. Turner-Evans* et al. (2021)

Setting context for goal-driven behavior with a variety of “tangential” neurons



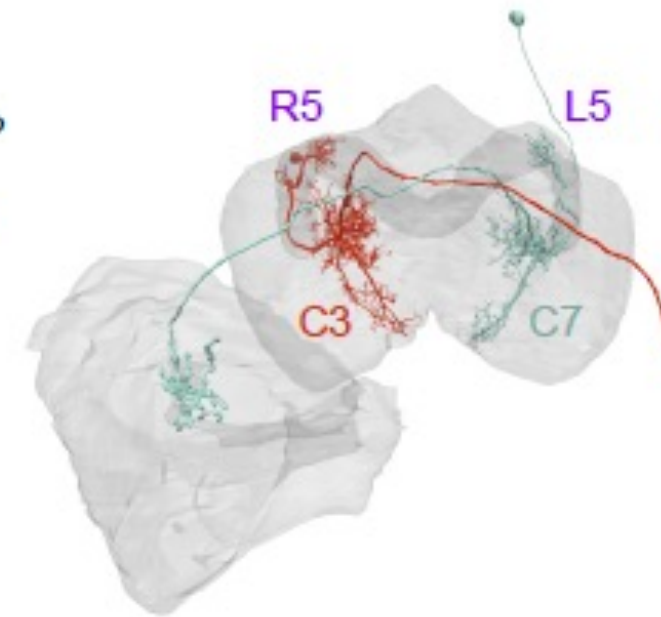
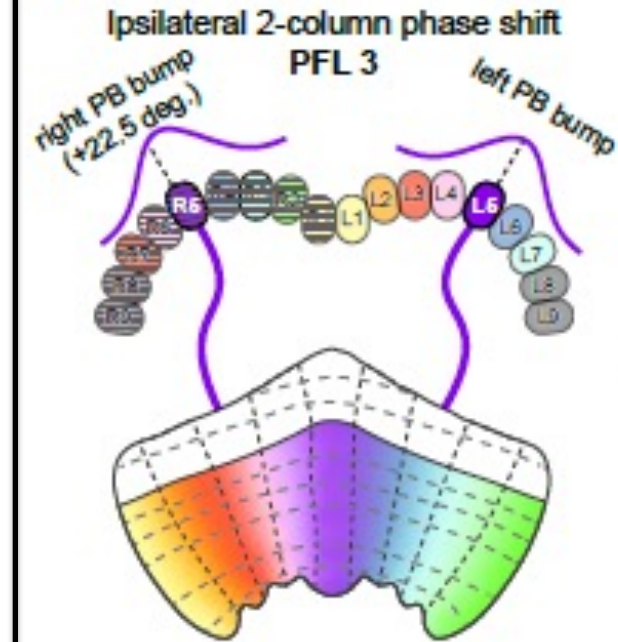
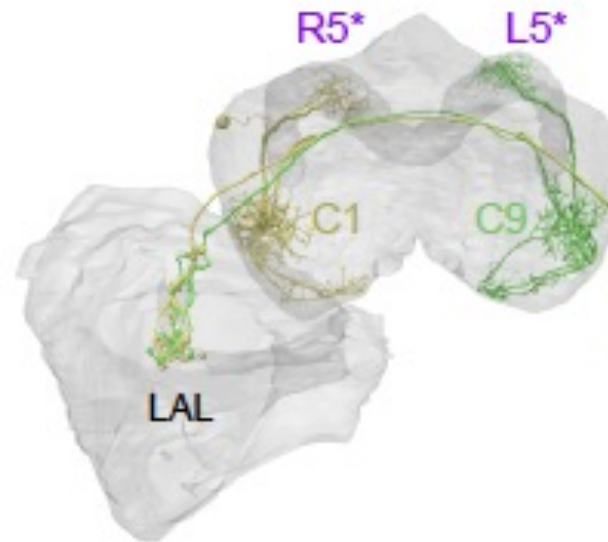
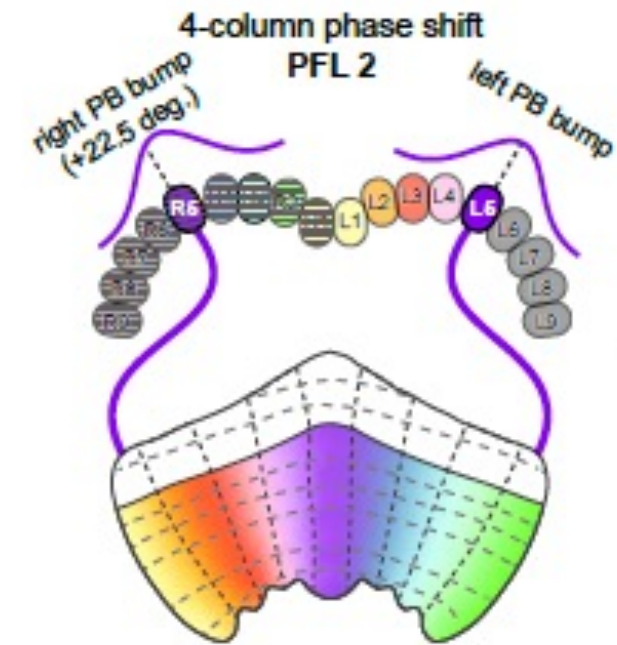
See also: Stone et al. (2017);
Sun et al. (2020); Goulard et al. (2021);
Pires et al. (2024); Matheson et al. (2021)

