Theoretical & computational Neuroscience:

Programming the Brain

(BM 6140)

2-credit

#### Levels of abstraction in Neuroscience

**Behaviour** Responses to stimuli, choices etc

Systems e.g. Visual, Auditory, Motor

**Areas** e.g. Frontal, Temporal lobes

Circuit e.g. cortical column

**Neurons** A Cell

Synapse Connection between cells

Molecule Molecules, ions entering/leaving the cell

## Learning, memory and plasticity

- Can be studied and modeled at different levels
- Behaviour
- Network
- Cellular or synaptic
- All are interwoven

#### Behaviour

- Implicit memories
- E.g. walking, swimming
- Explicit memories
- Can explicitly state e.g. name, place etc.
- Habituation and Sensitization are also learning
- Habituation to noise
- Increased or decreased sensitivity in the face of exposure to stimuli
- e.g. We don't feel the chair we sit on, or the weight of clothes after some time

#### Hebb's rule

When an axon of cell A is near enough to excite a cell B and repeatedly or persistently takes part in firing it, some growth process or metabolic change takes place in one or both cells such that A's efficiency, as one of the cells firing B, is increased."

- Hebb (1949) The Organization of Behavior

Fire together, wire together

#### Crude network level learning rules

- Neurons firing together get strongly connected
- Once strong enough, even if subset fires, the whole set fires, because of strong interconnections: Associative memories

#### Synaptic plasticity

- Basis of higher level plasticity schemes
- ■Short- term plasticity : milliseconds minutes
- Long term plasticity : minutes to years
- •Underlying Mechanisms vary

#### Short term plasticity

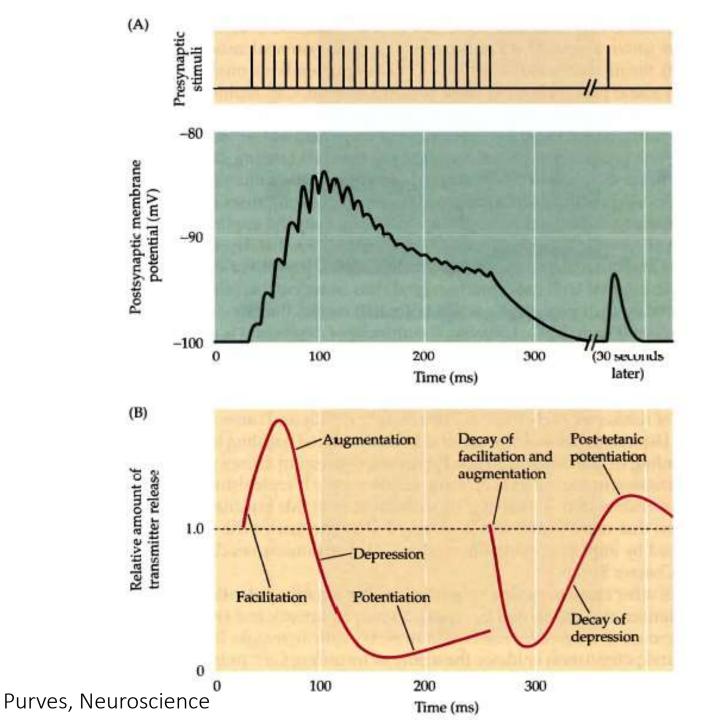
#### Facilitation:

Calcium buildup in presynapse => increased transmitter release => larger epsp

#### Depression:

Depletion of transmitter available => reduced epsp

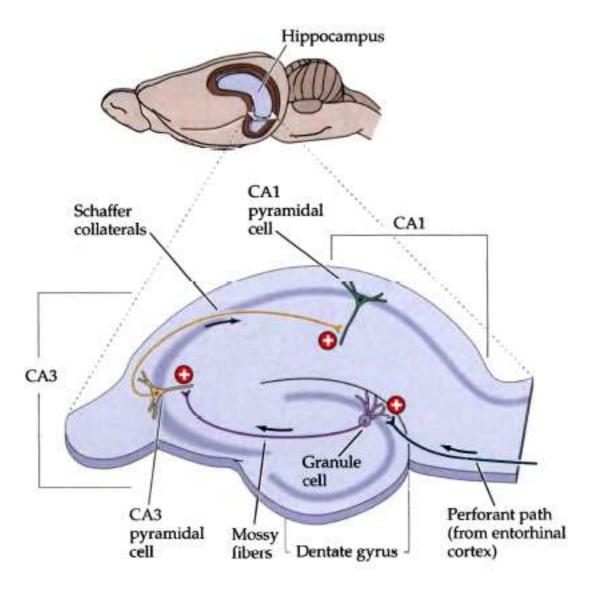
# Types of short term plasticity



#### Long term plasticity

- Long term potentiation(LTP) and Long term depression(LTD)
- Seconds to hours and beyond

