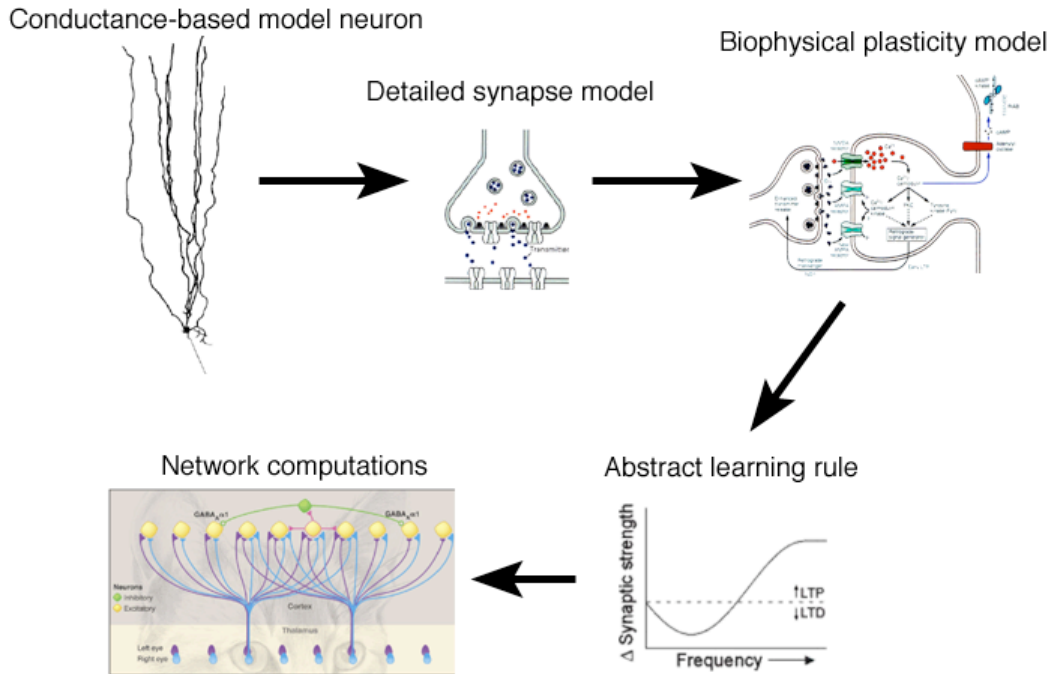


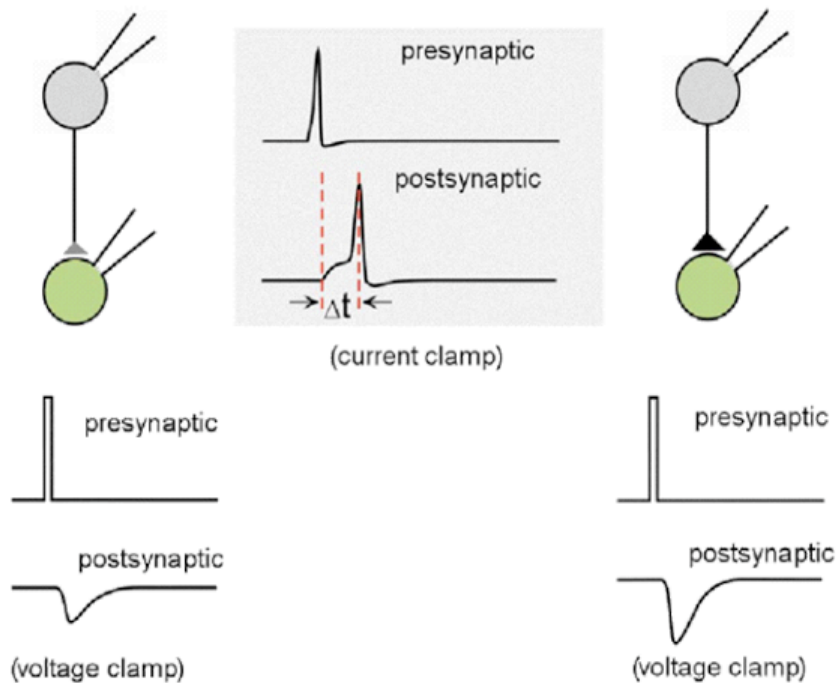
## Simplified models of synaptic plasticity



Course website: <http://www.bme.ogi.edu/BME665/>

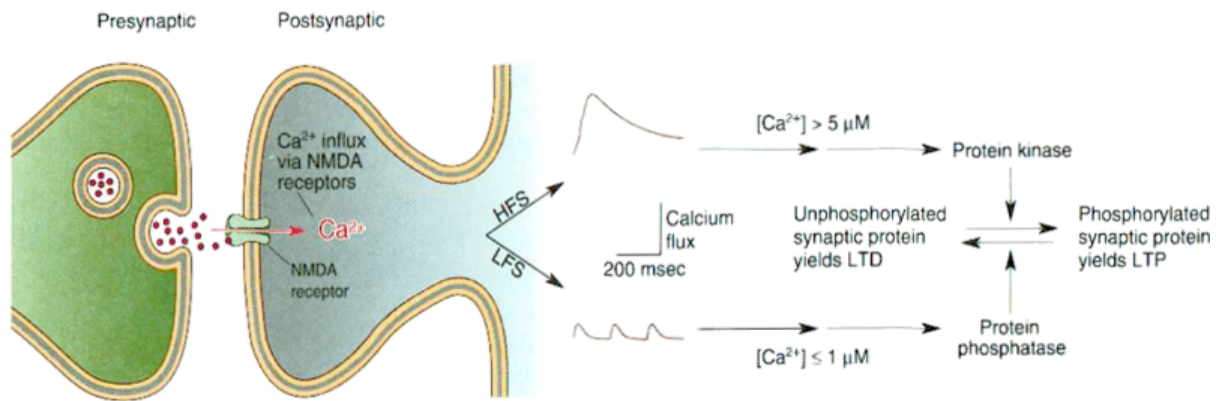
00\_title.psd

## Spike-Timing Dependent Plasticity (STDP)



00a\_stdp\_induct.psd

### Calcium Concentration Determines Direction of Synaptic Plasticity

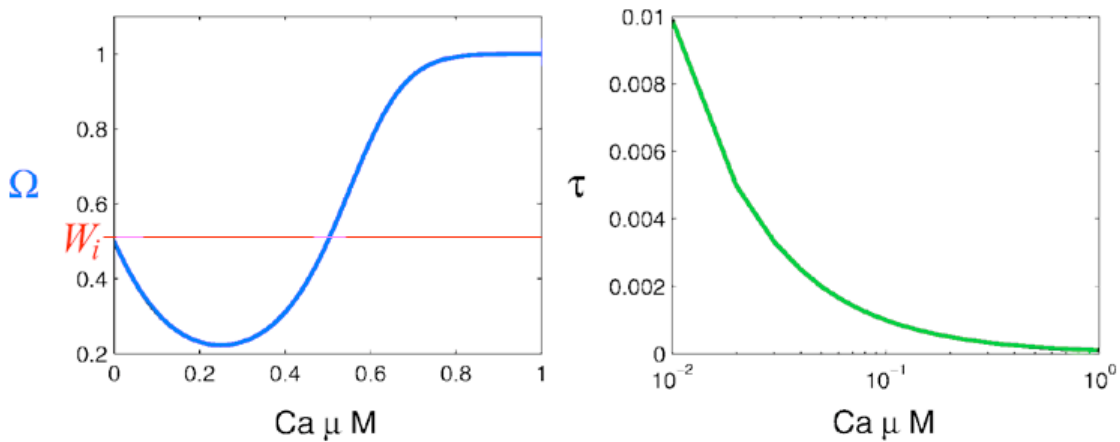


High  $Ca^{2+}$   $\Rightarrow$  LTP  
 Low  $Ca^{2+}$   $\Rightarrow$  LTD

01\_caDepPlast.psd

### Simplified Model of Calcium-Dependent Plasticity

$$\dot{W}_i(t) = \frac{1}{\tau([Ca]_i)} (\Omega([Ca]_i) - W_i)$$



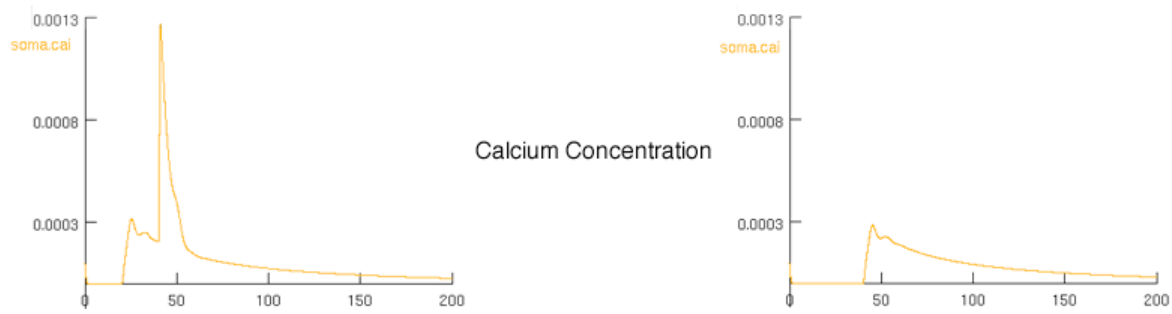
Lisman (1989), Shouval (2002)

