

Lab meeting

*Robust representations for olfactory-spatial
association learning*

Andrea Pierré

March 11, 2025

Outline

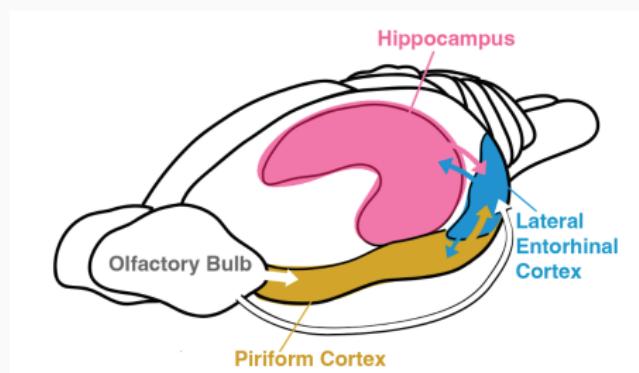
1. Project recap
2. Simulated experiment
3. What does the network learn?
4. Conclusion

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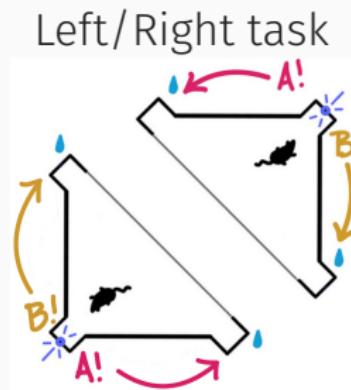
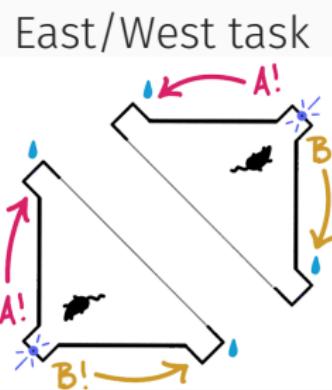
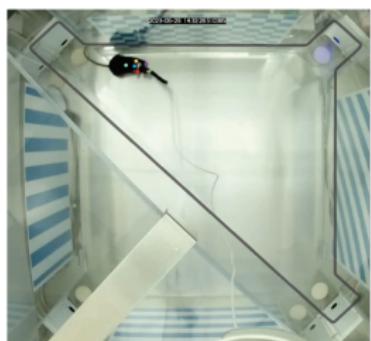
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The LEC is key to sensory associations and spatial memory

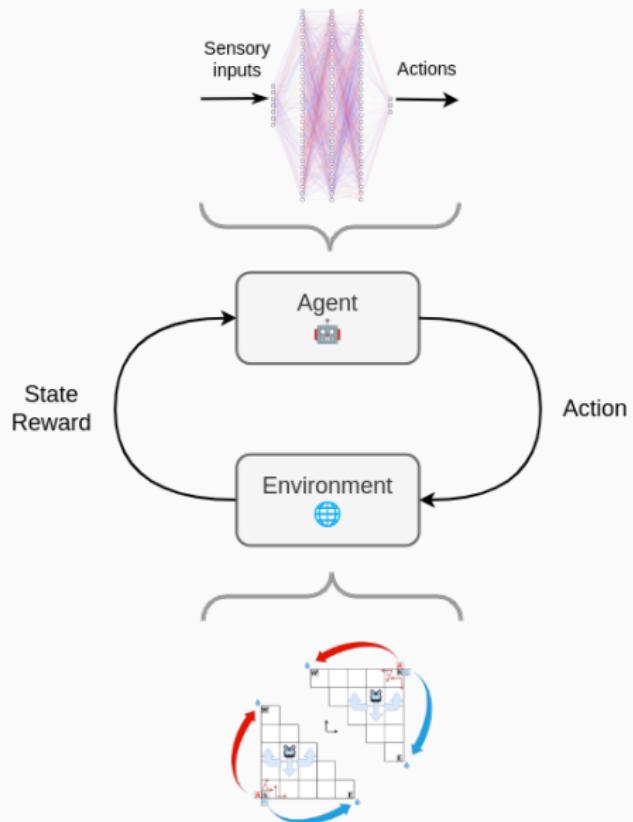
- **Piriform Cortex** encodes olfactory information
- **Hippocampus** encodes spatial information
- **Lateral Entorhinal Cortex (LEC)** encodes both olfactory & spatial information