Dan, Hulse, Kappagantula, Jayaraman & Hermundstad, (2021, 2022)

Phase shifts enable rapid learning of goal-heading-driven behavior

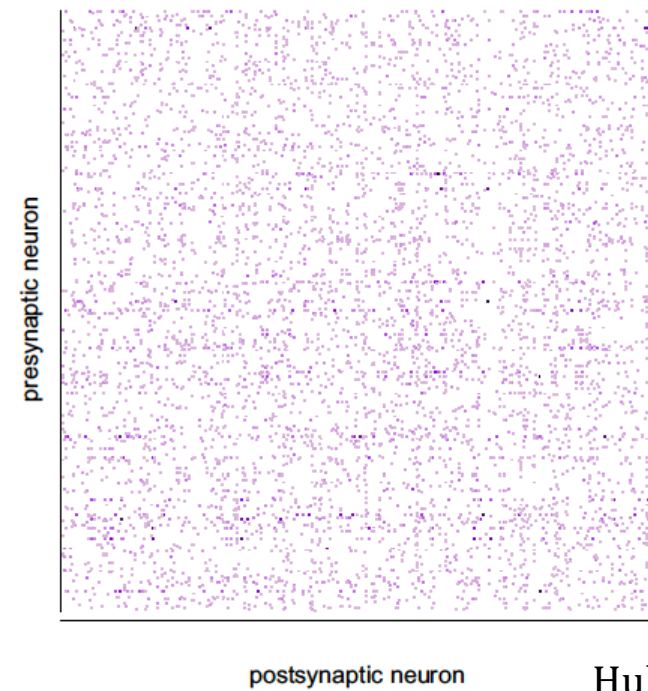
