

Outline (write this out)

1. Quantitative model of what happens when an action potential invades pre-synaptic bouton

2a
 AMPA
 NMDA
 $GABA_A$
 $GABA_B$

2 what determines synaptic strength?

3. how do weights change

- a) short term plasticity (STP, STDP)
- b) long term plasticity (LTP, LTD, STDP)

III

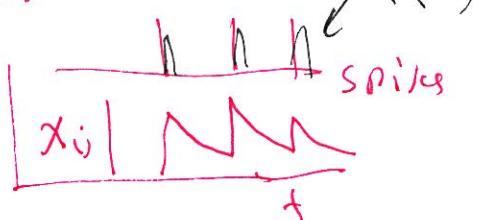
Start by writing down eqns

$$C_i \frac{dV_i}{dt} = -g_L(V_i - E_L) - \bar{g}_{w_{ij}} m_i^3 h_i (V_i - E_h) - \dots$$

$$- \sum_j w_{ij} x_{ij} (V_i - E_j)$$

$$\frac{dx_{ij}}{dt} = \alpha_{ij}(c)(1-x_{ij}) - \beta_{ij}x_{ij}$$

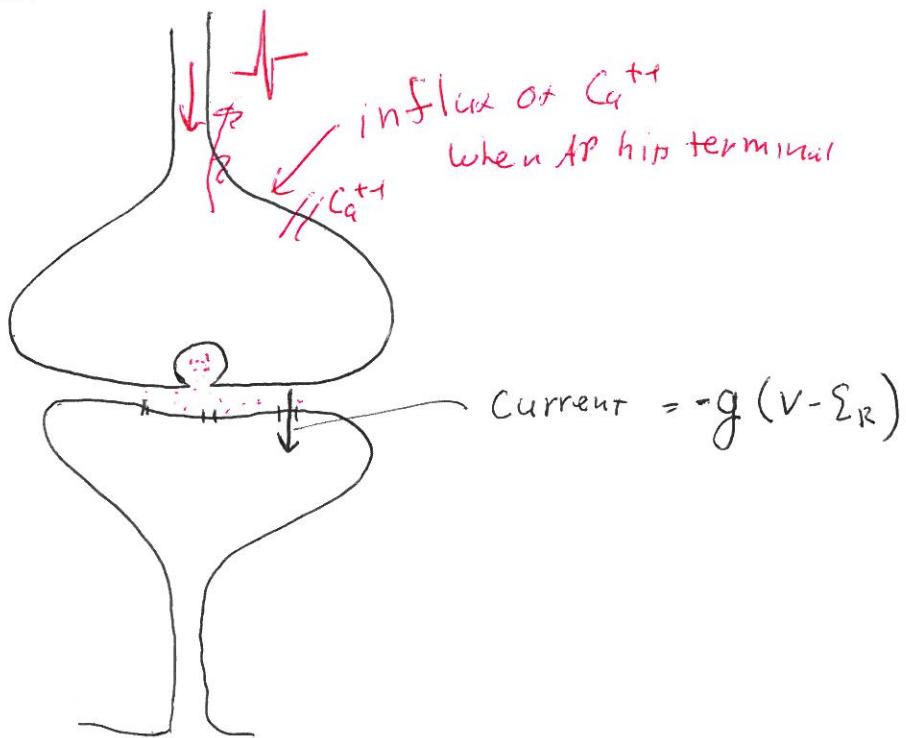
$$\frac{dw_{ij}}{dt} = ?$$



1. What determines time course of x_{ij} ? mention: facilitation, short + long-term potentiation
2. how does w_{ij} evolve (LTP, LTD, STDP)

① Quantitative model of synapse

③



- g depends on concentration [and sometimes voltage]
- Σ_r depends on [presynaptic neuron type (L vs H)]
[type of neurotransmitter released] ← approximately synonymous

Reversal Potential

Excitatory: AMPA
NMDA → glutamate receptors → channels are mix of Na^+ , K^+ , Ca^{++}

↑
named after antagonists

$\Sigma_r \approx 0 \text{ mV}$

Inhibitory GABA_A → GABA receptors → Cl^- channels

$$\Sigma_r = \begin{cases} -70 & \text{GABA}_A \\ -100 & \text{GABA}_B \end{cases}$$