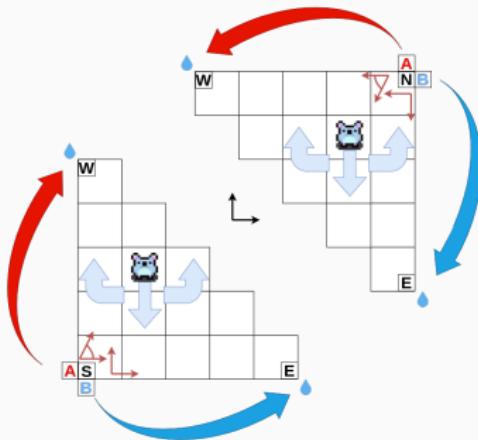
Half triangle task for olfactory-spatial association learning



Deep Reinforcement Learning model



Cartesian/polar duplicated coordinates experiment



- 3 actions: $\leftarrow \uparrow \rightarrow$
- Duplicated coordinates inputs:
 - Cartesian coordinates from north & south port
 - Polar coordinates from north & south port

Questions & Hypothesis

Questions

- What **function** does the network learn?
- How the constraints of the task affect learning & the representations learned?
- How do the representations learned compare between the *in vivo* and the *in silico* neurons?

Hypothesis

- The network will use the most efficient coordinate information based on the task
- The structure of the network's weights will reflect this prioritization of information

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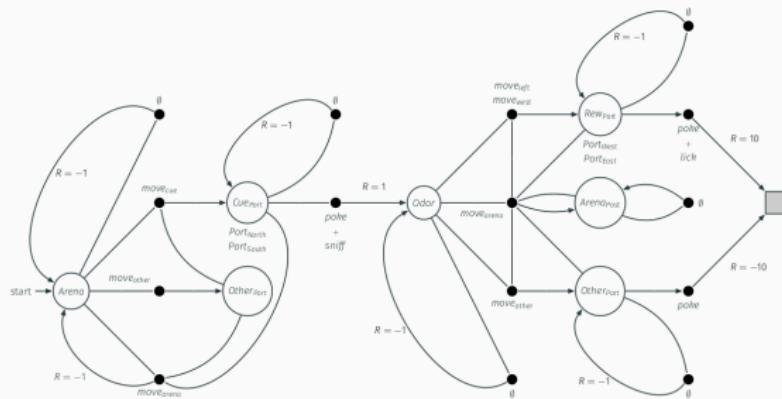
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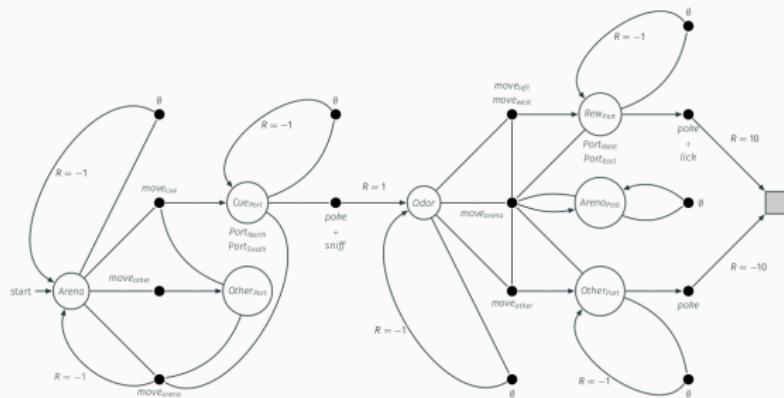
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Looking back...



