

# Introduction to Computational Neuroscience

Biol 698  
Math 635  
Math 430



# Synaptic channels

- Synaptic channels
- Synaptic dynamics
- Short term plasticity: depression and facilitation

## Bibliography:

“Mathematical Foundations of Neuroscience” – G. B. Ermentrout & D. Terman (Springer, 2010).



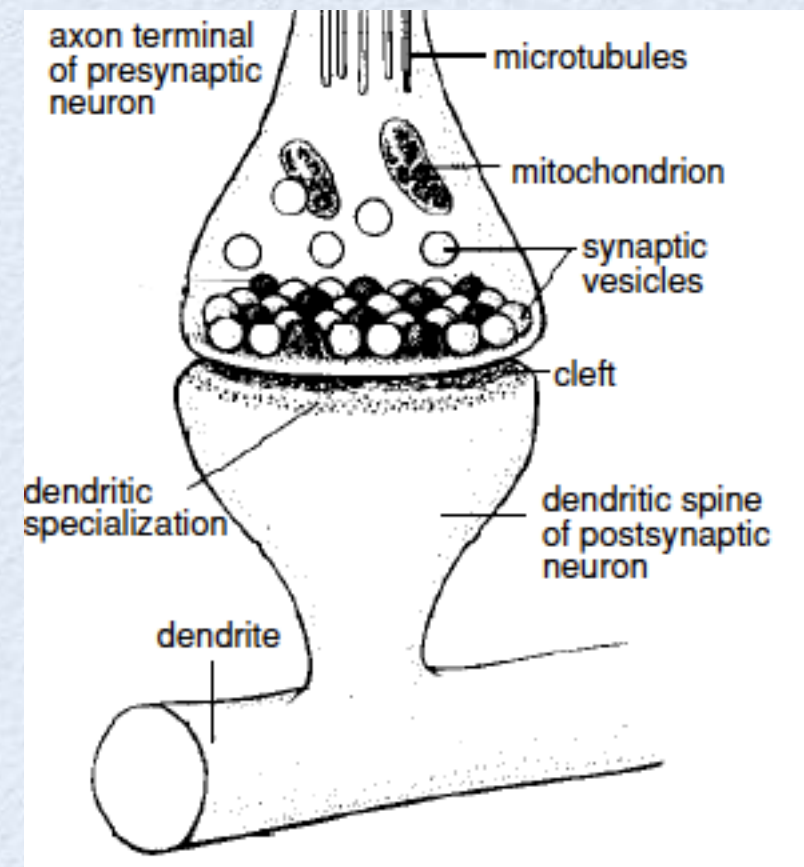
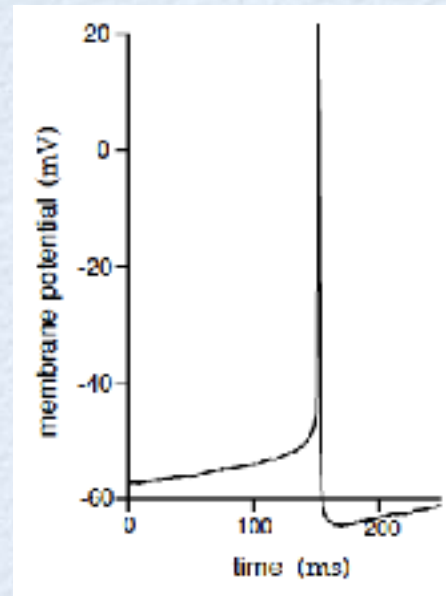
# Synaptic channels

## Membrane channels

- Voltage-gated
- Ion-gated
- **Synaptic**

## Opening of synaptic channels

- Action potential (AP) travels down the axon
- AP terminates at presynaptic sites (many)
- AP invades synaptic terminals (containing Ca)
- Depolarization release Ca
- Ca activates a Ca-binding protein
- Transmitter release (binding to vesicles containing the transmitter)
- Vesicles (“docked”) release the transmitter into the synaptic cleft
- Transmitter diffusion through the cleft
- Binding to receptors on the postsynaptic neuron (spines)
- Receptors open channels, causing
  - Depolarization
  - Hyperpolarization





# Synaptic channels

## Transmitter release

- Affected by neuromodulators (chemicals)
- Probabilistic
- Quantal (occurs in discrete amounts)
- Potentiation or facilitation (increase of transmitter over successive firings of APs)
- Depression (decrease of transmitter over successive firings of APs)

## Main transmitters:

- Glutamate (“excitation”)
- GABA (“inhibition”)