02\_CaPlastEq.psd

## Spike Order Controls Calcium Concentration

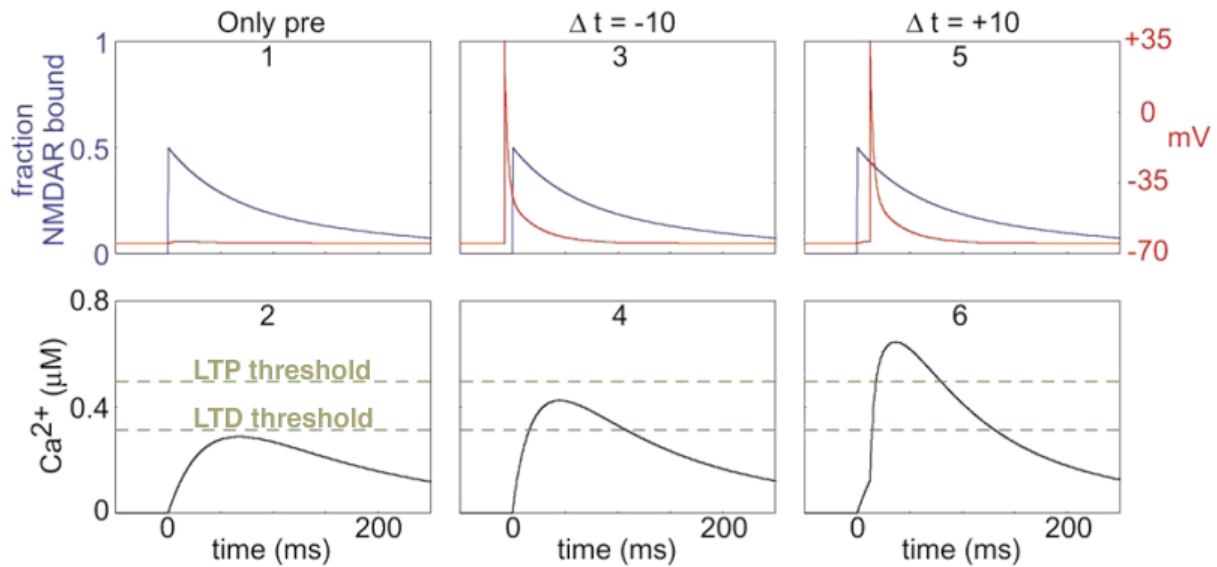


$$\frac{d[Ca(t)]}{dt} = I_{NMDA}(t) - (1/\tau_{Ca})[Ca(t)]$$



03\_order.psd

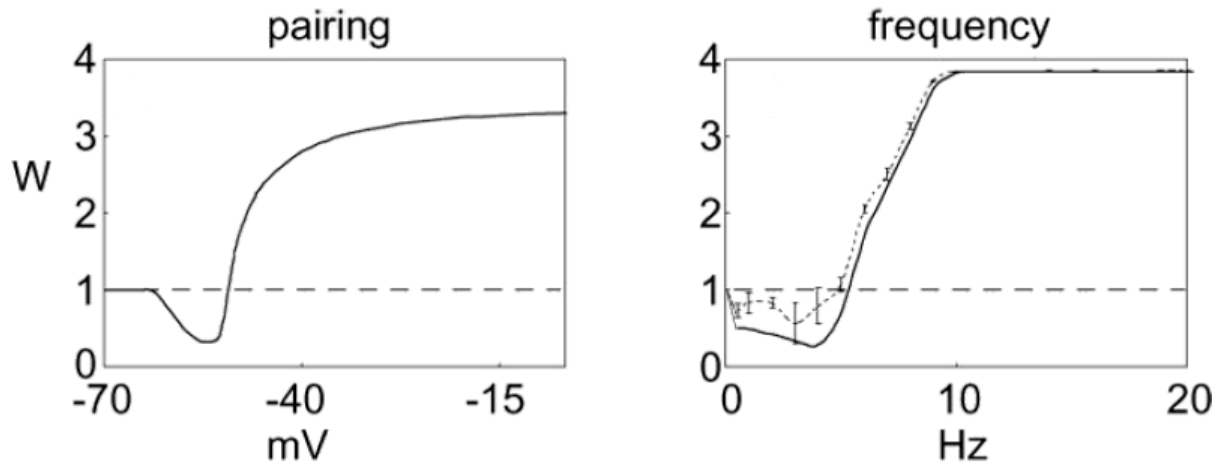
## Calcium Threshold for Synaptic Plasticity Can Predict Effects of Spike-Pairing



Shouval (2002)

04\_Ca\_LTP.psd

### Calcium Model Prediction of Frequency Dependency

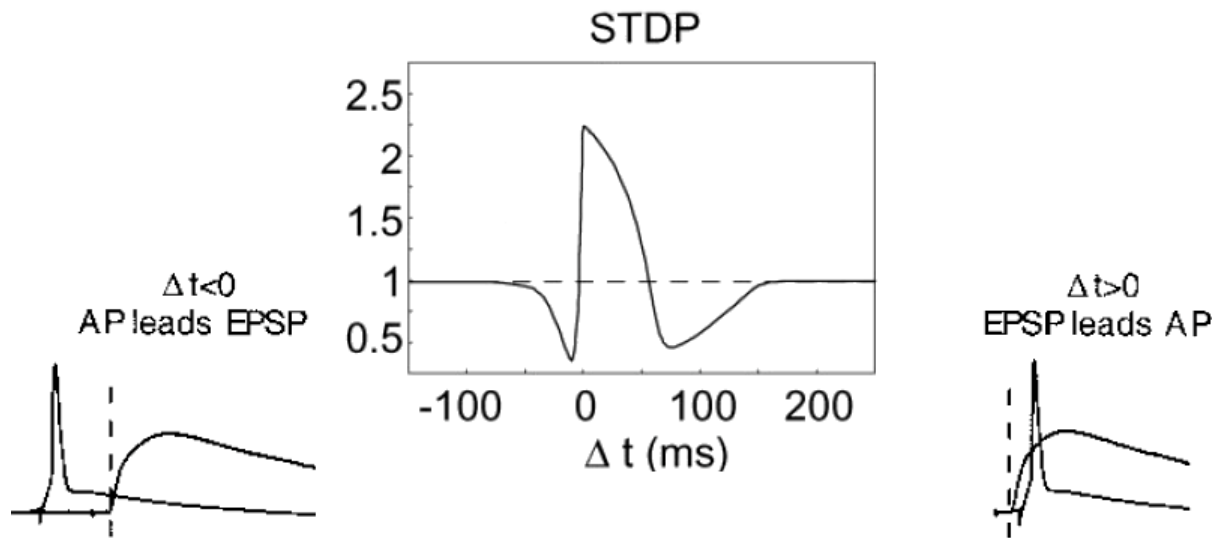


Consistent with the BCM model

Shouval (2002)