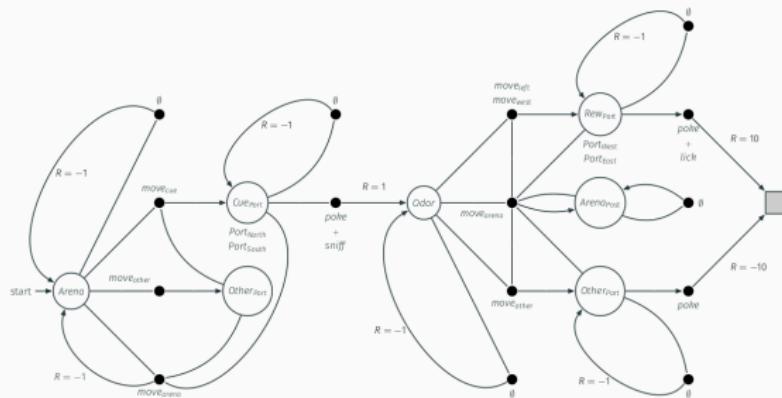
1. First step trying to define Olivia's experiment as a Markov Decision Process (MDP) in Julia
2. 2D tiles with tabular RL & function approximation in Python/NumPy
3. 2D coordinate system in Python/PyTorch
4. Duplicated coordinates experiment in Python/PyTorch

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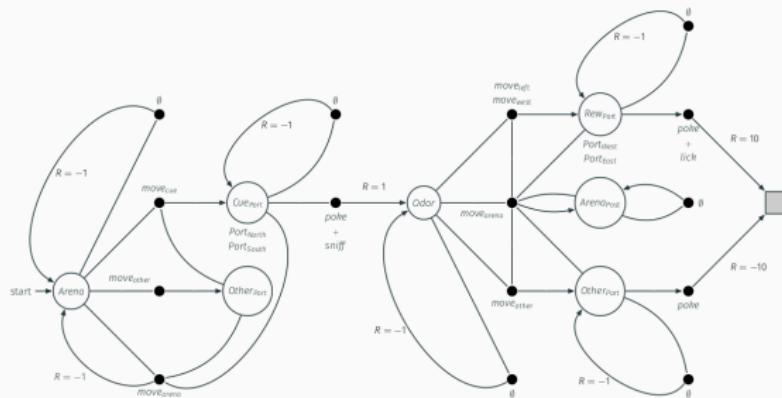
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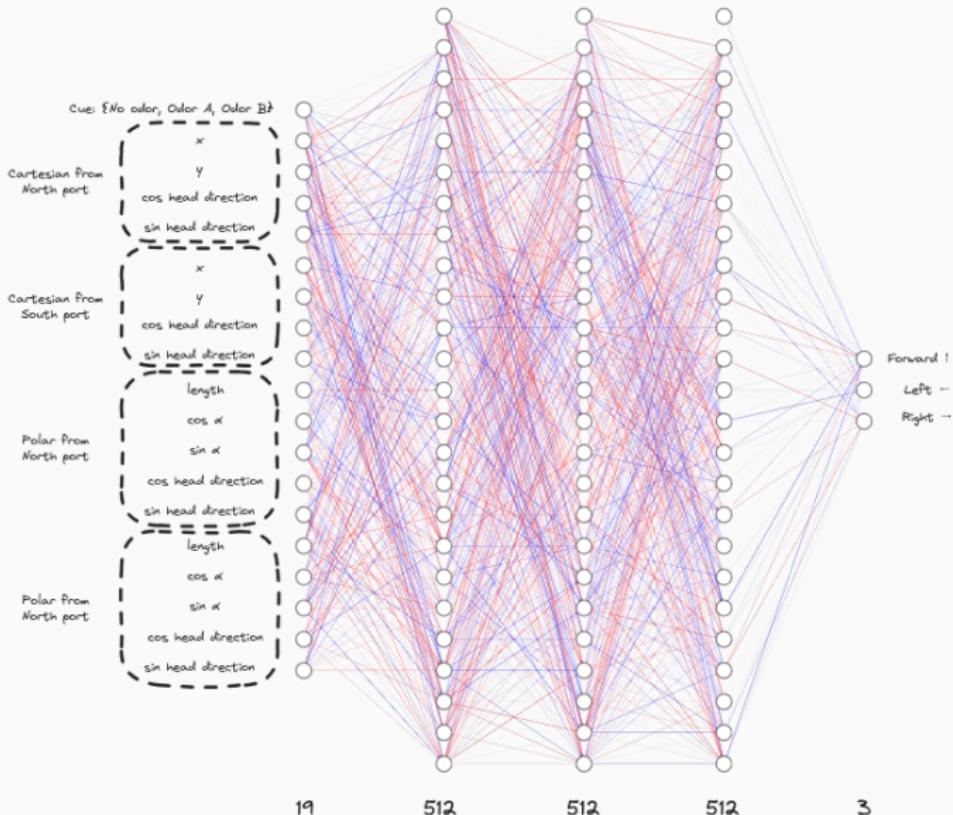