# Synaptic Dynamics

## Model: First approach

$$I_{\text{syn}} = g(t)(V_{\text{post}} - V_{\text{rev}})$$

$$g(t) = \bar{g} \sum_k \alpha(t - t_k)$$

$$\alpha(t) = \frac{a_d a_r}{a_r - a_d} (e^{-a_d t} - e^{-a_r t})$$

- $g(t)$ : synaptic conductance
- $a_r$ : rise time
- $a_d$ : decay time

$$z'' + (a_r + a_d)z' + a_r a_d z = a_r a_d \sum_k \delta(t - t_k)$$



# Synaptic Dynamics

## Model:

$$I_{\text{syn}} = g(t)(V_{\text{post}} - V_{\text{rev}})$$

- $[T]$ : Concentration of transmitter released into the synaptic cleft by a presynaptic spike
- $s(t)$ : Fraction of open channels
- $a_r$ : rise time
- $a_d$ : decay time

$$\frac{ds}{dt} = a_r [T](1 - s) - a_d s$$

$$[T](V_{\text{pre}}) = \frac{T_{\text{max}}}{1 + \exp(-(V_{\text{pre}} - V_T)/K_p)}$$

$$T_{\text{max}} = 1 \text{ mM}, V_T = -2, \text{ and } K_p = 5 \text{ mV}.$$



# Synaptic Dynamics

## Excitation (chemical)

- AMPA/kainate (very fast)
- NMDA (implicated in memory and long-term potentiation)

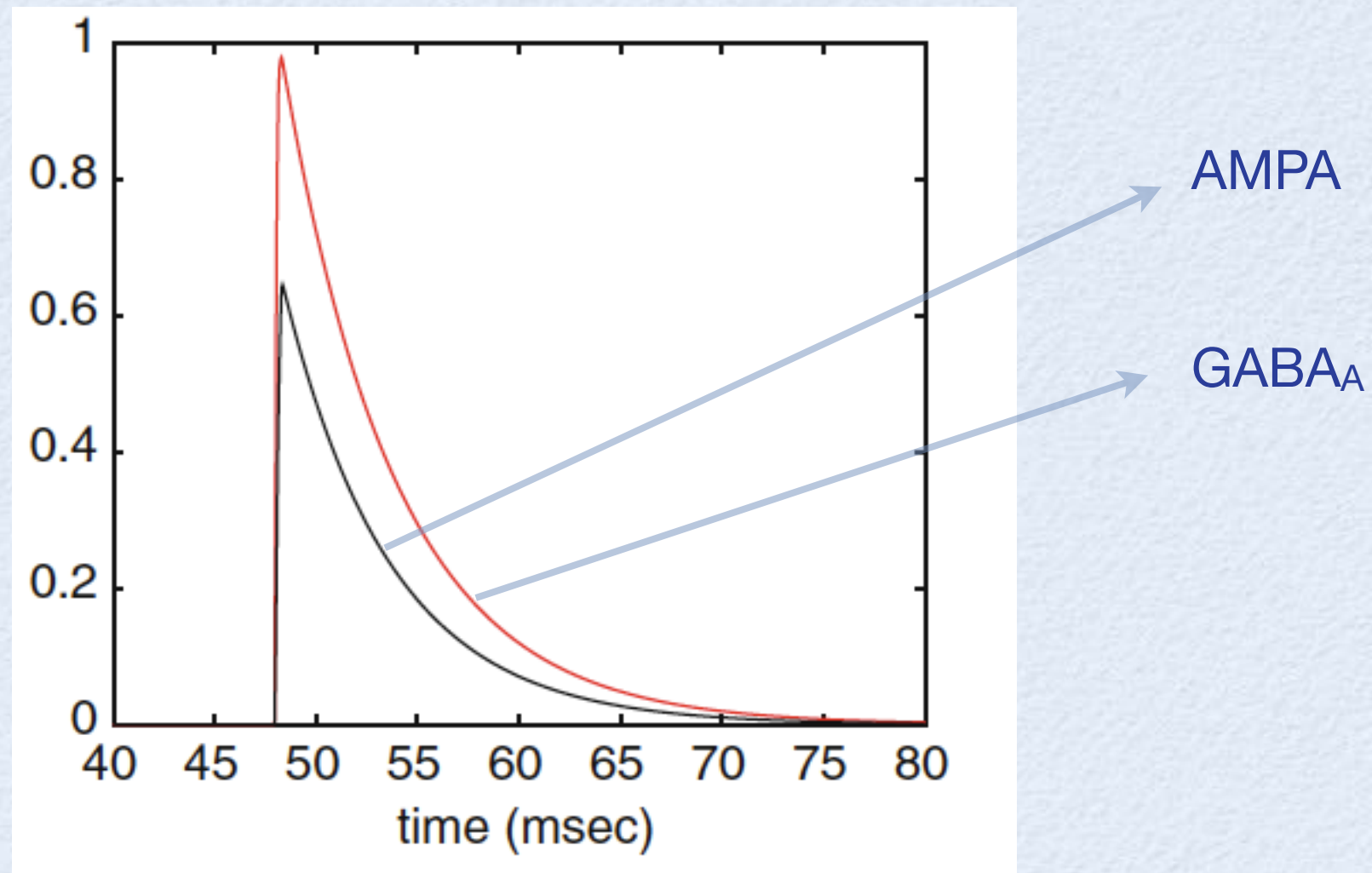
## Inhibition (chemical)