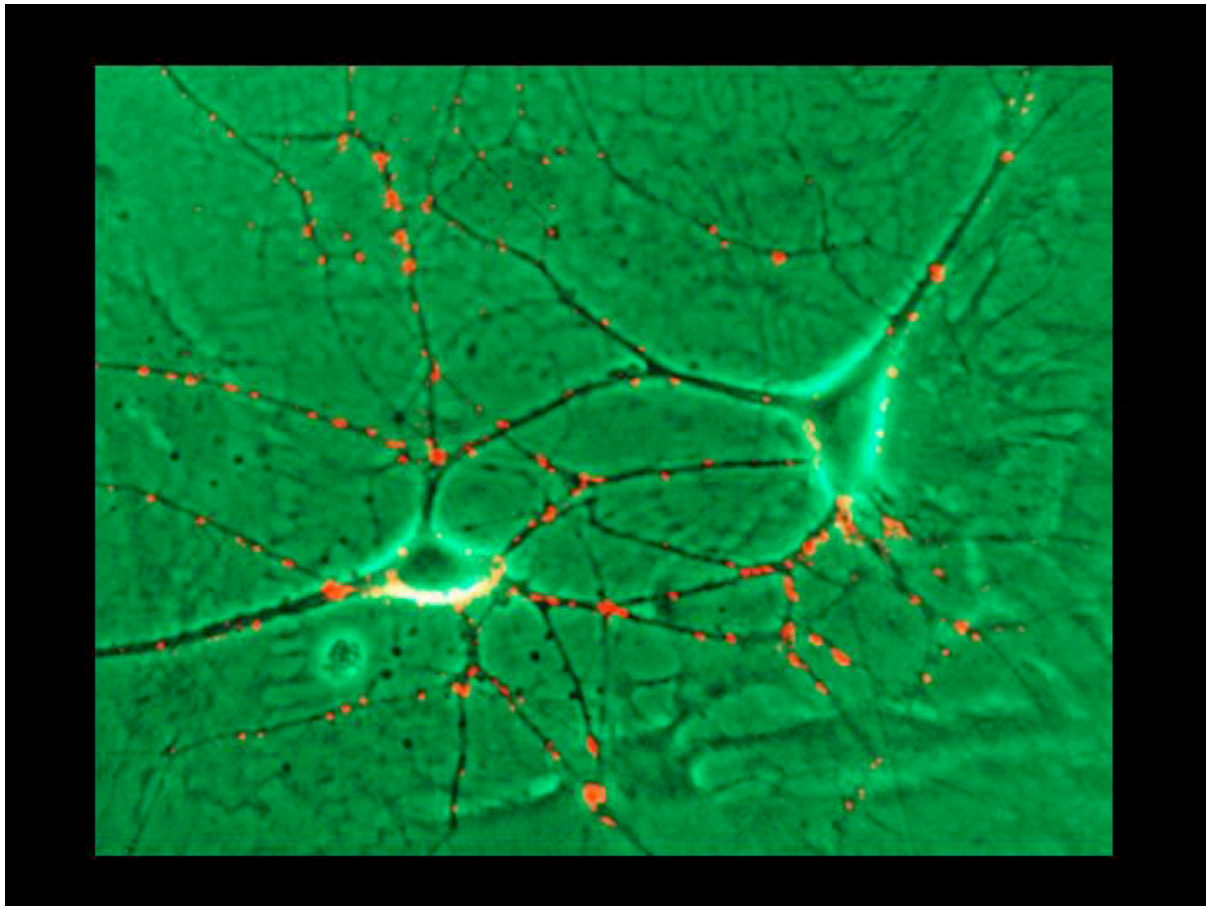
05\_freqDep.psd

### Calcium Model Prediction of Spike-Timing Dependent Plasticity

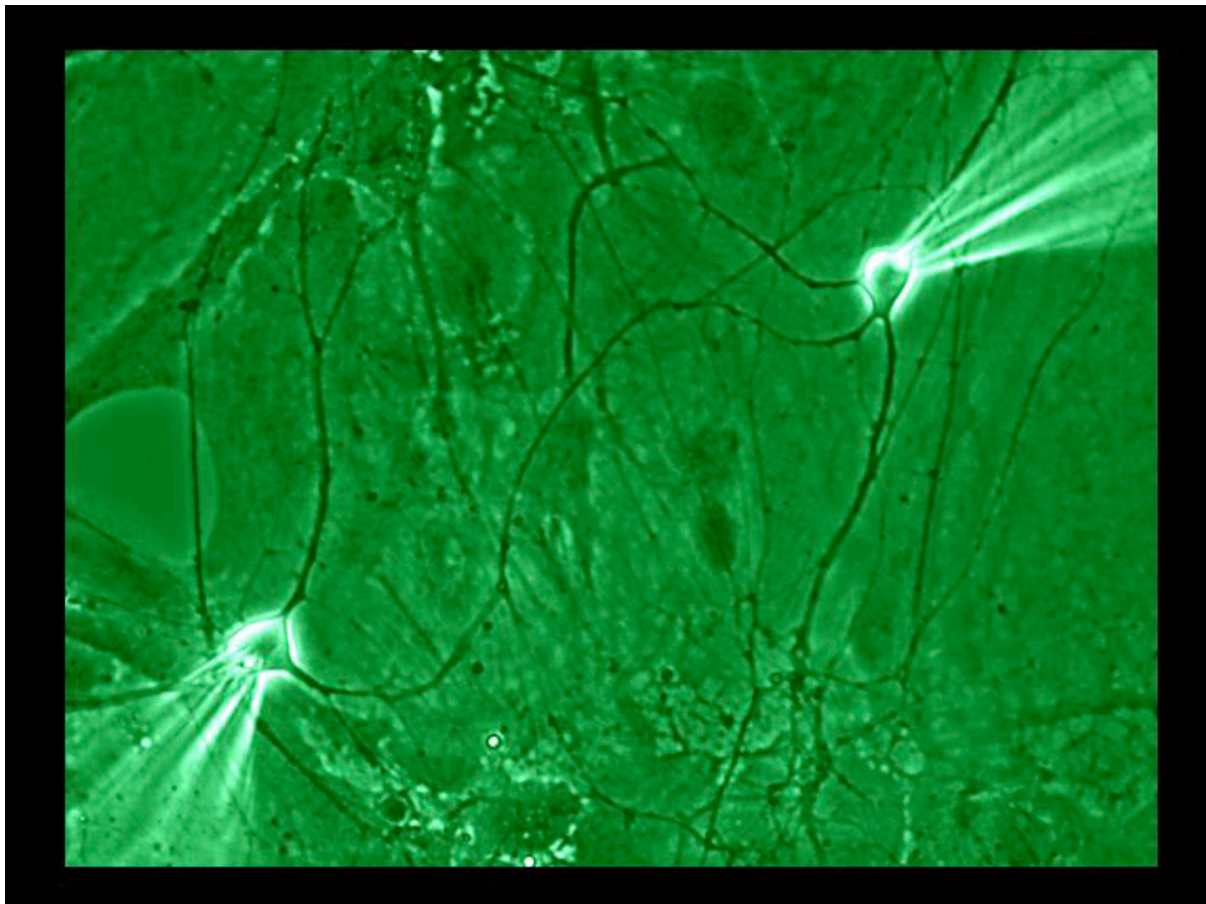


Shouval (2002)

06\_Ca\_stdp.psd

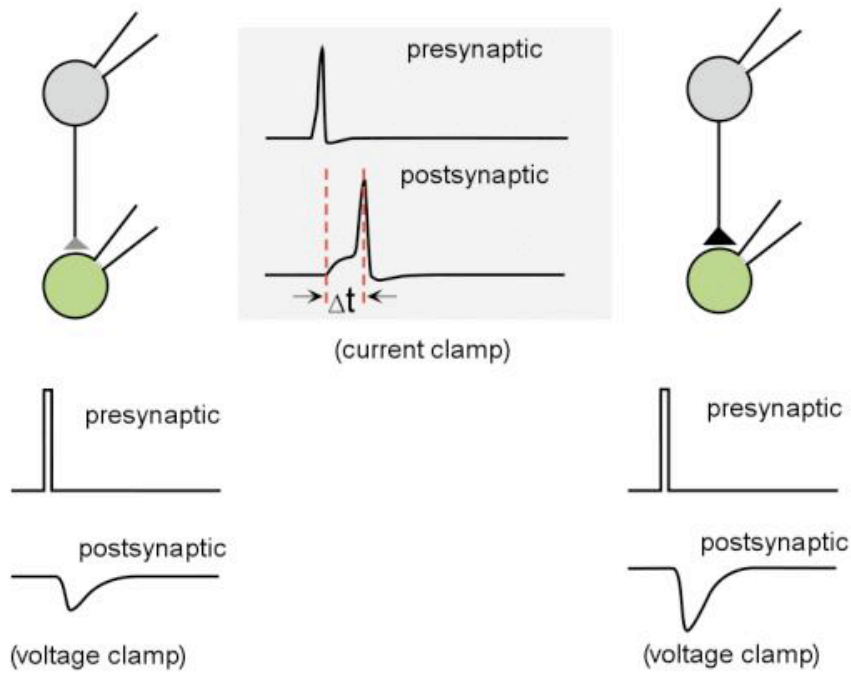


07a.jpg

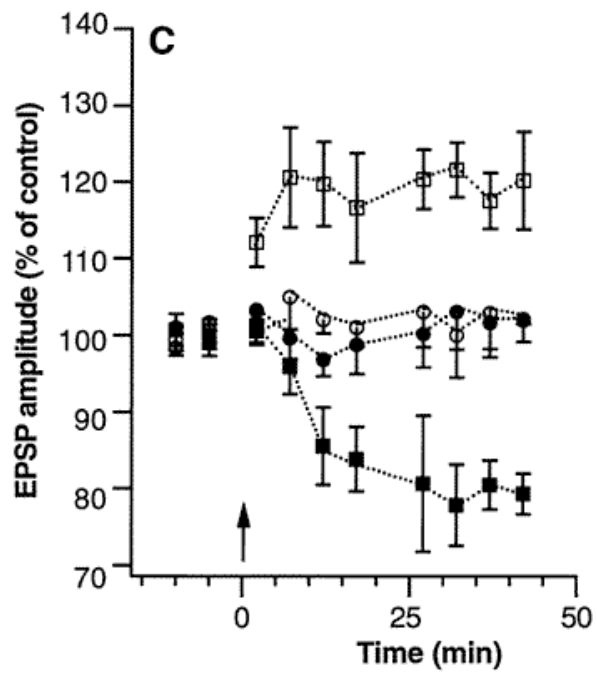
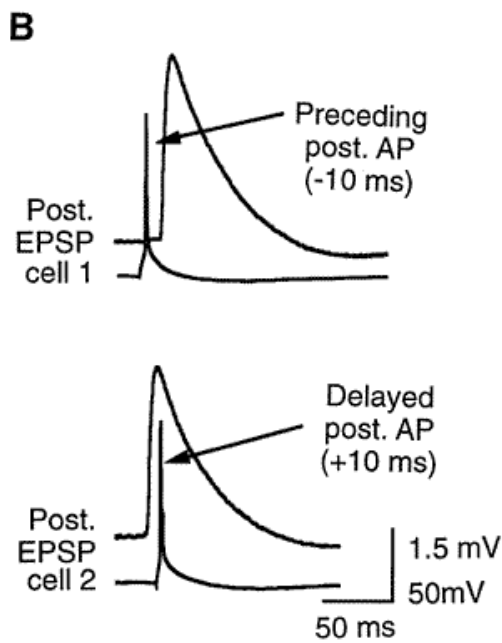


07b.jpg

## Experimental paradigm -- correlated pre- and postsynaptic spiking



08.jpg

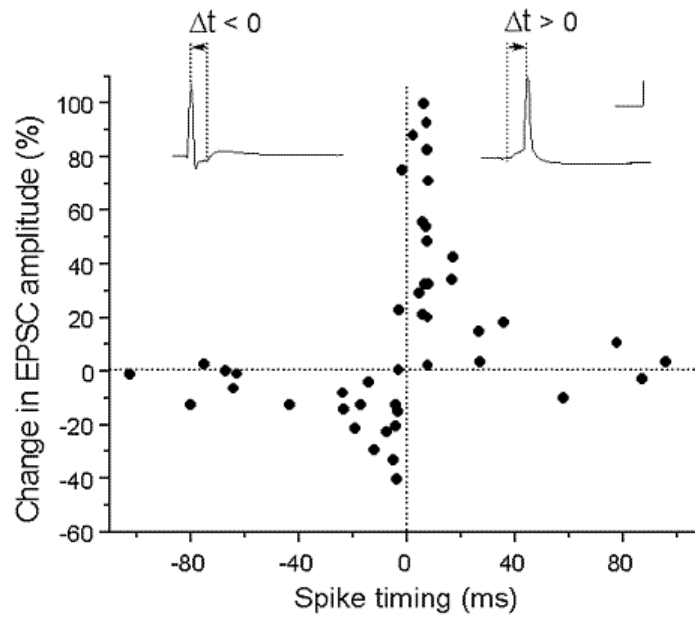


Markram et al. 1997

09.gif



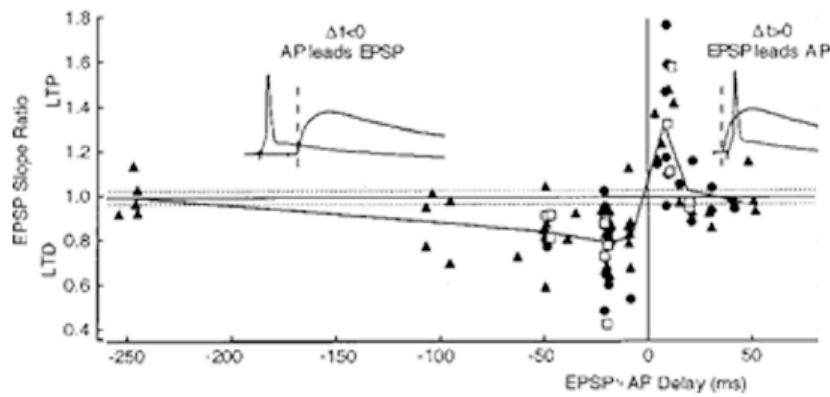
### Anti-Symmetric STDP Learning Rule



Bi (1998)