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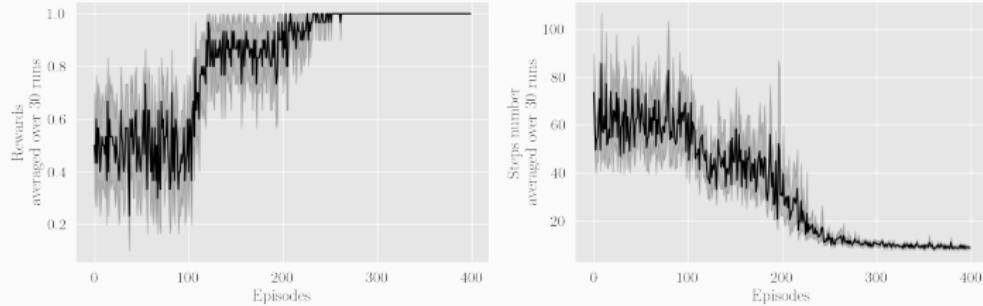
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State space & network architecture

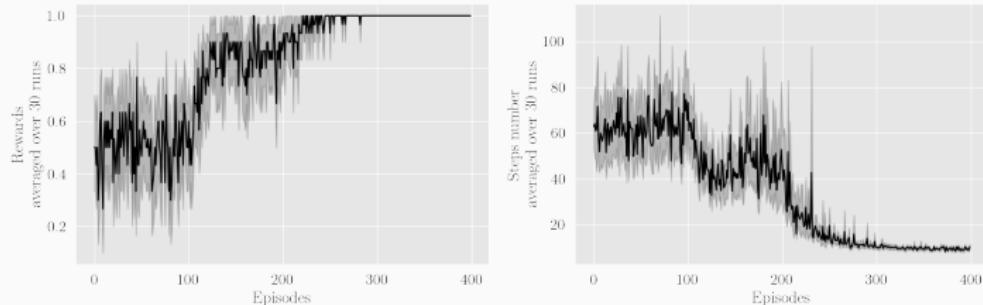


Training

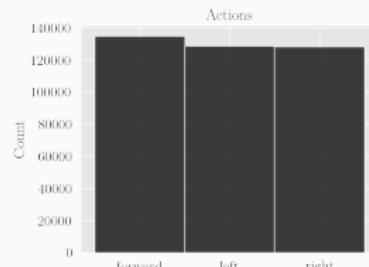
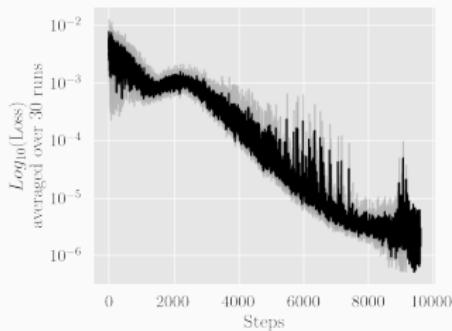
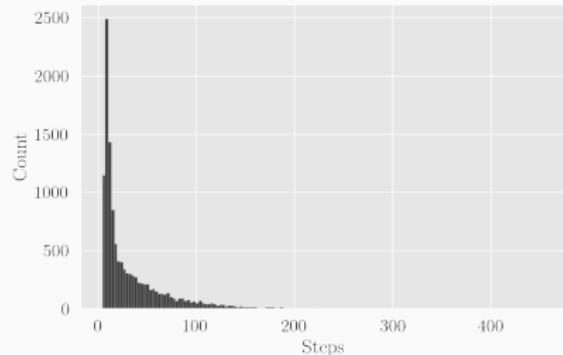
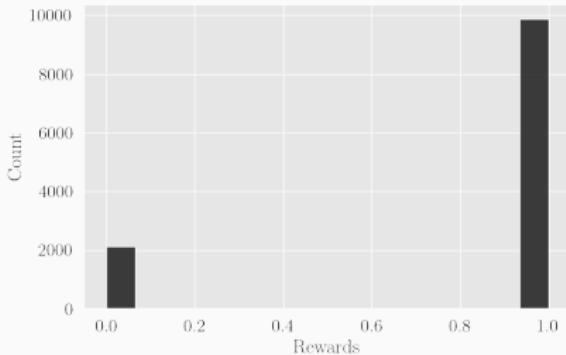
East/West