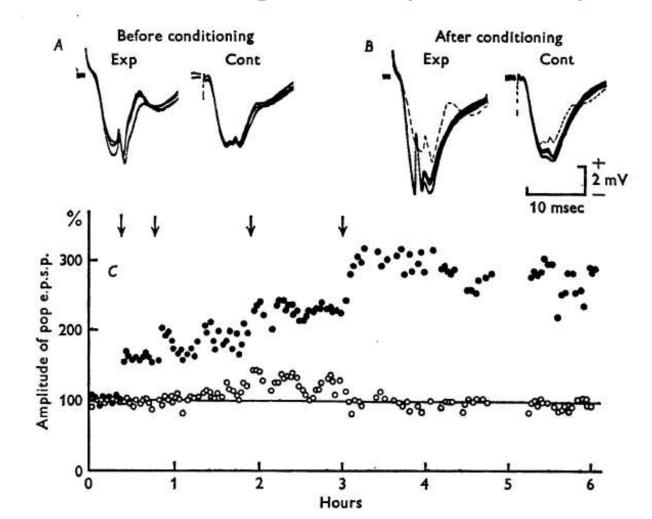
## Hippocampal trisynaptic circuit



Purves, Neuroscience

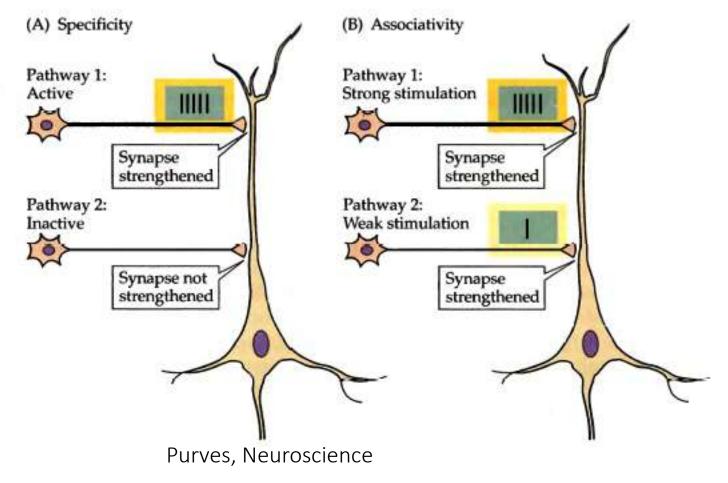
## LTP (Long term potentiation) NOT to be confused with long term plasticity

tetanic stimulation



#### Input specificity and Associativity

pyramidal neuron receiving synaptic inputs from two independent sets of Schaffer collateral axons. (A) Strong activity initiates LTP at active synapses (pathway 1) without initiating LTP at nearby inactive synapses (pathway 2). (B) Weak stimulation of pathway 2 alone does not trigger LTP. However, when the same weak stimulus to pathway 2 is activated together with strong stimulation of pathway 1, both sets of synapses are strengthened.