10\_BiRule.psd

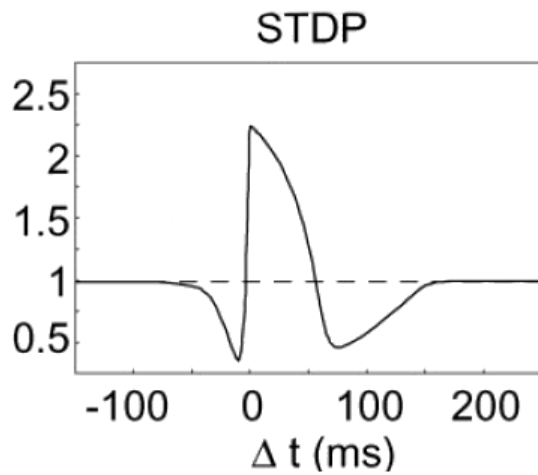
### Long Interval of LTD



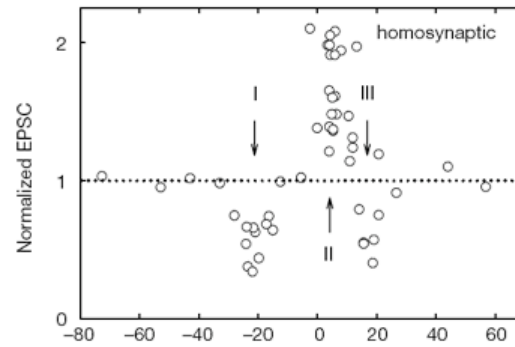
Feldman (2000)

11\_feldmanRule.psd

## Empirical Agreement with Calcium Model Prediction?



Shouval (2002)

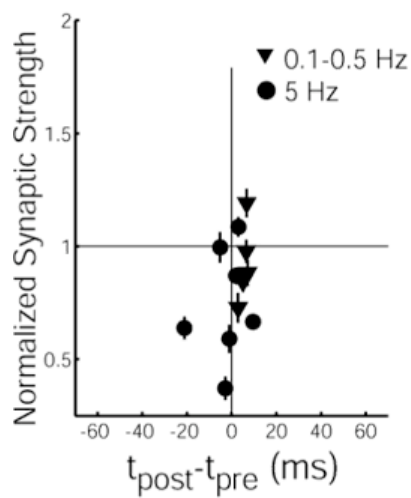


Nishiyama (2000)  
Hippocampus slice

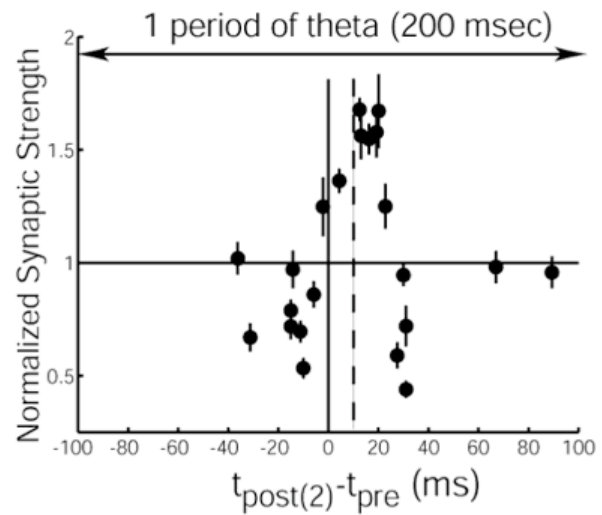
12\_Ca\_stdp2.psd

## Hippocampus Slice STDP with Burst-Pairing

Single spike rule



Theta-"burst" rule



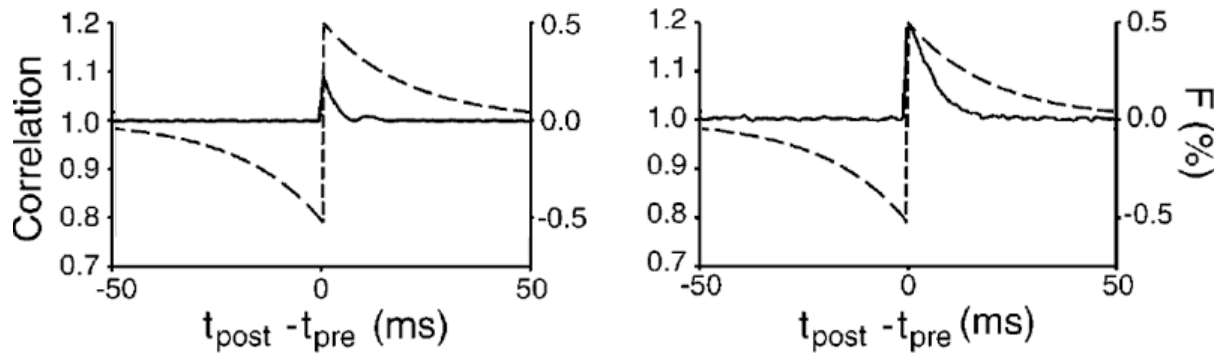
SS Wang, et al. (2004)

13\_burstSTDP.psd



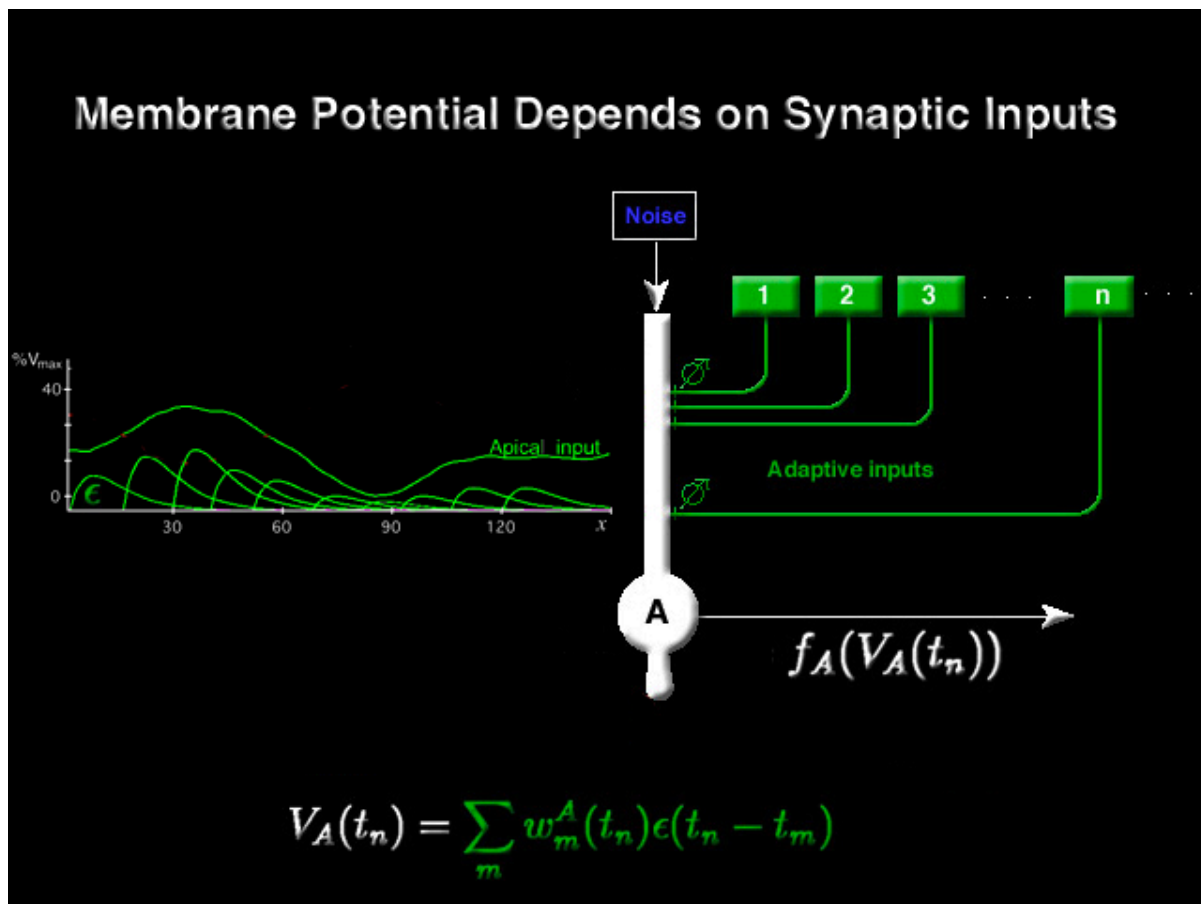
### Competitive STDP Model

$$F(\Delta t) = \begin{cases} c_P e^{-|\Delta t|/\tau_P} & \text{if } \Delta t > 0 \\ -c_D e^{-|\Delta t|/\tau_D} & \text{if } \Delta t < 0 \end{cases}$$



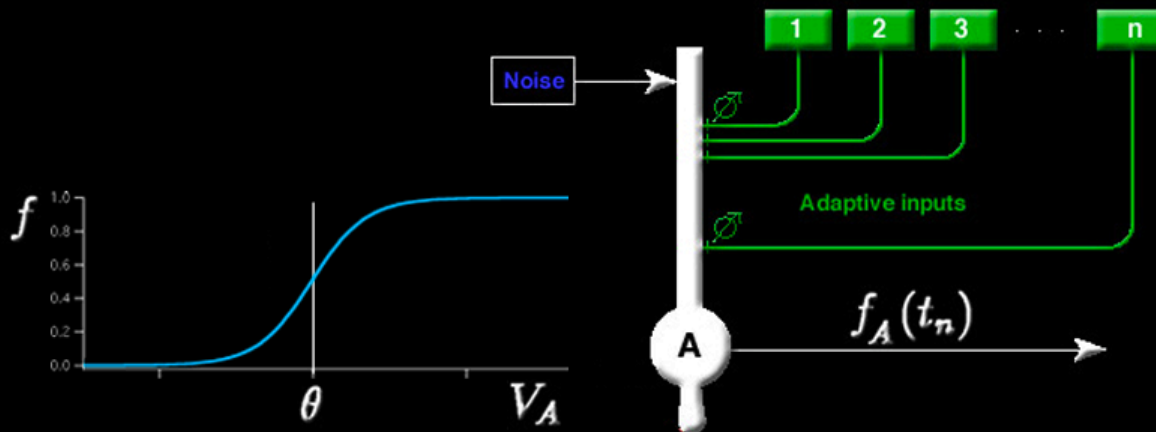
Song & Abbott (2000)