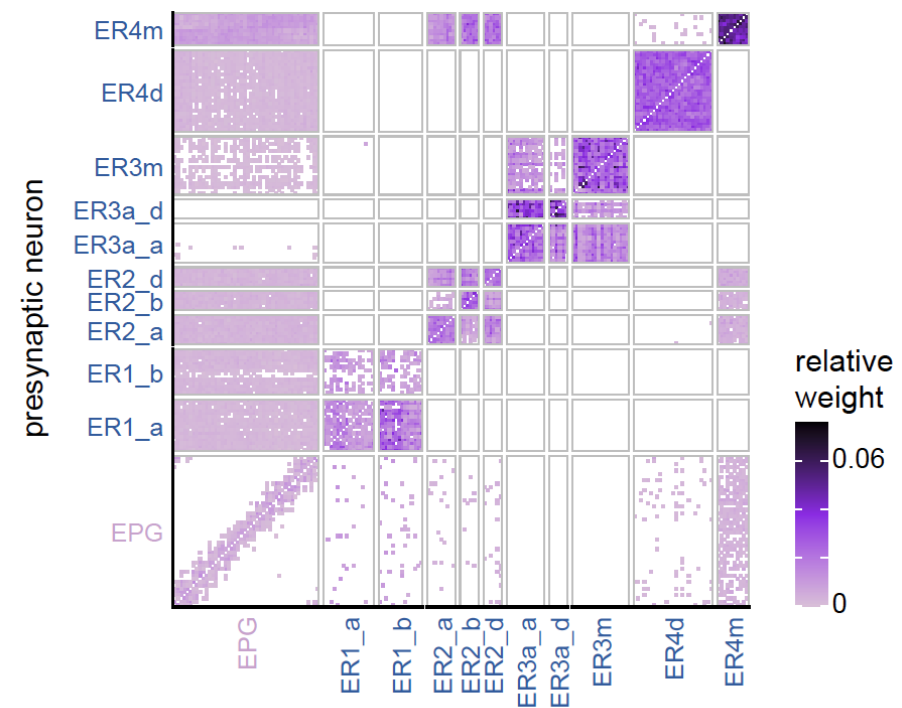
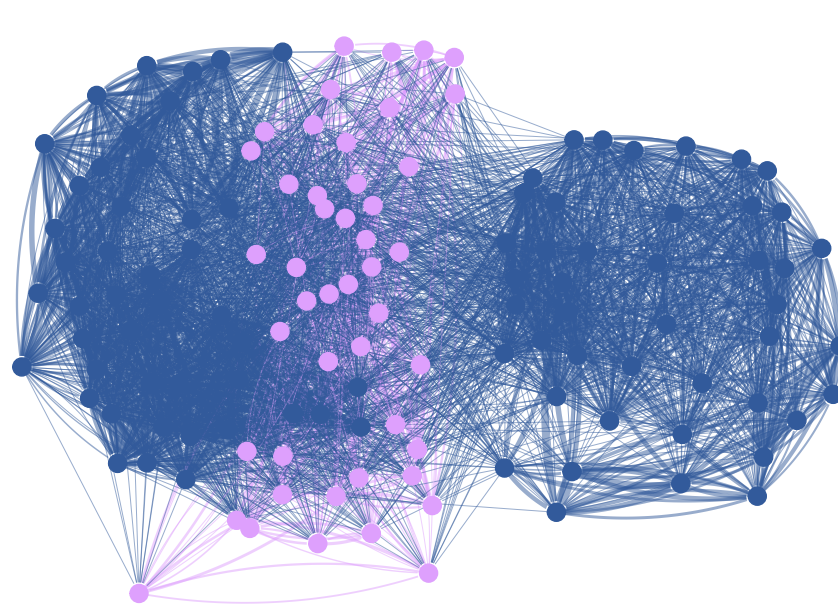
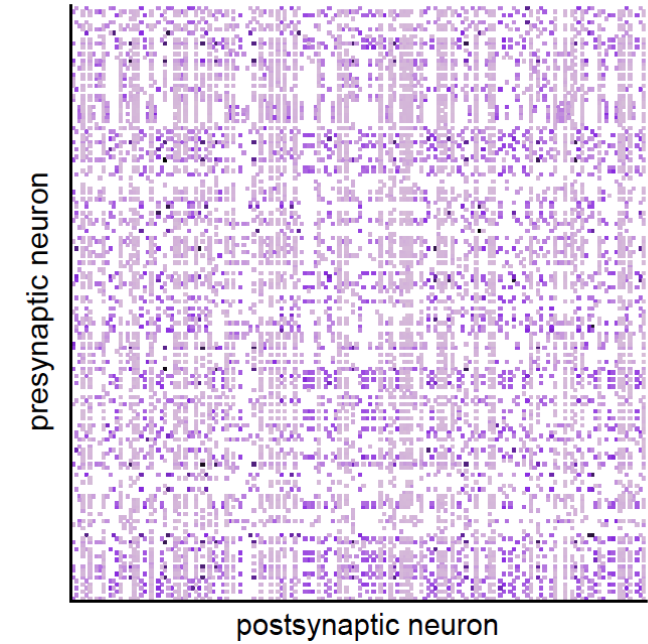
180° phase shift (forward movement)

90° phase shift (turn distribution)