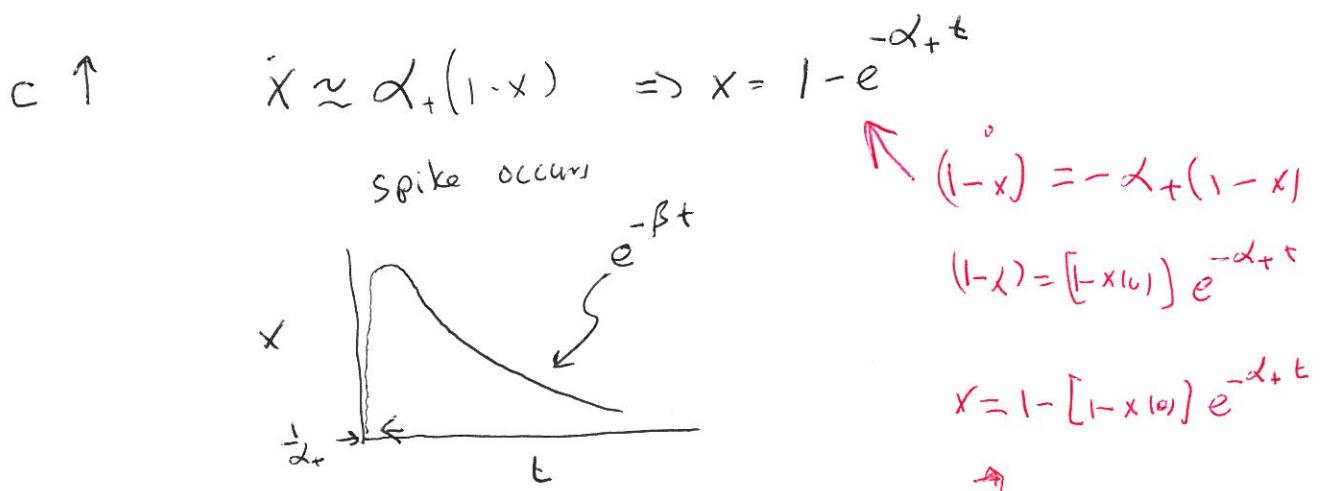
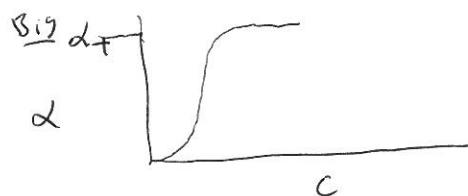
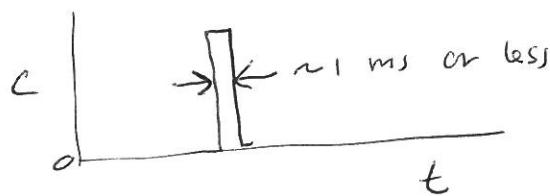
(4)

time course

$$\left. \begin{array}{l} \text{AMPA} \\ \text{GABA}_A \\ \text{GABA}_B \end{array} \right\} I_E = -\bar{g}x(V - \Sigma_R)$$