14\_songRule.psd



15\_Module.psd

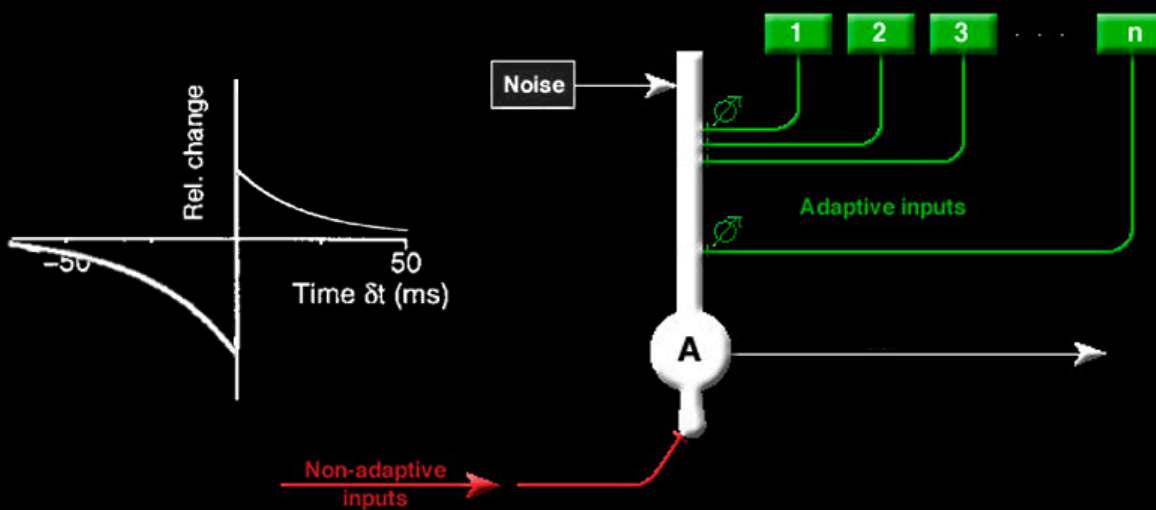
## Spike Probability Depends on Membrane Potential



$$f_A(t_n) = f_A(V_A(t_n)) = \frac{1}{1 + \exp[-\mu(V_A(t_n) - \theta)]}$$

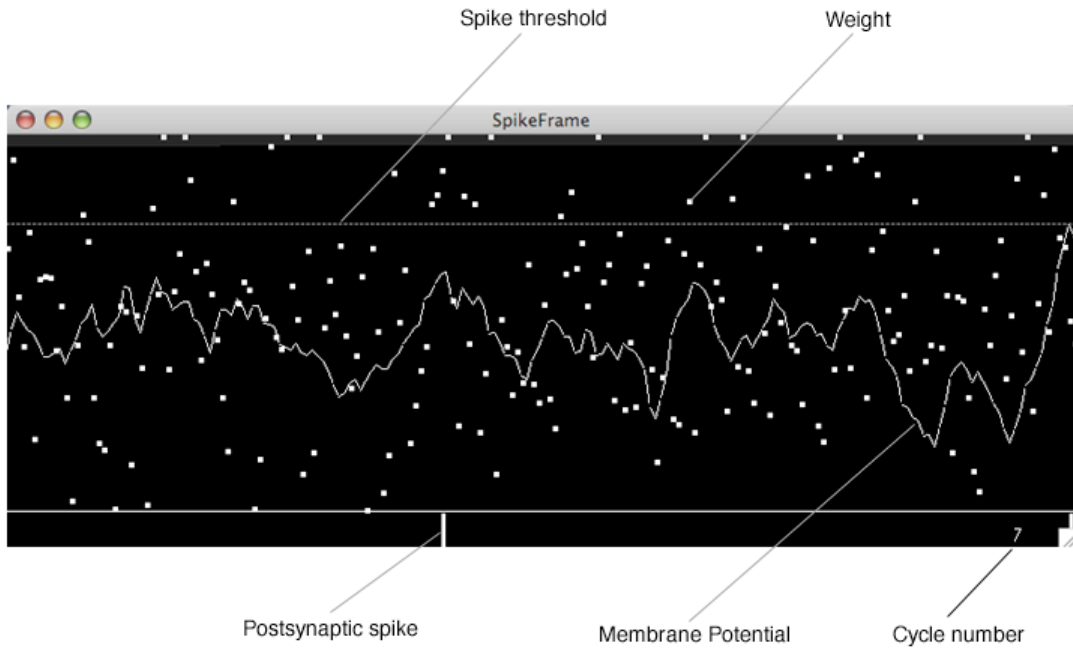
15b\_Module.psd

## Hebbian STDP with **Dominant LTD** Random Input Timings



17\_feldmanSimul.psd

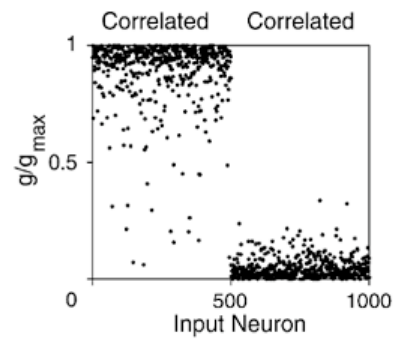
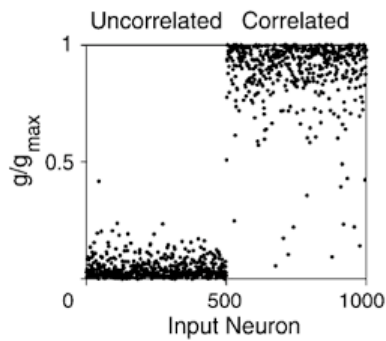
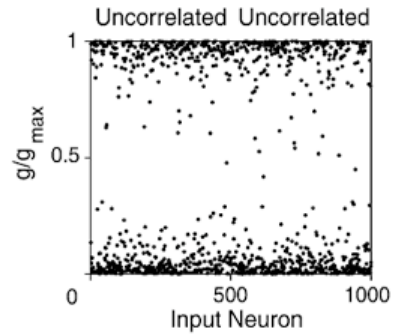
### STDP Simulation



16\_sim.psd

### Competitive STDP Model

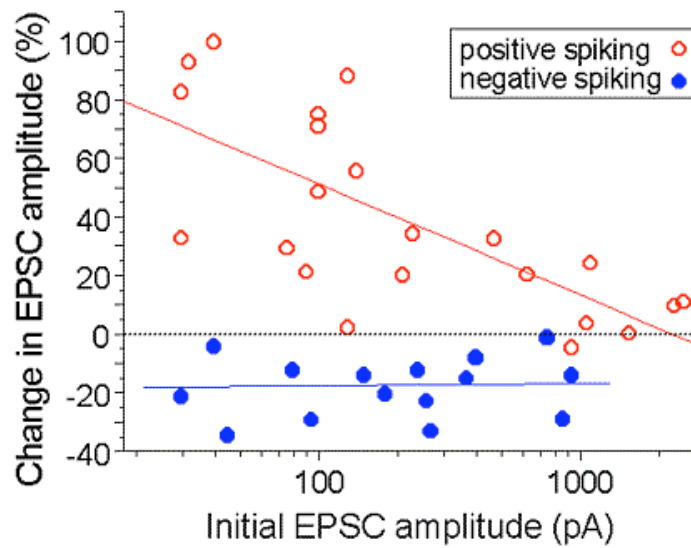
$$F(\Delta t) = \begin{cases} c_p e^{-\Delta t / \tau_p} & \text{if } \Delta t > 0 \\ -c_D e^{-|\Delta t| / \tau_D} & \text{if } \Delta t < 0 \end{cases}$$



Song & Abbott (2000)

18\_competition.psd

### Dependence on initial synaptic strength

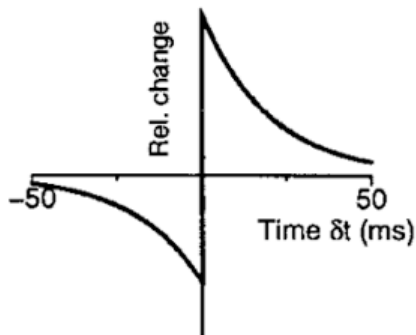


19.gif

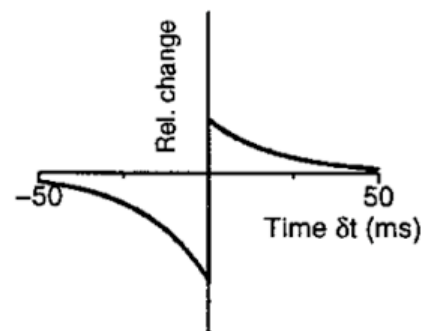
### Stable STDP Model

$$F(\Delta t) = \begin{cases} c_P e^{-|\Delta t|/\tau_P} & \text{if } \Delta t > 0 \\ -c_D w e^{-|\Delta t|/\tau_D} & \text{if } \Delta t < 0 \end{cases}$$