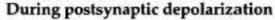


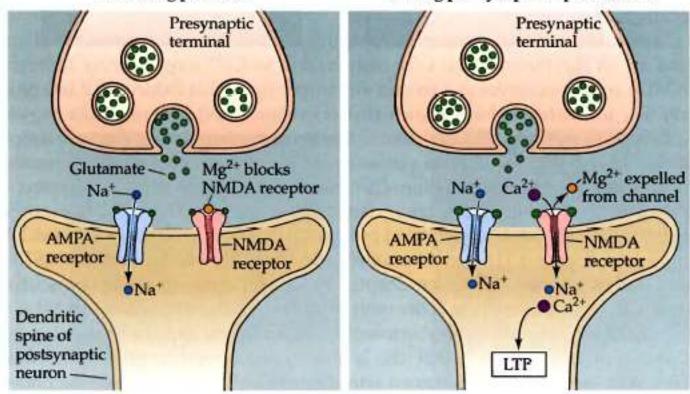
#### Cooperativity

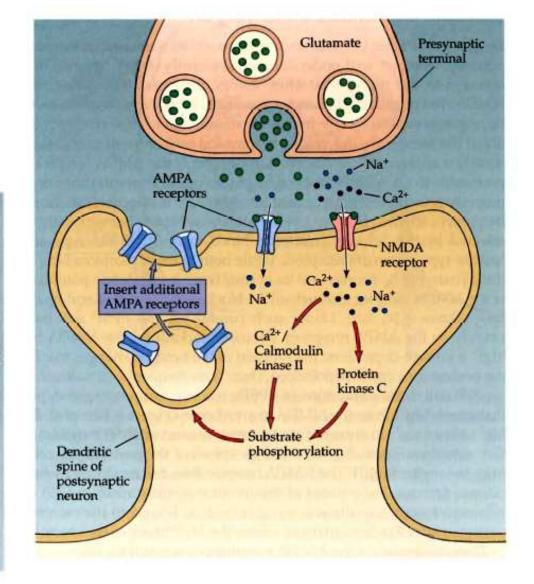
Similar to associativity, but no single stimulus can elicit LTP, but all together can!

#### Mechanism of LTP

#### At resting potential



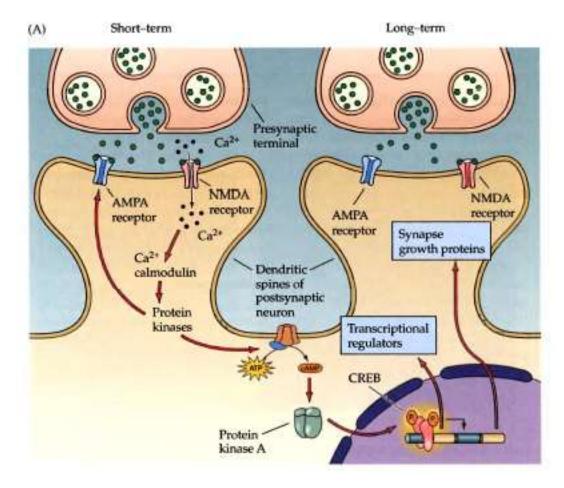




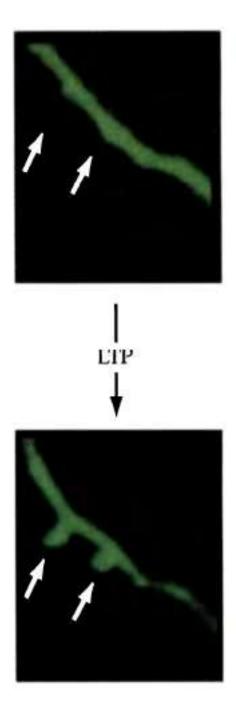
Induction

Maintenance

#### Structural change induced LTP



Purves, Neuroscience



#### This is not the only mechanism! Think!

- ■What if there is no NMDA receptor?
- ■Can fewer spikes evoke LTP?
- Is tetanic stimulus essential?

#### Plasticity: Key take away

- Need both Pre and post synaptic activity
- Pre synaptic activity to release glutamate
- Post synaptic activity for depolarization
- Depolarisation needed for CA<sup>2+</sup> influx: !! Calcium is the King!!
- Devil is in the details !! Biochemistry !!

#### Long term depression

- Induced in a protocol similar to LTP, but with lower frequency stimulus
- LTD also needs Ca<sup>2+</sup> influx but slow, low influx, while LTP needs faster Ca<sup>2+</sup> influx

#### Modeling plasticity

$$\tau_r \frac{dv}{dt} = -v + \mathbf{w} \cdot \mathbf{u} = -v + \sum_{b=1}^{N_u} w_b u_b$$

$$\tau_w \frac{d\mathbf{w}}{dt} = \langle v\mathbf{u} \rangle$$

u : vector of presynaptic firing rates

v : post synaptic firing rates

W: vector of weights

<> : Ensemble average over all possible combinations

#### Modeling plasticity

When input changes slowly with respect to time constant (eq 1), v = w.u and

$$\tau_w \frac{d\mathbf{w}}{dt} = \mathbf{Q} \cdot \mathbf{w}$$

Q is input correlation matrix

$$Q_{bb'} = \langle u_b u_{b'} \rangle$$

Problems: Unbounded growth?

#### BCM rule

$$\tau_w \frac{d\mathbf{w}}{dt} = v\mathbf{u} \left( v - \theta_v \right) .$$

Comparing v with a variable sliding threshold : e.g using  $\tau_{\theta} \frac{d\theta_{v}}{dt} = v^{2} - \theta_{v}$ 

- induces competition
- Normalisation of synaptic weights

## STDP: Spike timing dependent plasticity

■Bi and Poo (1998)