- GABA<sub>A</sub> (fast)
- GABA<sub>B</sub>

## Gap junctions (electrical)

# Synaptic Dynamics

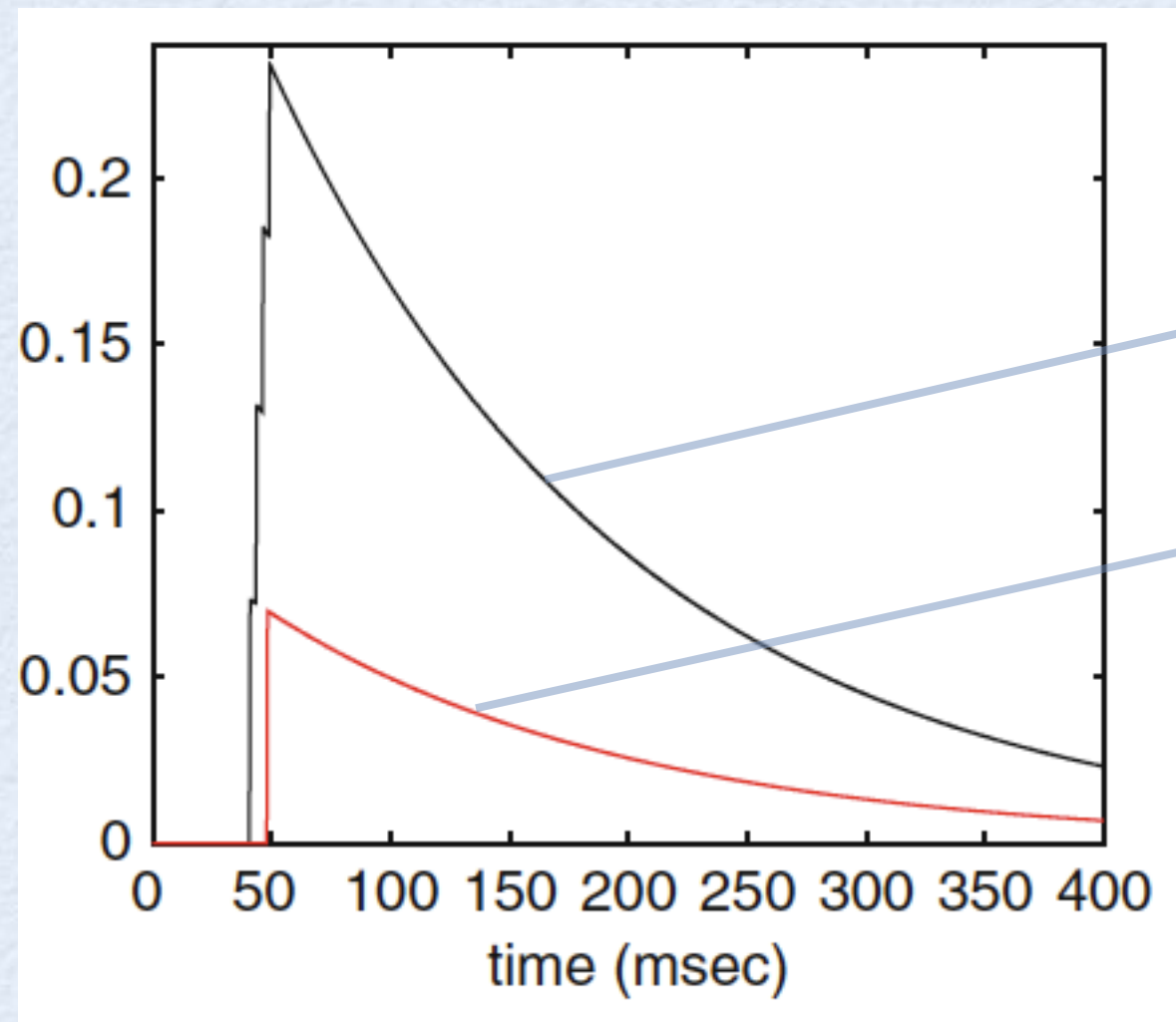
**Model:**





# Synaptic Dynamics

## Model:



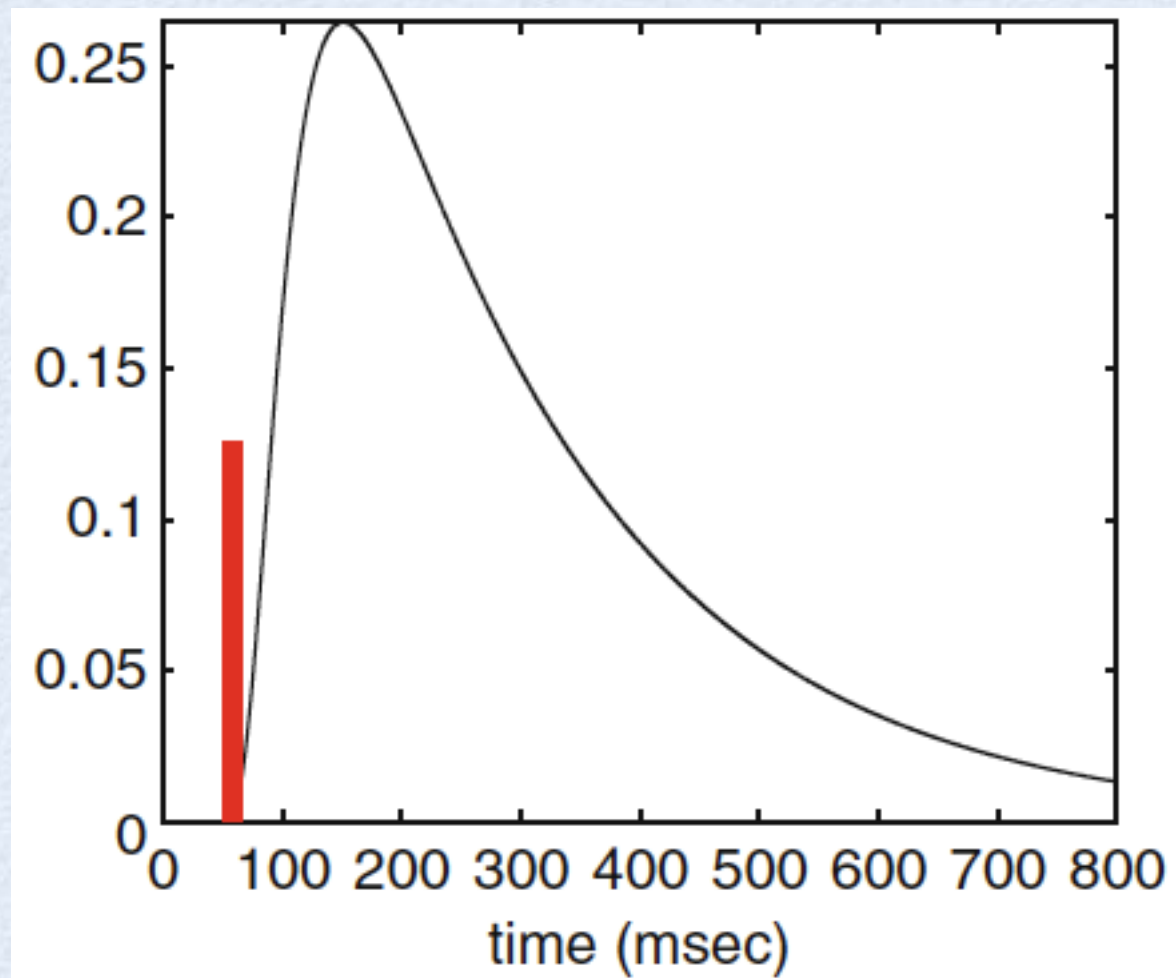
NMDA (4 spikes)

NMDA (1 spike)



# Synaptic Dynamics

**Model:**



GABA<sub>B</sub> (8 spikes)



# Synaptic Dynamics

## AMPA/kainate

$$I_{\text{AMPA}} = \bar{g}_{\text{AMPA}} s (V - V_{\text{AMPA}})$$

$$V_{\text{AMPA}} = 0$$

$$a_r = 1.1 \text{ mM}^{-1} \text{ ms}^{-1} \text{ and } a_d = 0.19 \text{ ms}^{-1}$$