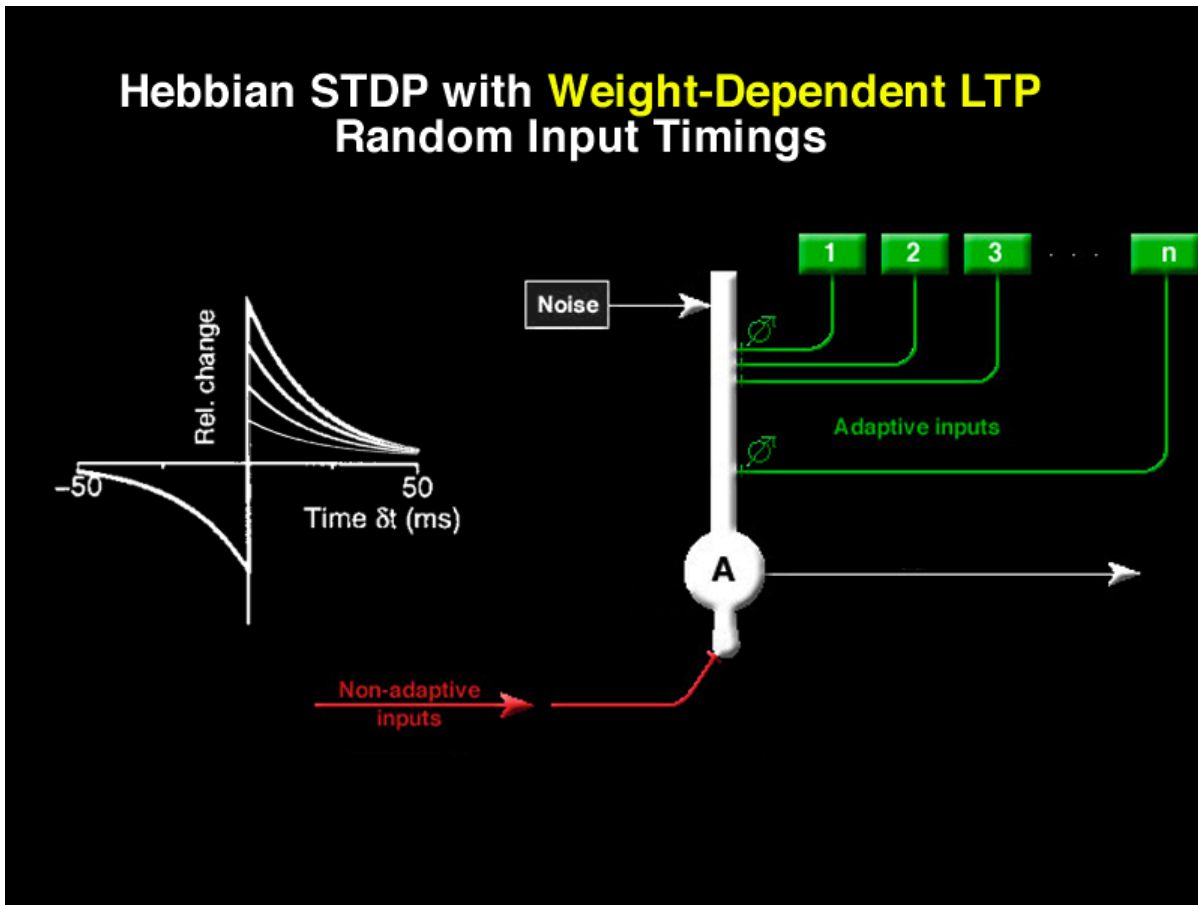
#### Weak synapses



#### Strong synapses

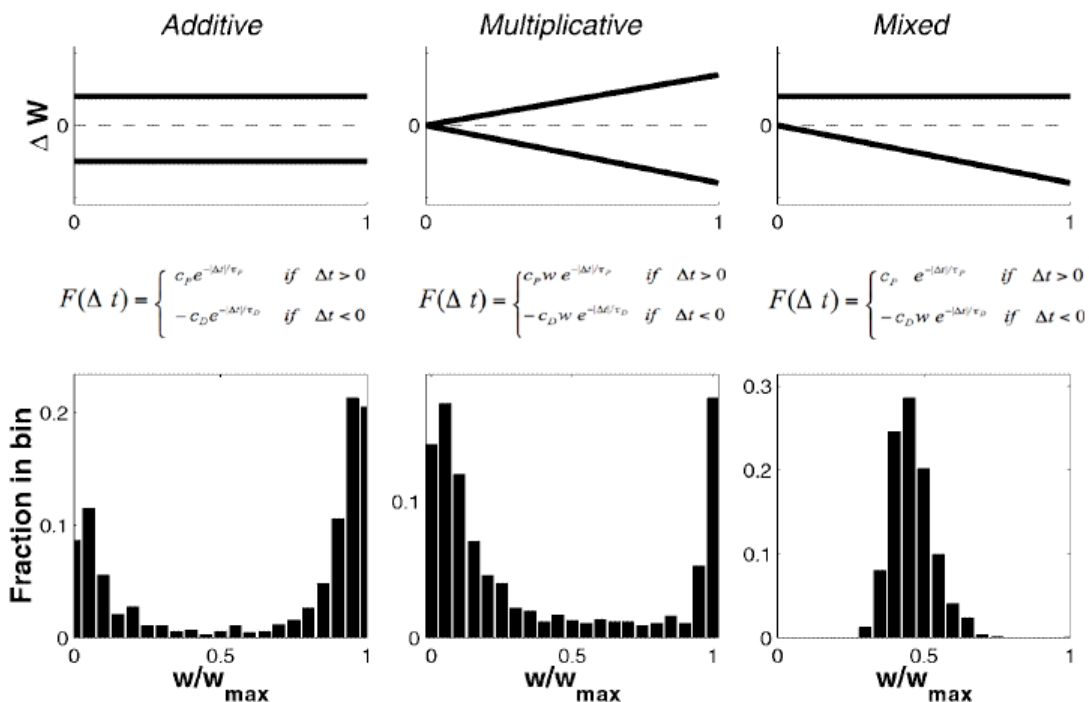


van Rossum et al. (2000)