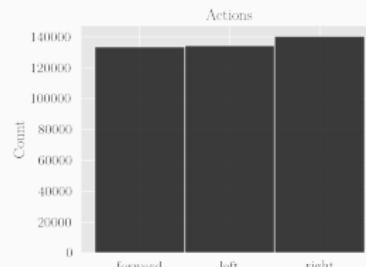
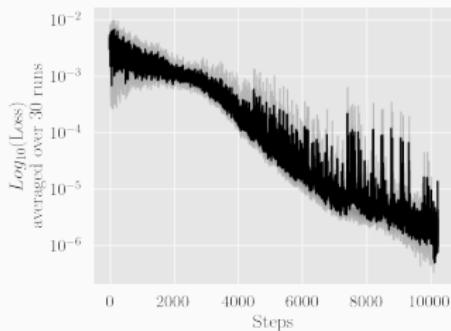
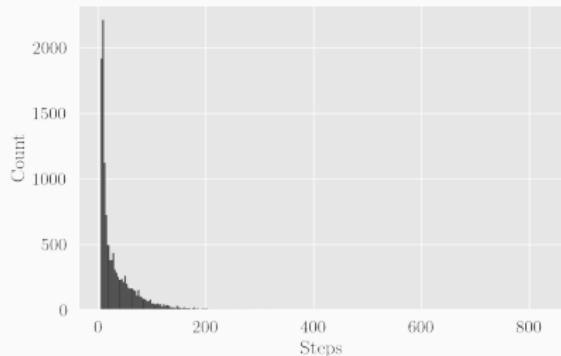
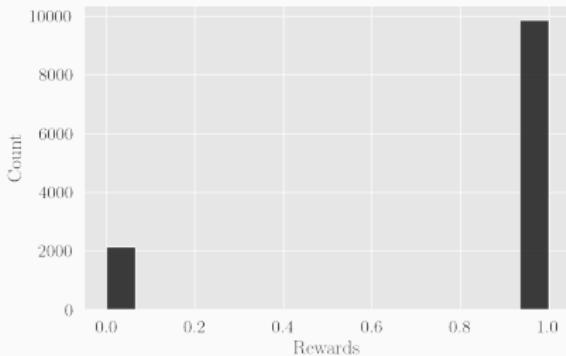
Left/Right



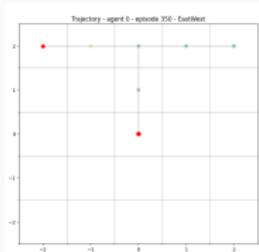
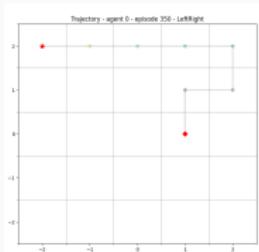
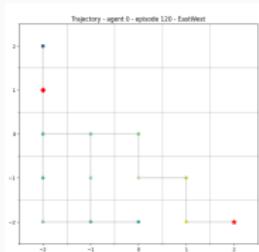
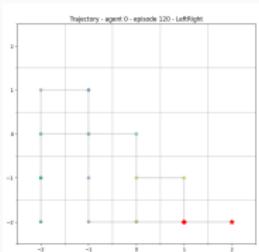
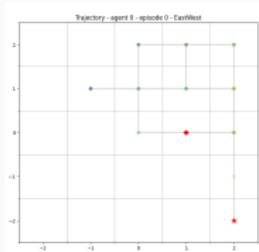
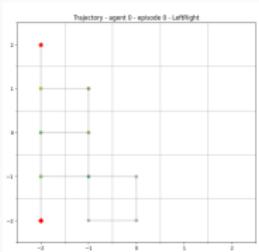
Training checks – East/West