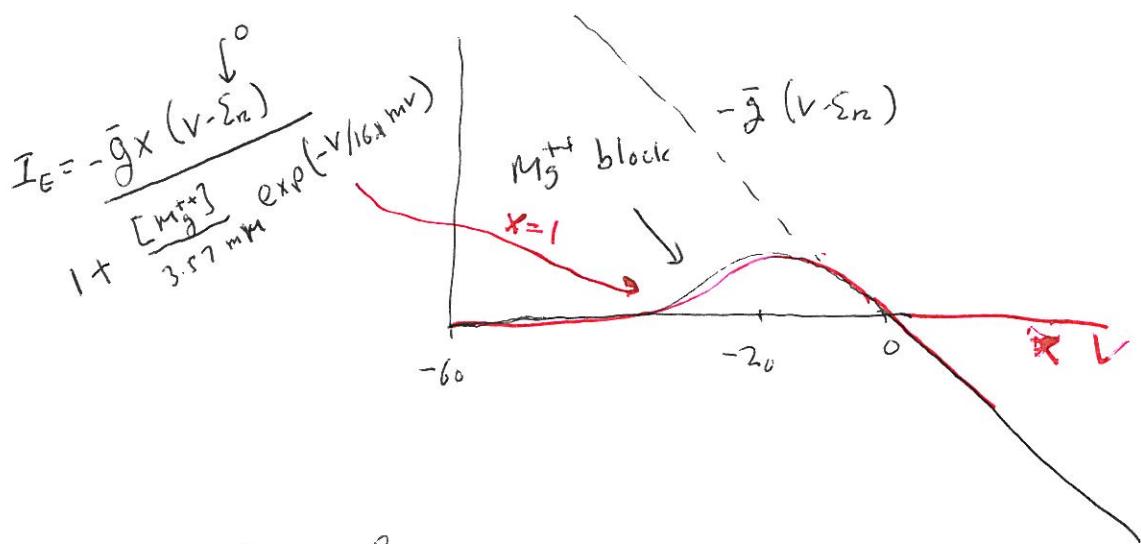
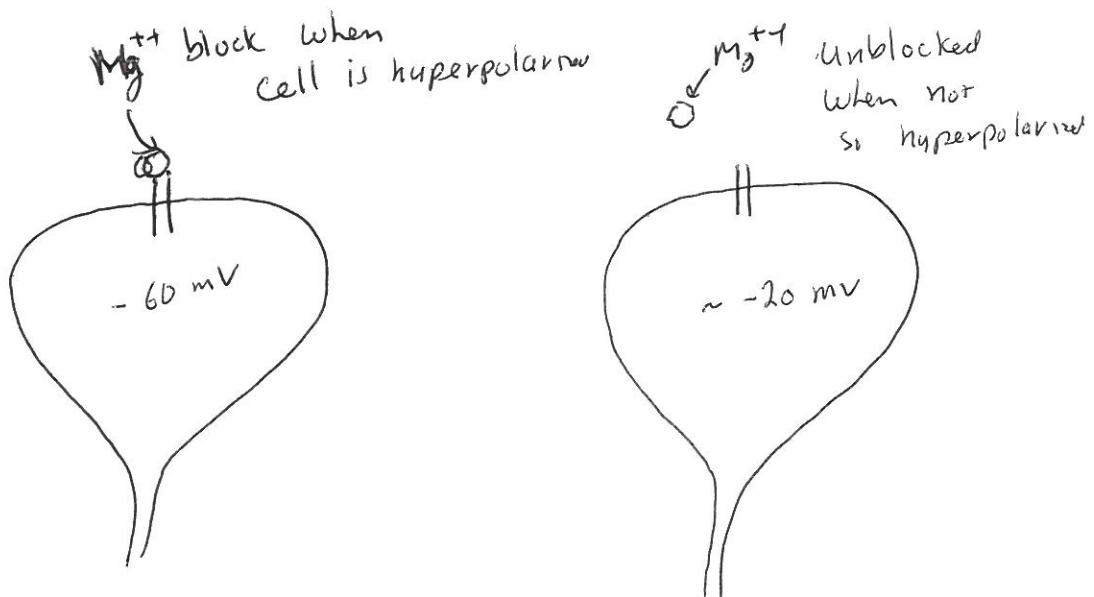
$$\dot{x} = \alpha(c)(1-x) - \beta x$$

