

# AN OLFACTORY NEURAL CIRCUIT IN LOIHI

Neuromorphic Computing Lab | Intel Labs

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#### Olfaction

Learning

Inference





\* Nabil Imam, Thomas Cleland, Rapid Learning and Robust Recall in a Neuromorphic Olfactory Circuit, In Review

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### Loihi EPL Input and Output

- Model Input
  - Chemosensor data
    - 72 dimensional vector, each element an integer from 0 to 15
    - Converted to bias current into mitral cell (MC) apical dendrite
- Model Output
  - MC soma spikes

#### Loihi EPL Behavior

#### • Multi-Odor Results



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### Loihi EPL Model



#### **EPL** Intuition

E-STDP: learns receptive field selective to odor features



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### **EPL** Intuition

- Learns a pattern
- Spatio-temporal attractor network
  - Tends towards learned pattern



#### **EPL** Intuition

• In practice, attractor takes affect over a larger scale



**E neurons** spike in first half of gamma l neurons spike in second half of gamma

Recall of representation of **Odor A** 

### Loihi EPL Module

- Single-Pattern (Odor) Learning
  - Learn on a clean pattern
  - Generate noise corrupted test patterns
    - Occlusion factor is fraction of corrupted values in vector (length 72)
    - Corrupted values are randomly chosen from 0 to 15
  - Pattern is considered recovered if there is high "similarity"
    - Jaccard index as similarity: num spikes in intersection / num spikes in union

#### **Tutorial: EPL Single Pattern Learning**



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### **Outperforms Conventional Algorithms**

#### Provides average of **8% accuracy improvement** vs deep autoencoder

**40x more data efficient** learning vs backpropagation

Supports **online learning** (robust to catastrophic forgetting)



#### **Classification Accuracy**

#### **Excellent Scaling to Larger Network Sizes**