Training checks – Left/Right



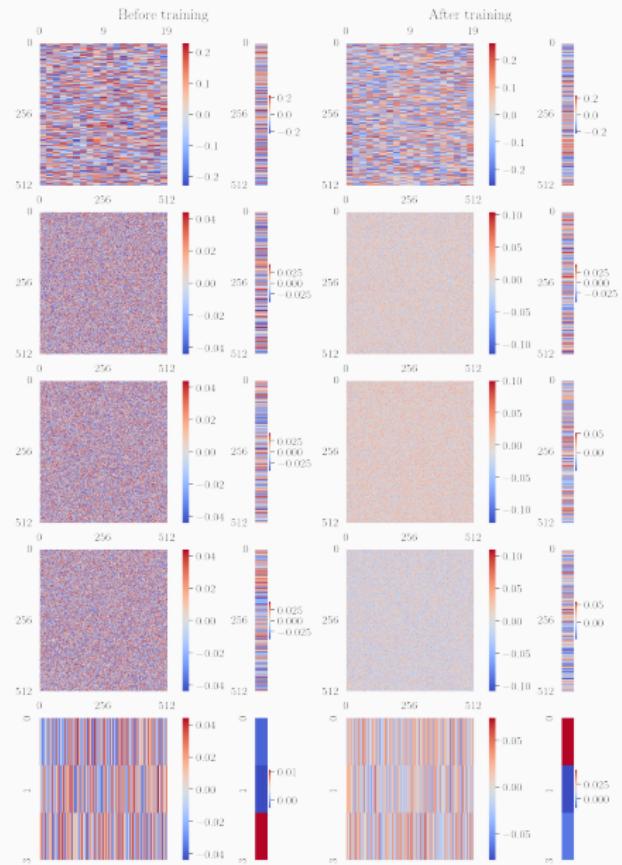
Agent behavior



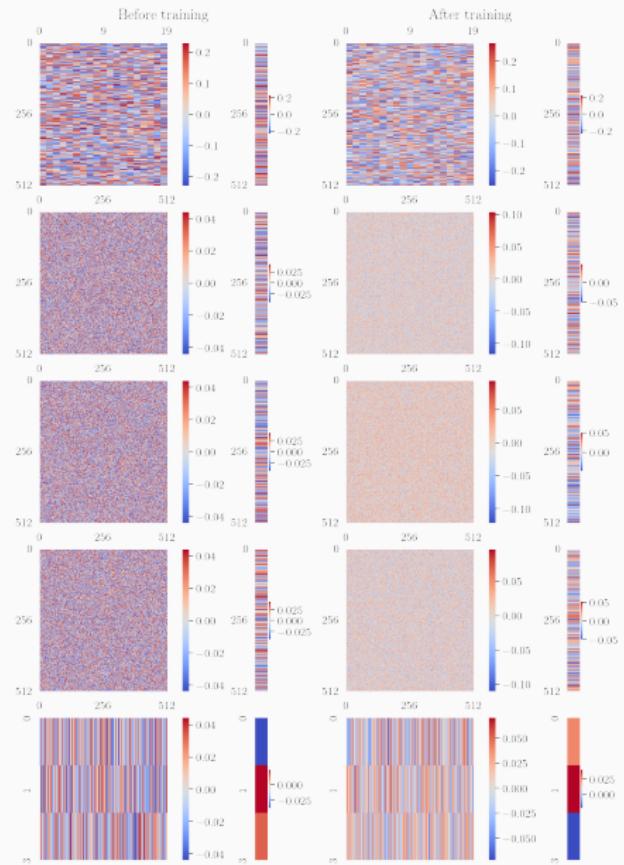
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Weights structure – East/West