# Synaptic Dynamics

## NMDA

- Faster than AMPA
- Partially blocked by Mg under normal conditions
- Mg block can be removed if the postsynaptic neuron is depolarized
- Both the pre- and post-synaptic cells must be active for  $I_{\text{NMDA}}$  to flow
- Memory encoding (long term changes, Ca)
- Persistent activity (short term memory)

$$I_{\text{NMDA}} = \bar{g}_{\text{NMDA}} s B(V) (V - V_{\text{NMDA}})$$

$$B(V) = \frac{1}{1 + e^{-(V - V_T)/16.13}}$$

$$V_T = 16.13 \ln \frac{[\text{Mg}^{2+}]}{3.57}$$

At the physiological concentration of 2 mM,  $V_T \approx -10 \text{ mV}$

$$V_{\text{NMDA}} = 0 \text{ mV}$$

$$a_r = 0.072 \text{ mM}^{-1} \text{ ms}^{-1}, a_d = 0.0066$$



# Synaptic Dynamics

## GABA<sub>A</sub>

$$I_{\text{GABA}_A} = \bar{g}_{\text{GABA}_A} s (V - V_{\text{GABA}_A})$$

$V_{\text{GABA}_A}$  varying between  $-81$  and  $-60$  mV

$$a_r = 5 \text{ mM}^{-1} \text{ ms}^{-1}, a_d = 0.18 \text{ ms}^{-1}$$

- Carried by Cl<sup>-</sup>
- Dependent on the physiological conditions and the developmental stage of the neuron



# Synaptic Dynamics

- Direct synapses: AMPA / kainate, NMDA, GABA<sub>A</sub> (ion channel and receptor are the same protein)
- Indirect synapses: GABA<sub>B</sub> (activator of the receptor sets off a cascade of intracellular events which alter the conductivity of an ion channel)

## GABA<sub>B</sub>

- Transmitter binding to a receptor protein
- Activation of an intracellular complex (G-protein)
- Activation of a K channel (membrane hyperpolarization)
- Slow responses
- Non-linear responses
- Long lasting responses



# Synaptic Dynamics

## GABA<sub>B</sub>

$$I_{\text{GABA}_B} = \bar{g}_{\text{GABA}_B} \frac{s^n}{K_d + s^n} (V - E_K).$$

$$\frac{dr}{dt} = a_r [T] (1 - r) - b_r r,$$

$$\frac{ds}{dt} = K_3 r - K_4 s.$$

r: receptor

s: ion channel

$$a_r = 0.09 \text{ mM}^{-1} \text{ ms}^{-1}, a_d = 0.0012 \text{ ms}^{-1}$$

$$n = 4, \bar{K}_d = 100, K_3 = 0.18 \text{ ms}^{-1}, \text{ and } K_4 = 0.034 \text{ ms}^{-1}$$



# Synaptic Dynamics

## Gap junctions

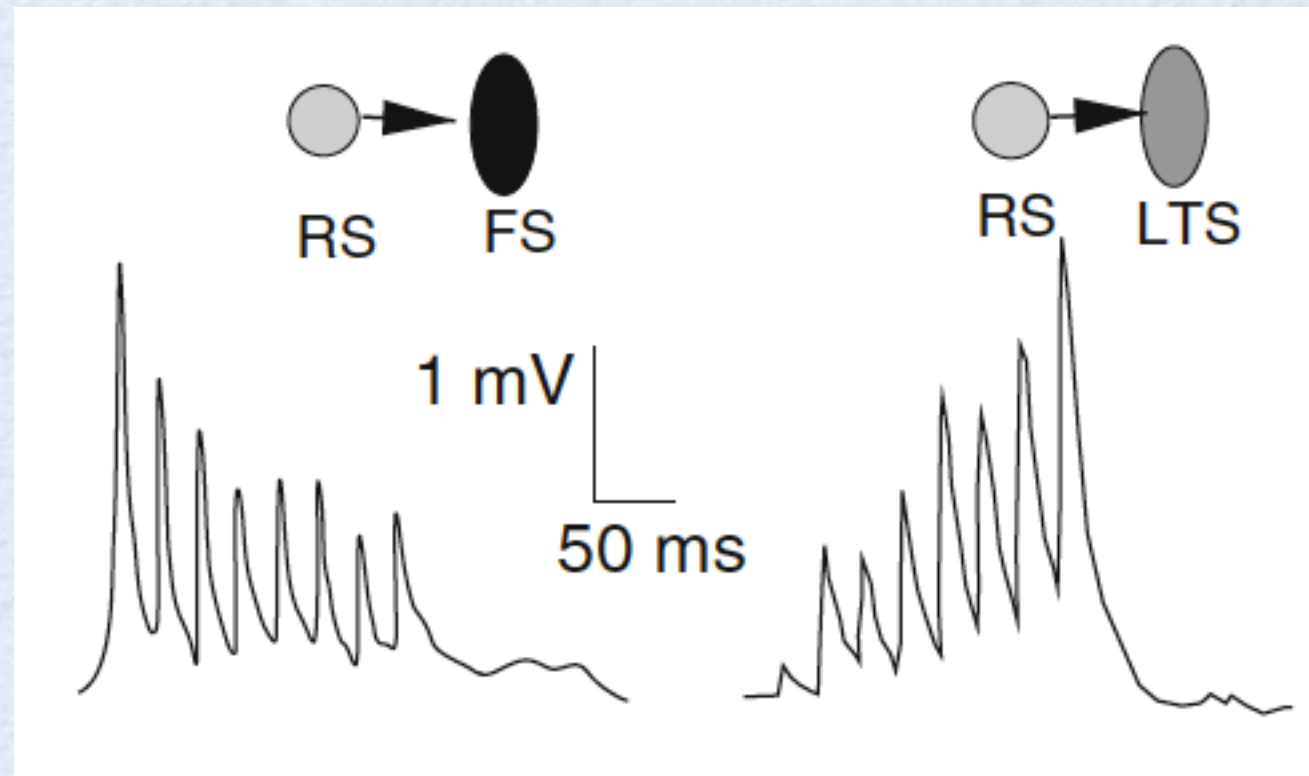
- Communication via tight junctions between membranes
- Act as resistors
- Always keep the cells in communication
- No need of a presynaptic AP