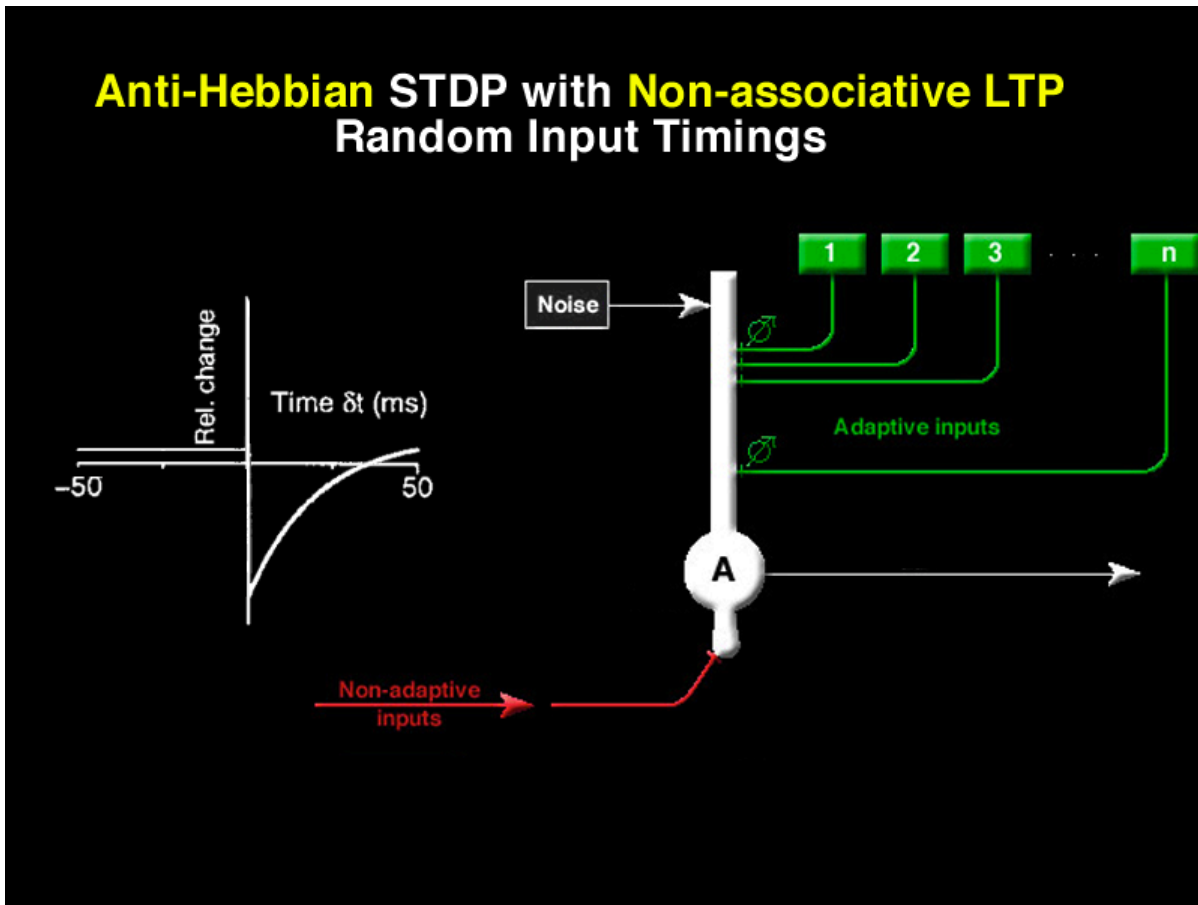
21\_biSimul.psd

### Additive vs. Multiplicative STDP Learning Rules

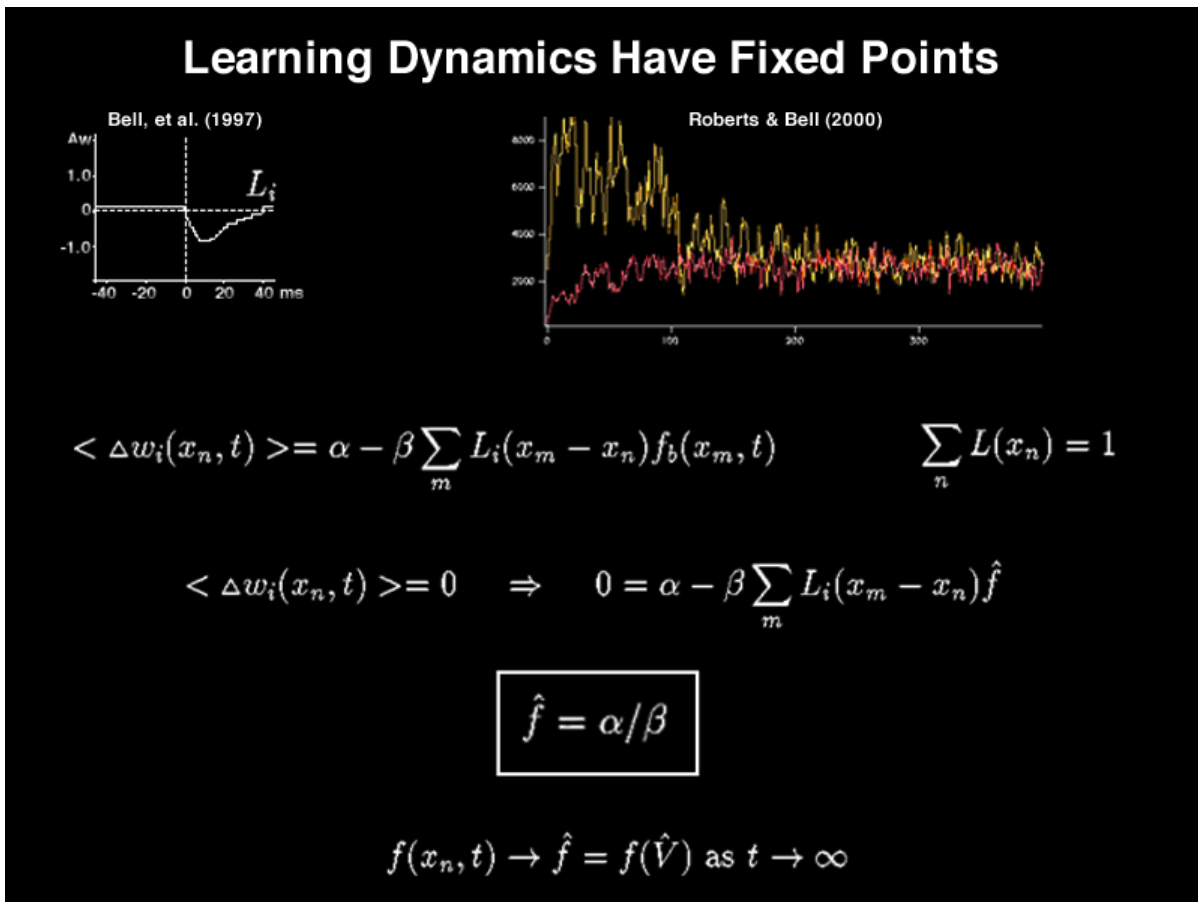


Kepecs, et al. (2002)

22\_distrib.psd



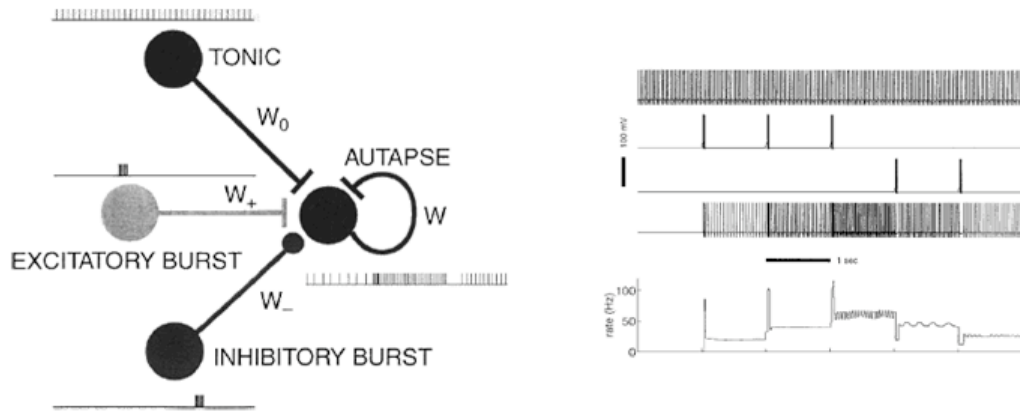
23\_bellSimul.psd



24\_FixedPt.psd



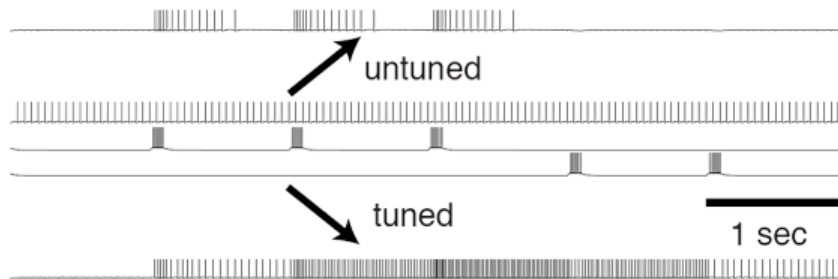
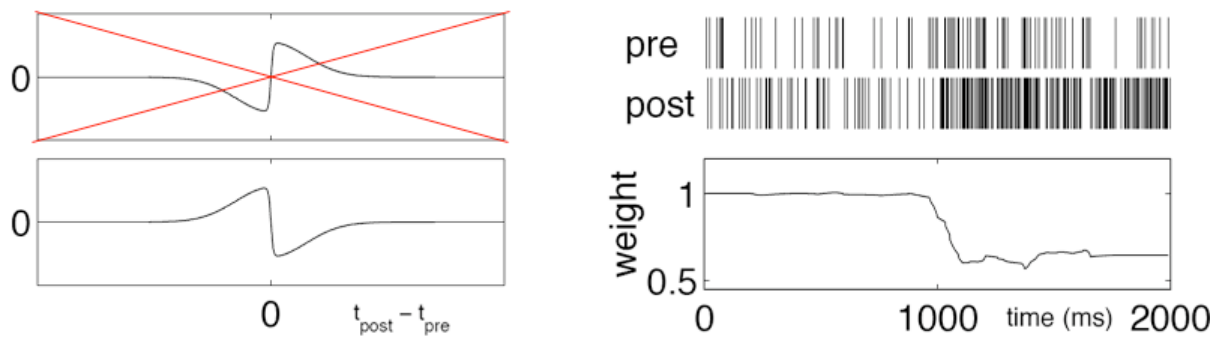
## Neural Integrator



Seung, et al. (2000)