↑ ↑
 dependence constant
 neurotransmitter
 concentration

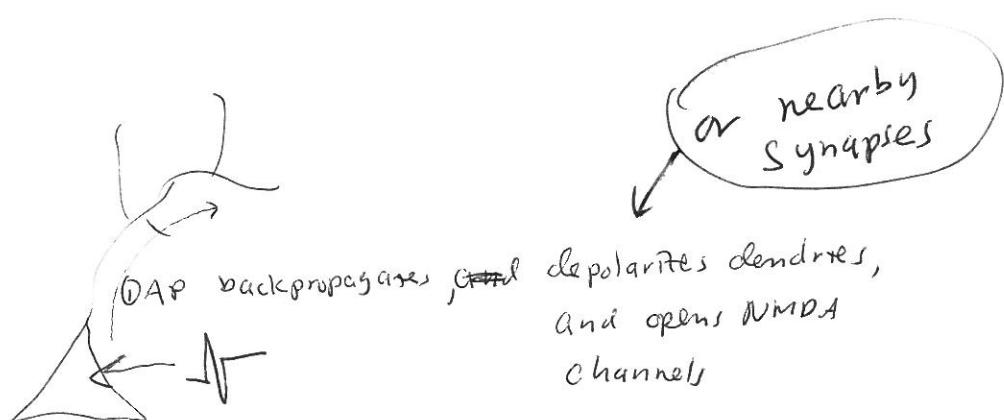


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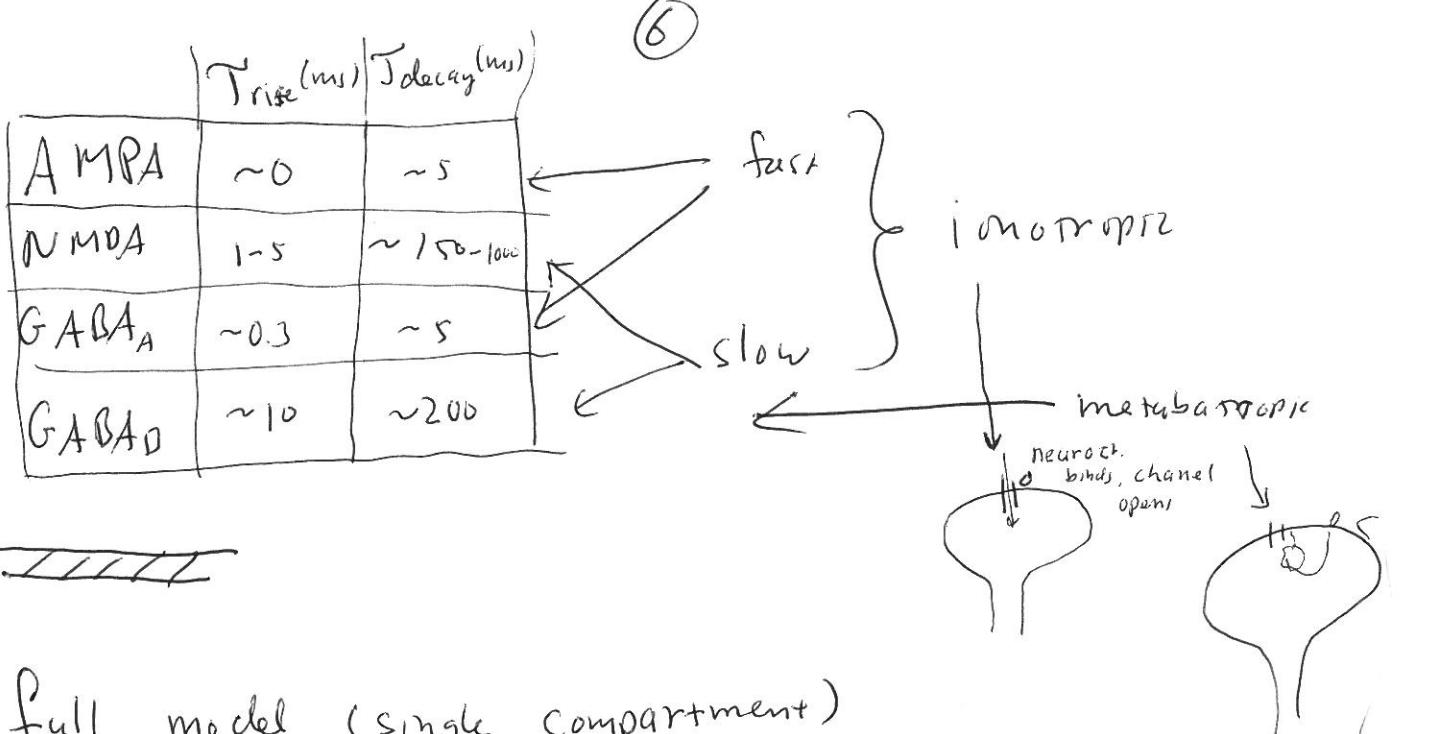
NMDA is different



Coincidence detector. Picture



- ② if another spike arrives near that time, there is Ca^{++} influx through NMDA channels, and that leads to long term plasticity.



full model (single compartment)

$$C \frac{dV_i}{dt} = -g_L(V_i - \varepsilon_i) - [\text{other active currents}]_{\text{inclusion}}$$

$$- \sum_j \bar{g}_{ij} x_{ij} (V_i - \varepsilon_j)$$

possibly divided by Mg^{++} term for NMDA

$$\dot{x}_{ij} = \alpha_x (1 - x_{ij}) \sum_k \delta(t - t_k^e) - \beta_x x_{ij}$$