$$I_{\text{gap}} = \bar{g}_{\text{gap}}(V_{\text{post}} - V_{\text{pre}})$$



# Synaptic Dynamics

## Short-term plasticity



**Fig. 7.2** (a) Short-term synaptic plasticity in cortical neurons (from [12]). Connections between cortical excitatory cells (RS) and cortical fast spike units (inhibitory) show synaptic depression for 20-Hz stimuli, whereas connections between cortical excitatory cells and low threshold spike (LTS) inhibitory cells show facilitation. (b–d) Simulations of (7.13) and (7.14) to periodic stimuli. The parameters for (b) are  $\tau_d = 300$ ,  $a_d = 0.5$ ,  $d_0 = 1$ ,  $\tau = 10$  and there is no facilitation. The parameters for (c) are  $\tau_f = 500$ ,  $a_f = 0.2$ ,  $f_0 = 0$ ,  $\tau = 10$  with no depression. The frequency is 20 Hz. (d) Both depression and facilitation with  $f_0 = 0$ ,  $d_0 = 1$ ,  $\tau_f = 50$ ,  $\tau_d = 400$ ,  $a_f = 0.2$ ,  $a_d = 0.05$ , and  $\tau = 5$ . The frequency is 100 Hz



# Synaptic Dynamics

## Model (Dayan & Abbott)

$$M(t) = q(t)f(t)$$

- $M$ : Magnitude of synaptic release per presynaptic spike
- $q$ : Depression (between 0 and 1) -  $d_0$ : resting value
- $f$ : Facilitation (between 0 and 1) -  $f_0$ : resting value

$$\tau_f \frac{df}{dt} = f_0 - f \quad \text{and} \quad \tau_d \frac{dq}{dt} = d_0 - q$$

Each time there is a spike,  $f(t)$  is increased by an amount  $a_f(1 - f)$  and  $q(t)$  is decreased by an amount  $a_d d$ . In both cases, the change is multiplied by a factor which keeps the variables bounded between 0 and 1.