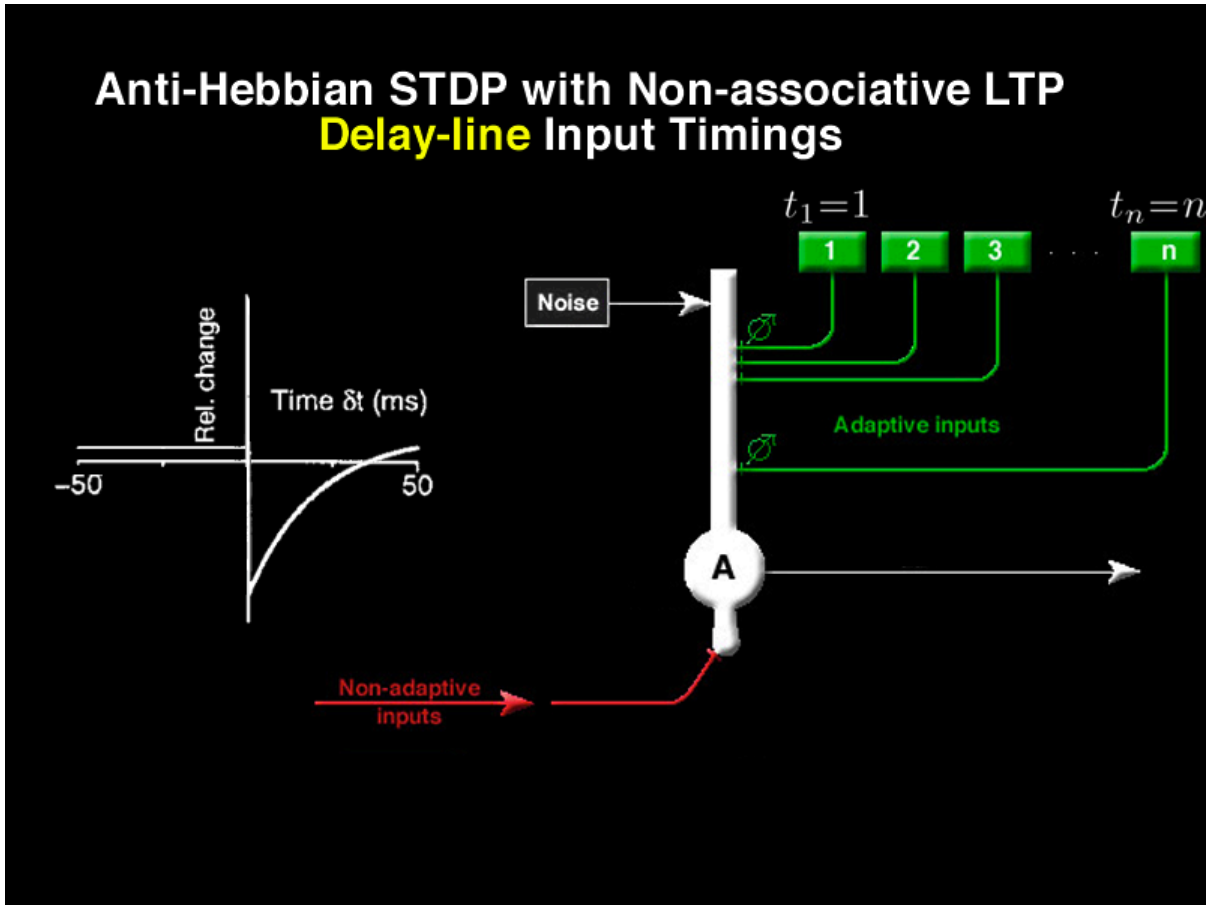
25\_autopase.psd

## Tuning the Neural Integrator

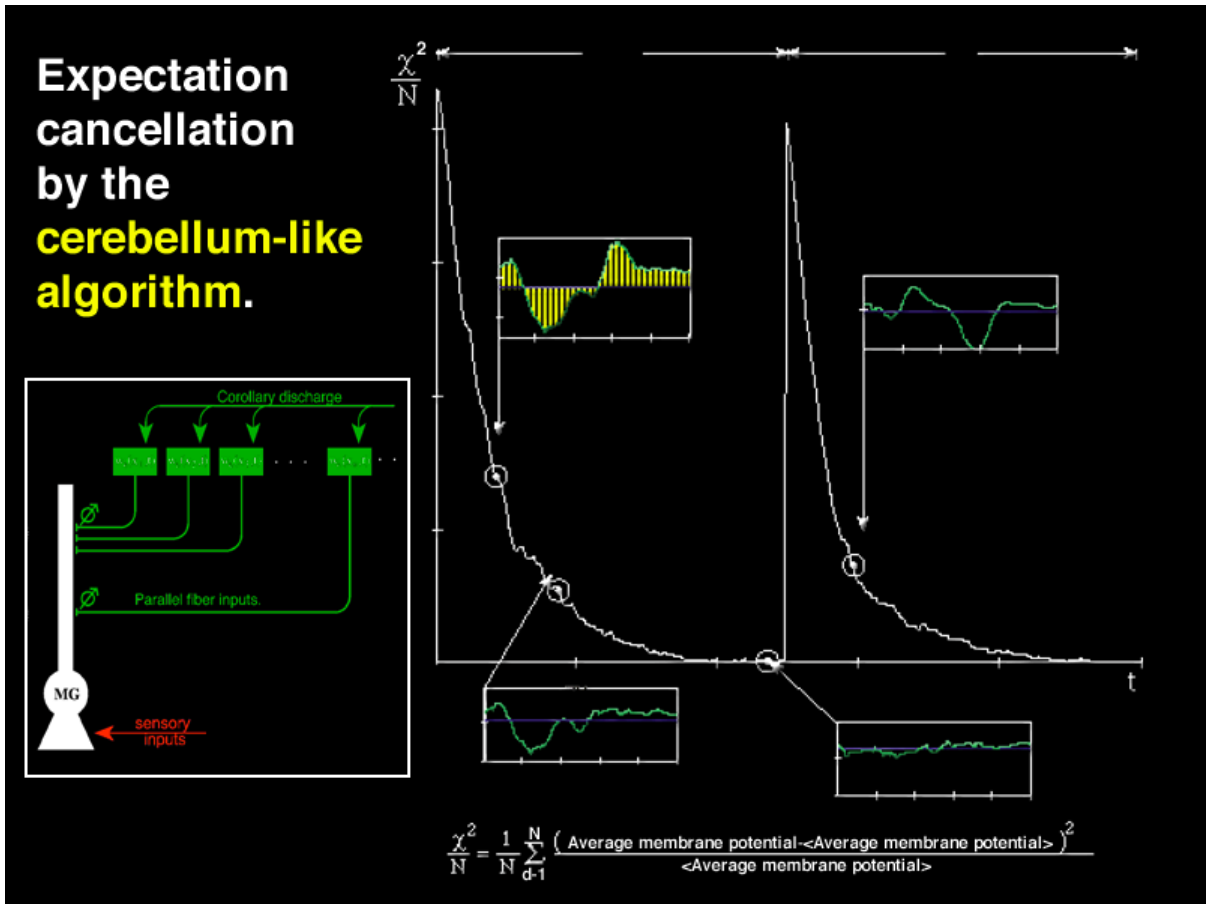


Xie & Seung (2000)

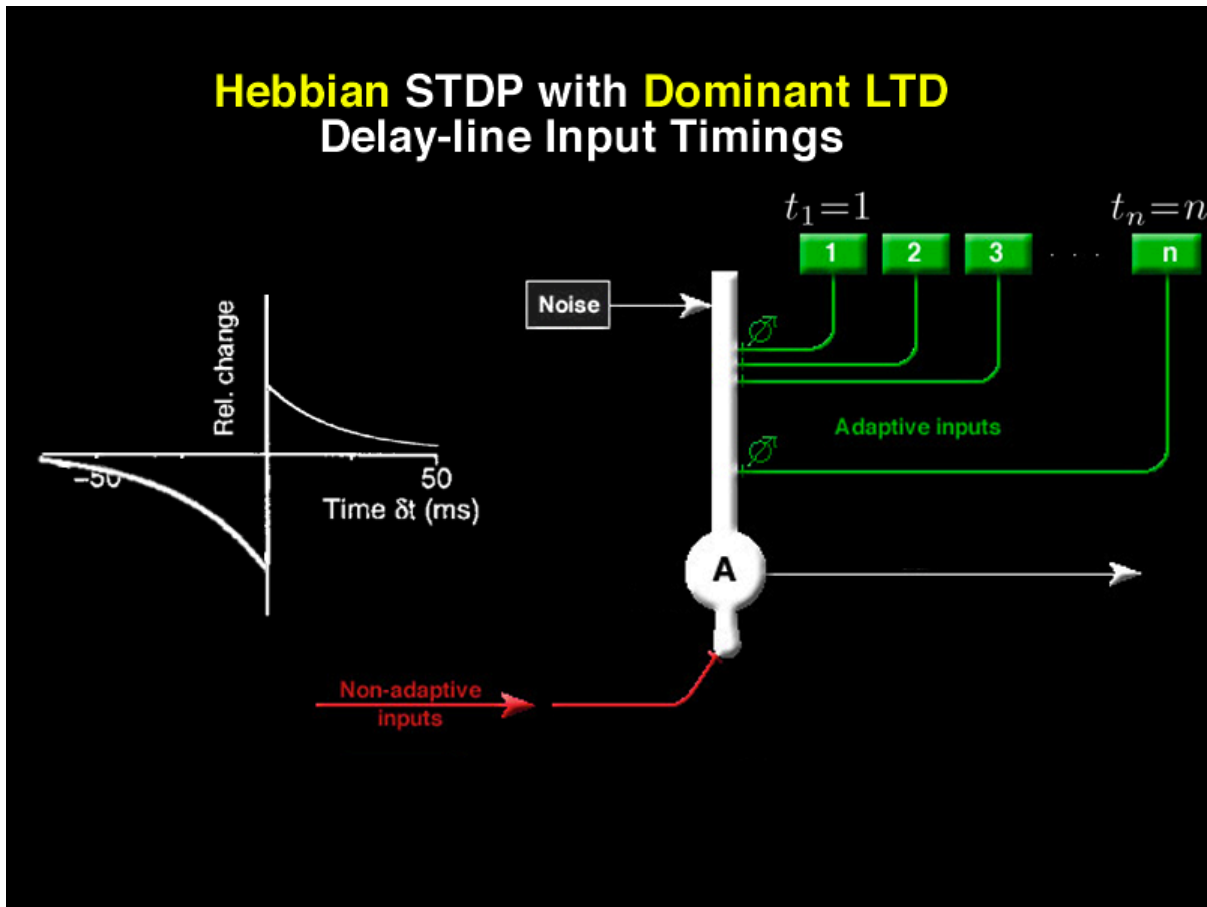
26\_autopaseTune.psd



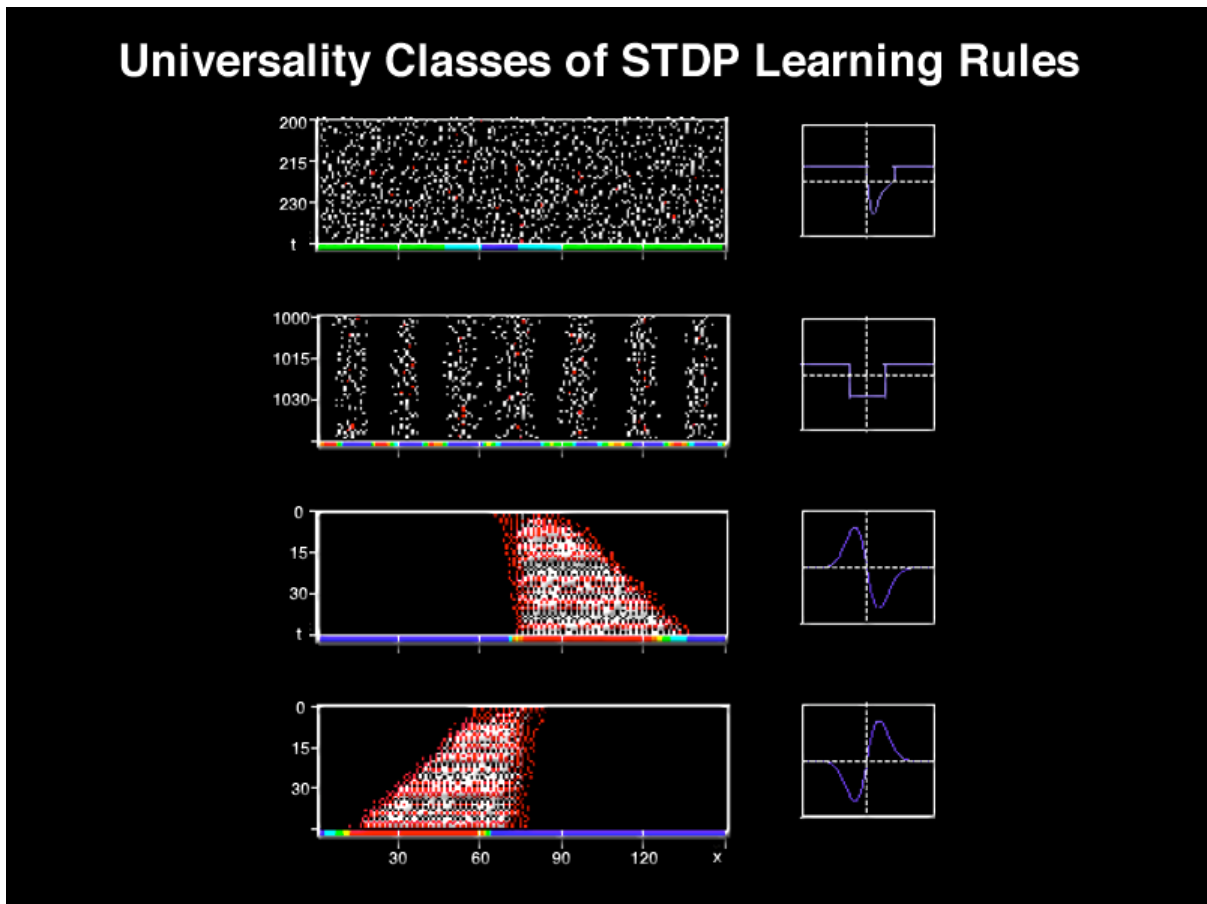
27\_bellSimul2.psd



28\_chi.psd



29\_feldmanSimul2.psd



30\_classesSTDP.psd