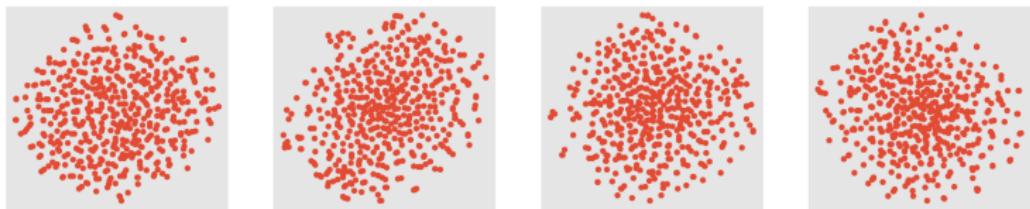


Weights structure – Left/Right

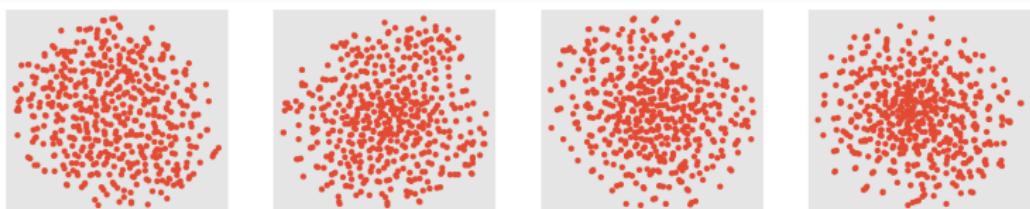


Weights clustering

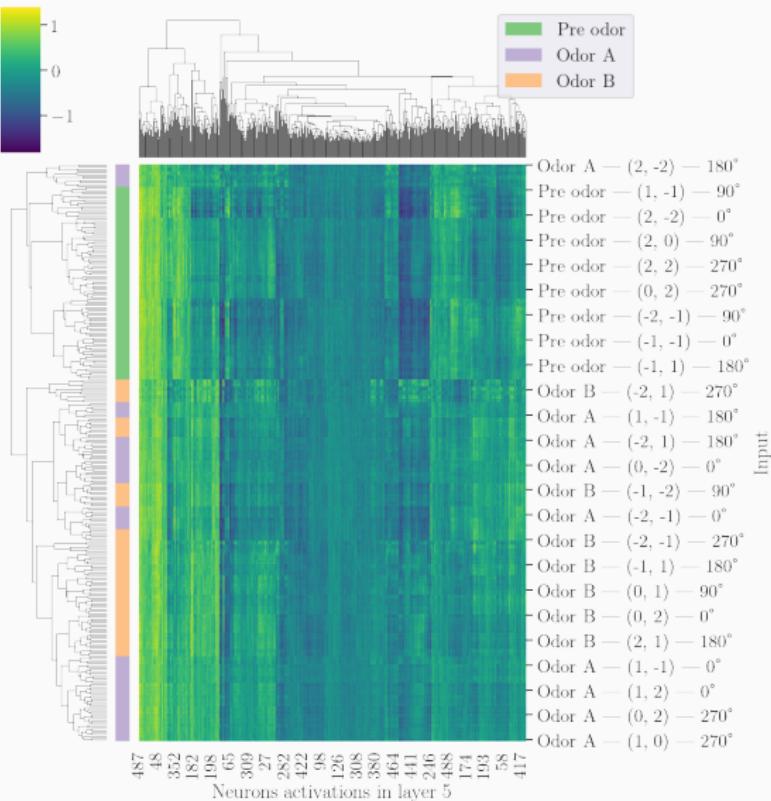
East/West



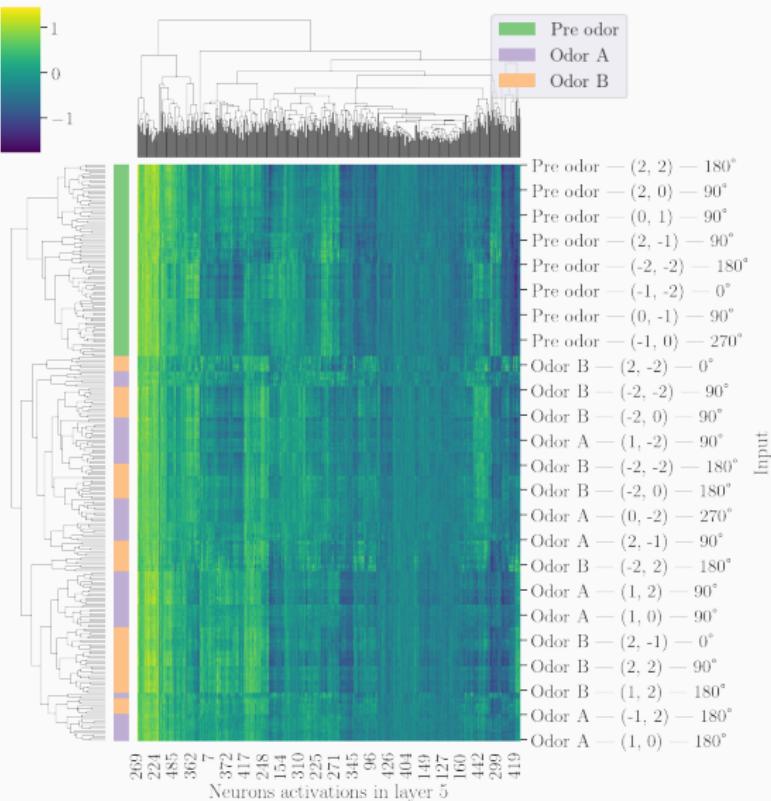
Left/Right



Activations learned – East/West



Activations learned – Left/Right



Use the behavior as proxy – Perturbation experiment

- Perturb the Cartesian/polar part of the input on a trained agent and look at how the agent behaves
- Expectation:
 - Left/right tasks
 - East/west tasks

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 - Left/right task:
 - With the Cartesian inputs perturbed → agent's performance unchanged
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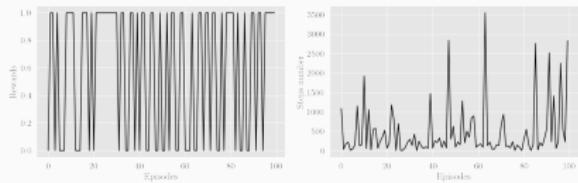
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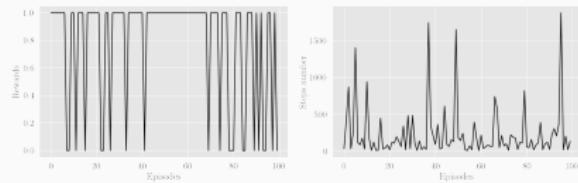
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Cartesian inputs unchanged – polar input perturbed