# Synaptic Dynamics

## Model (Dayan & Abbott)

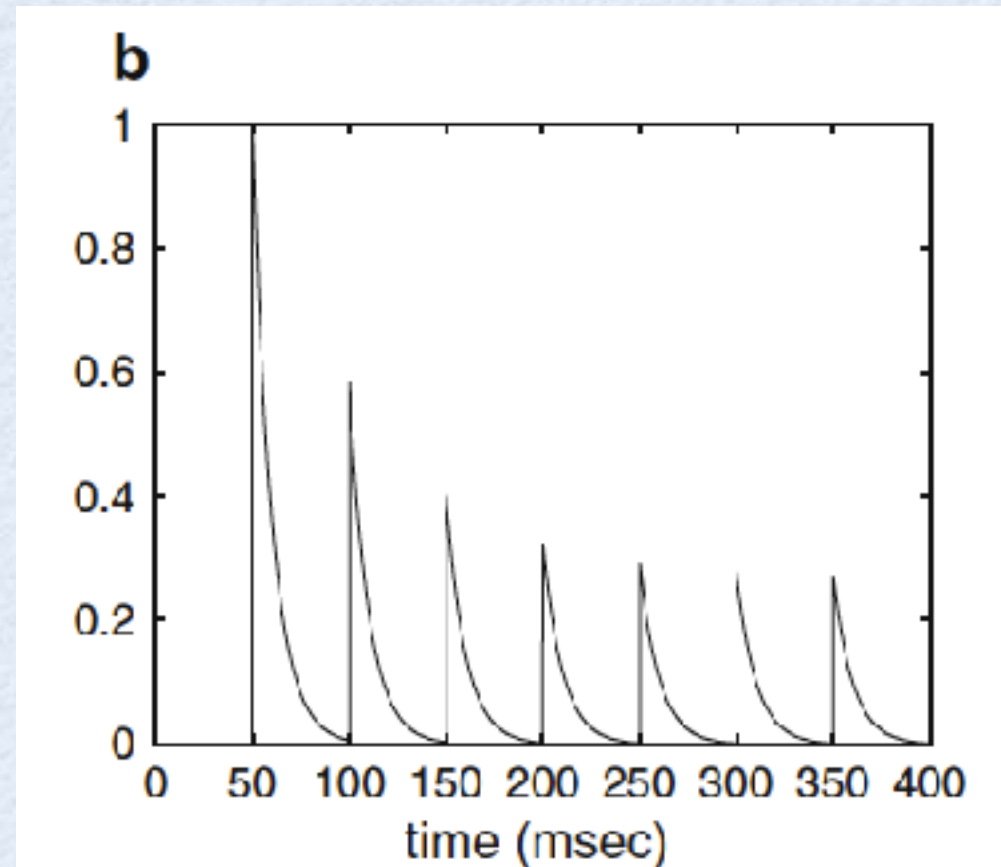
$$\frac{df}{dt} = \frac{f_0 - f}{\tau_f} + \left( \sum_j \delta(t - t_j) \right) a_f (1 - f)$$

$$\frac{dq}{dt} = \frac{d_0 - q}{\tau_d} - \left( \sum_j \delta(t - t_j) \right) a_d q$$



