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So far...

- **Units:** ions, conductance, membrane potential, firing.
- **Networks:** transformations, amplifications, attractors, basic building blocks of cognition.

How do networks ever come to do interesting things?

- **Learning**

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Learning

- Describe an “ideal” learning system. (If you could design one, what features would it have?)
- Describe the human learning system. (How do our models need to learn to capture how we learn?)

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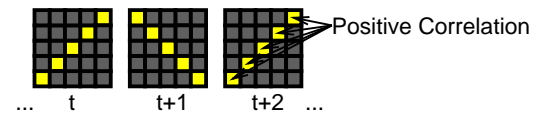
Learning

- Tuning detectors locally to achieve global results.
- Two main types:
 - Learning internal **model** of environment (Ch 4)
 - Learning to solve a **task** (produce output from input) (Ch 5)
 - Doing both at the same time (Ch 6)

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Model learning

Pick up on correlations in the world.



(whether for pixels in visual images, emotions and people, behaviors, etc.)

Simulation.

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Biology: Associative/Hebbian LTP/D

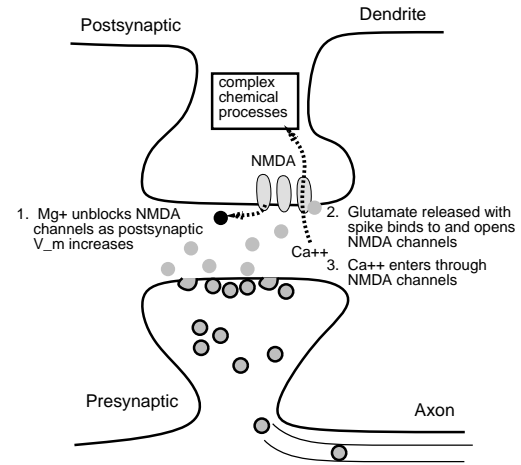
Biology suggests associative or Hebbian learning: LTP and LTD. ("Units that fire together wire together!")

Synaptic efficacy (weights) change when neurons are excited:

- Going up: Long Term Potentiation (LTP)
- Going down: Long Term Depression (LTD).

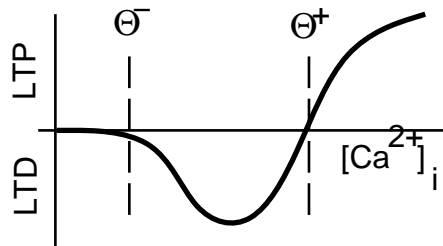
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NMDA = Associativity: Both Pre & Post Active



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Biology: NMDA-mediated LTP/D



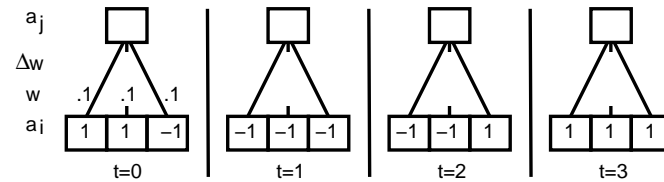
Strong activity (Ca^{++}) = LTP, weak = LTD

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Hebbian Learning Picks up on Correlations

Simple Hebb rule: $\Delta w_{ij} = \epsilon a_i a_j$

Linear Activation: $a_j = \sum_i a_i w_{ij}$



Weights get stronger for the two units that are correlated, don't get stronger for uncorrelated unit!

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Problems

Simple Hebb rule: $\Delta w_{ij} = \epsilon a_i a_j$

Weights will grow infinitely large.

Normalize by subtracting off weight.

$$\Delta w_{ij} = \epsilon a_j (a_i - w_{ij}) \quad (1)$$

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Biological Correspondence

$$\Delta w_{ij} = \epsilon a_j (a_i - w_{ij})$$

When both a_j and a_i large: Lots of $Ca^{++} \rightarrow$ LTP

When a_j large but a_i small: Some $Ca^{++} \rightarrow$ LTD

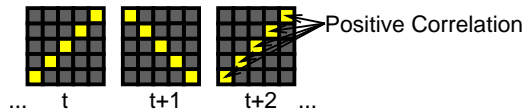
When a_j small: Mg^+ blocking NMDA channels \rightarrow nothing.

Simulations.

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Model learning

Pick up on correlations in the world.



(whether for pixels in visual images, emotions and people, behaviors, etc.)

Based on Hebbian (LTP/LTD) mechanisms.