instantaneous rise; could replace by square pulse

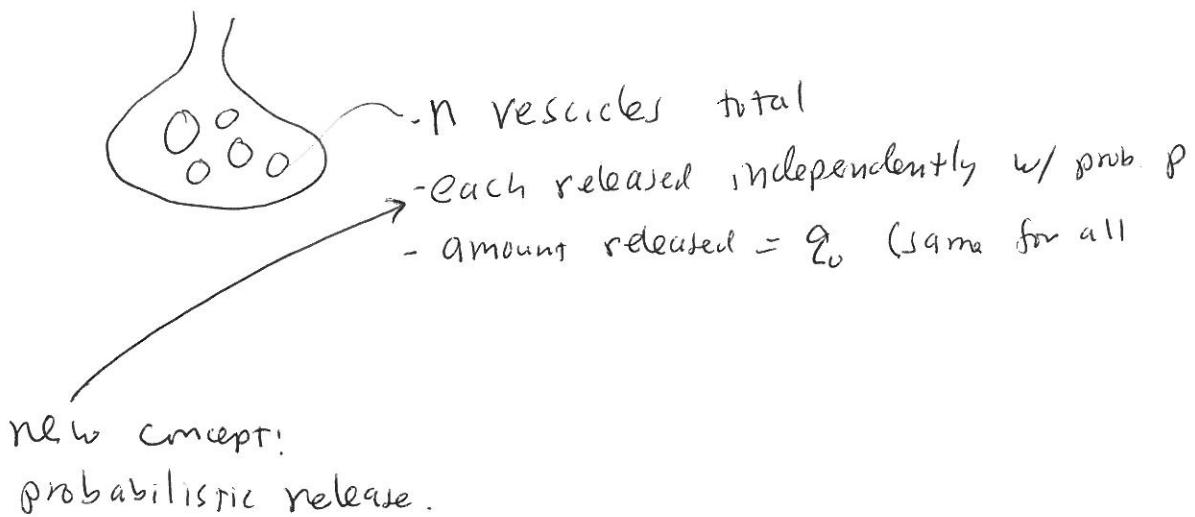
do a little math - pg. 11

- if we had a rule for how the \bar{g}_{ij} evolves w/ learning, we would have a complete model of the brain (sort of)

①

② What determines synaptic strength?

- quantal release (Key concept)



binomial

$$P(k) = p^k (1-p)^{n-k} \frac{n!}{k!(n-k)!} \quad [\text{motivate this}]$$

Average release: $q_0 \langle k \rangle$

~~variance~~ Standard dev : $q_0^2 [\langle k^2 \rangle - \langle k \rangle^2]$

$$\begin{aligned}
 \langle k^{\ell} \rangle &= \sum_{k=0}^{n^{\ell}} k^{\ell} p^k q^{n-k} \frac{n!}{k!(n-k)!} \\
 &= \sum_{k} k^{\ell} p^k q^{n-k} \left| \begin{array}{c} (n) \\ q=1-p \end{array} \right. \\
 &= \left(p \frac{d}{dp} \right)^{\ell} \sum_{k} p^k q^{n-k} \left| \begin{array}{c} (n) \\ q=1-p \end{array} \right. \quad [\text{take deriv first!}] \\
 &= \left(p \frac{d}{dp} \right)^{\ell} (p+q)^n \left| \begin{array}{c} \\ \text{cancel } p+q=1 \end{array} \right. \\
 \langle k \rangle &= p \frac{d}{dp} (p+q)^n \left| \begin{array}{c} \\ p+q=1 \end{array} \right. = np \\
 \langle k^2 \rangle &= \left(p \frac{d}{dp} \right) \left(p \frac{d}{dp} \right) (p+q)^n \\
 &= p \left[\frac{d}{dp} \frac{d}{dp} + p \frac{d^2}{dp^2} \right] (p+q)^n \\
 &= \left(p \frac{d}{dp} + p^2 \frac{d^2}{dp^2} \right) (p+q)^n \\
 &= np + p^2 n(n-1) \\
 \langle k^2 \rangle - \langle k \rangle^2 &= np + p^2 n(n-1) - np^2 \\
 &= np(1-p)
 \end{aligned}$$

$$\begin{cases}
 \langle q \rangle = q_0 np \\
 \langle \delta q^2 \rangle = q_0^2 np(1-p)
 \end{cases}$$

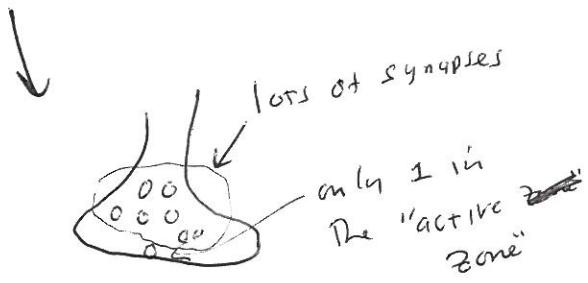
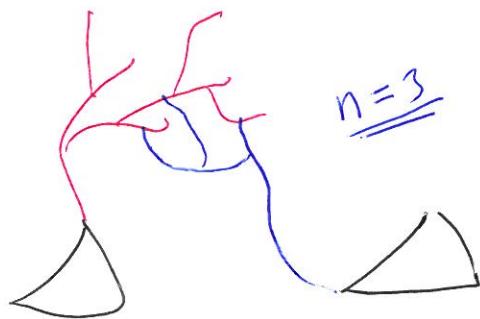
$q_0, n + p$ determine strength