# Synaptic Dynamics

## Short-term plasticity

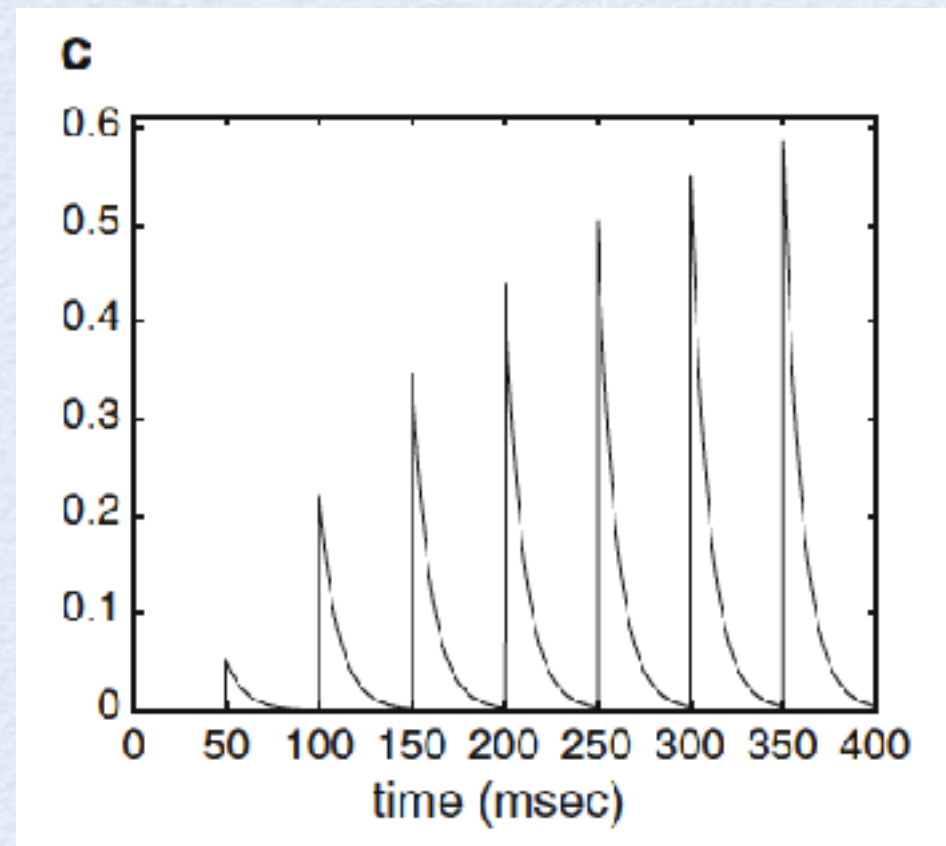


**Fig. 7.2** (a) Short-term synaptic plasticity in cortical neurons (from [12]). Connections between cortical excitatory cells (RS) and cortical fast spike units (inhibitory) show synaptic depression for 20-Hz stimuli, whereas connections between cortical excitatory cells and low threshold spike (LTS) inhibitory cells show facilitation. (b–d) Simulations of (7.13) and (7.14) to periodic stimuli. The parameters for (b) are  $\tau_d = 300$ ,  $a_d = 0.5$ ,  $d_0 = 1$ ,  $\tau = 10$  and there is no facilitation. The parameters for (c) are  $\tau_f = 500$ ,  $a_f = 0.2$ ,  $f_0 = 0$ ,  $\tau = 10$  with no depression. The frequency is 20 Hz. (d) Both depression and facilitation with  $f_0 = 0$ ,  $d_0 = 1$ ,  $\tau_f = 50$ ,  $\tau_d = 400$ ,  $a_f = 0.2$ ,  $a_d = 0.05$ , and  $\tau = 5$ . The frequency is 100 Hz



# Synaptic Dynamics

## Short-term plasticity

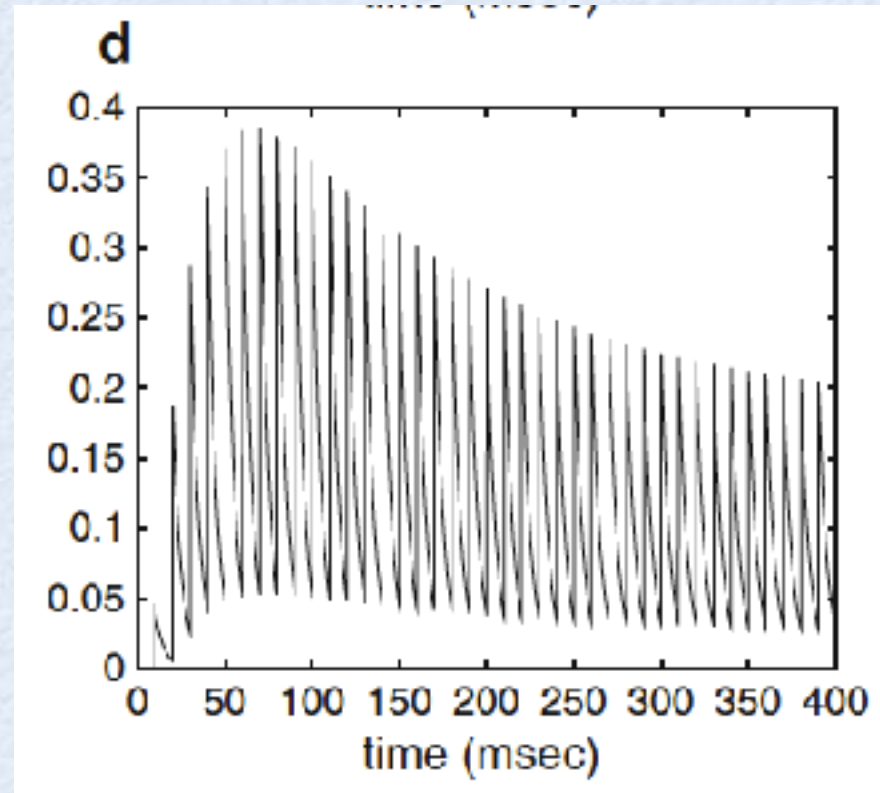


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# Synaptic Dynamics

## Short-term plasticity



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# Synaptic Dynamics

## Depression model (Manor et al.)

$$\frac{dq}{dt} = \frac{q_{\infty}(V) - q}{\tau_1 + \tau_2 q_{\infty}(V)},$$

$$q_{\infty}(V) = \frac{1}{1 + e^{k(V - V_{\text{thr}})}}$$

$k > 0$  and  $V_{\text{thr}}$  are parameters

$$\frac{ds}{dt} = a_r[T](1 - s) - a_d s$$

$$\bar{g}s(t)q(t)$$

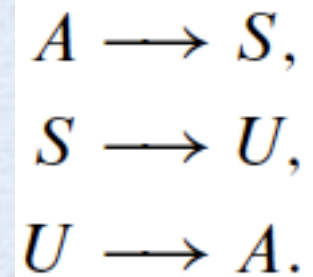
## Facilitation:

$$k < 0$$



# Synaptic Dynamics

## Depression: three-state model



- A: Available transmitter
- S: Conducting state (produces the synaptic conductance)
- U: Transmitter which is unavailable for release

$$\frac{ds}{dt} = \alpha(V)(1 - s - u) - \beta s \quad \text{and} \quad \frac{du}{dt} = \beta s - \beta_2 u.$$