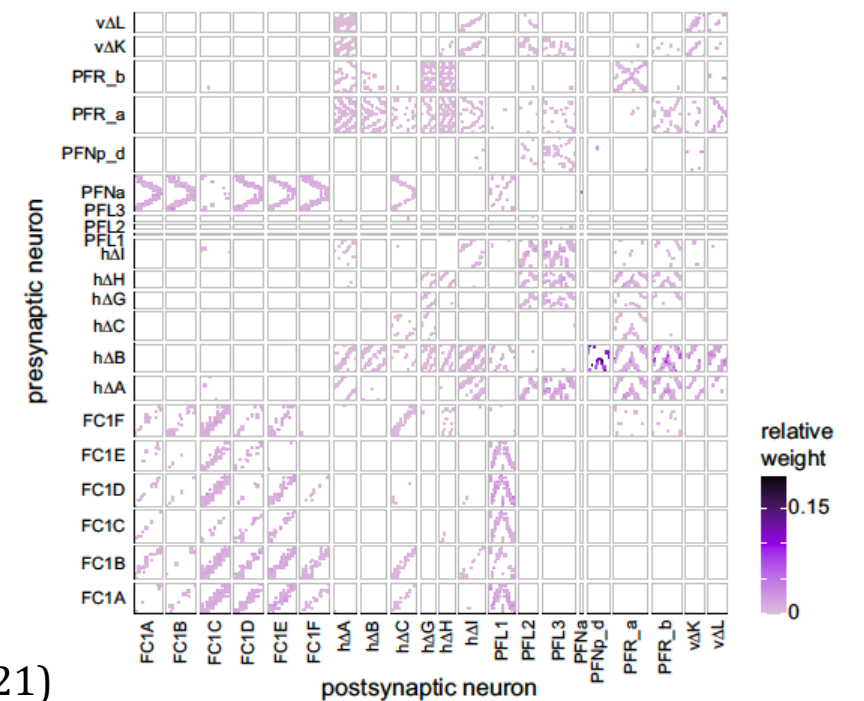
See also: Stone et al. (2017);
Sun et al. (2020); Goulard et al. (2021);
Pires et al. (2024); Westeinde et al. (2024)

Dan, Hulse, Kappagantula, Jayaraman & Hermundstad, (2021, 2022)
B.K. Hulse*, H. Haberkern*, R. Franconville*, D.B. Turner-Evans* et al. (2021)



Knowledge of cell type
/connectivity

“mixed selectivity”
“conjunctive coding” ?



Hulse*, Haberkern*, Franconville*, Turner-Evans* et al. (2021)

The lab



Brad Hulse
($\frac{1}{2}$ Hermundstad lab)



Chad Sauvola



Shivam Chitnis



Angel Stanoev
($\frac{1}{2}$ Romani lab)



Pavithraa Seenivasan
($\frac{1}{2}$ Reiser lab)



Chuntao Dan



Lab coordinator
Dianne Pereira



Kristin Henderson



Deepika Gupta
($\frac{1}{2}$ Shroff lab)



Britz et al. (2021)

Past members & collaborators

at this workshop

Johannes Seelig
(MPI GL, CAESAR)

Ann Hermundstad
Marcella Noorman*
Yipei Guo

**Janelia
Experimental
Technology**

**FlyEM
FlyCore**

Josh Dudman
Luke Coddington

Eugenia Chiappe
(Grp Ldr, Champalimaud)

Sandro Romani*
Larry Abbott*

**Scientific
Computing**

FlyLight

Chie Satou
Misha Ahrens
Hari Shroff
Kristin Branson

Stephanie Wegener
(DFG, Germany)

Gerry Rubin
+

**Quantitative
Genomics**

GENIE

+
lab

Sung Soo Kim*
(Asst. Prof., UCSB)

Tanya Wolff
Aljoscha Nern

**Project Pipeline
Support**

Aquatics

Dan Turner-Evans
(Asst. Prof., UCSC)

Michael Reiser
+
lab

Visiting scientists
Dennis Goldschmidt
Carlos Ribeiro

**Project
Technical
Resources**

MCN-NET
(Carmen Morrow)

Romain Franconville

Yoshi Aso
+
lab

Aisha Hamid
Syed Mubarak

Dreher Design
Studio

+
Many, many more!

Hannah Haberkern
(Group Leader, U. Würzburg)