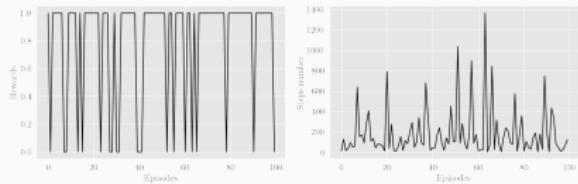
East/West
Silencing inputs



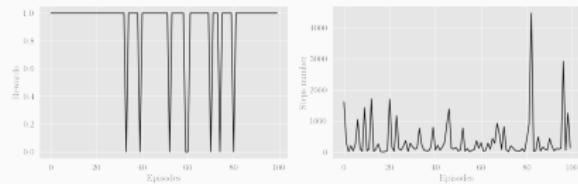
Left/Right
Silencing inputs



Randomizing inputs



Randomizing inputs



Polar inputs unchanged – Cartesian input perturbed

- Simulation does not end
→ couldn't figure out why yet...

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Partial conclusions

- \emptyset pattern on the weights
- The pre-odor activations cluster together, but no other clear pattern seems to emerge
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 - Fix issue on Cartesian inputs
 - Setup more metrics for the study: performance histogram, % correct, etc.
- Need for some causal inference framework?
- Use of techniques from explainable AI?
- Study of the derivative of the output w.r.t. the inputs?
- Timeline: wrap the project by end of August

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Questions ?