(4)

NMT (neuromuscular junction), I_{cat}

$$n = 100 - 1000$$

Central synapses: $n = 1$ per synapse but



$$\langle P \rangle = 0.1 - 0.9$$

why is a total mystery

at central synapses,

brain can adjust:

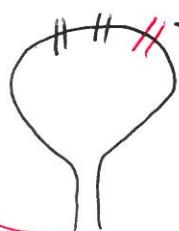
n (add or subtract synapses)

p (probability of release)

Θ [q_0 is typically fixed])

it can also adjust \bar{g} , typically by

"inverting" channel



AMPA channel
added due to
plasticity. "silent
synapse" hypothesis

-but typically
 $ME = 1$

(10)

③ How do weights change.

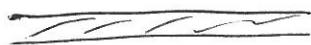
a) Short term

- affect only probability of release. two kinds:

1. Facilitation (AKA augmentation or potentiation) probably results from buildup of Ca^{++} (remember, Ca^{++} triggers release)

↑
slow
phase

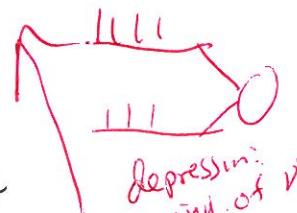
2. Depression probably results from a depletion of vesicles in the active zone.



eqns for P_{rel}

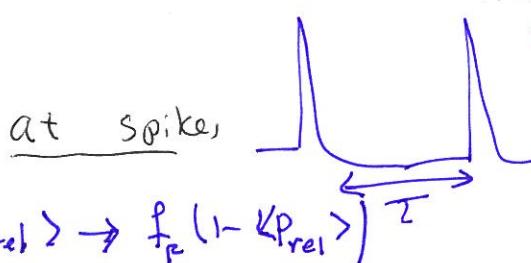
$$T \frac{dP_{\text{rel}}}{dt} = P_0 - P_{\text{rel}} + \left[\sum_i \delta(t-t_i) \right] \begin{cases} -\tau(1-f_F)P_{\text{rel}} & \text{depression} \\ +\tau f_F(1-P_{\text{rel}}) & \text{facilitation} \end{cases}$$

↑
spikes



between spikes:

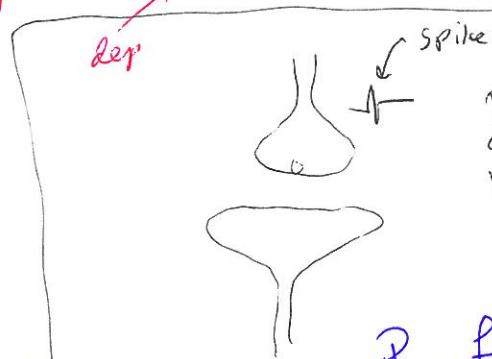
$$P_{\text{rel}}(t) = P_0 + [P_{\text{rel}}(0) - P_0] e^{-t/\tau}$$



$$\hat{P} = \frac{P_0 + \nu \tau f_F}{1 + \nu \tau f_F}, \quad \frac{P_0}{1 + \tau(1-f_F)}$$

\hat{P} is labeled "dep" (depression)

do both average
-change detection
(a la Larry Abbott)



prob. release is a function of history of presynaptic spikes

second spike

$$P_0 + (\langle P_{\text{rel}} \rangle + f_F(1-\langle P_{\text{rel}} \rangle) - P_0) e^{-\tau/\tau_p}$$

average over τ for $e^{-r\tau}$

$$\langle P_{\text{rel}} \rangle = P_0 + (\langle P_{\text{rel}} \rangle + f_F(1-\langle P_{\text{rel}} \rangle) - P_0) \frac{r\tau_p}{1+r\tau_p} \rightarrow P_{\text{rel}} = \frac{P_0 + f_F r \tau_p}{1 + r f_F \tau_p}$$

(11)

Math

$$\frac{dx}{dt} = f(x) + g(x) \delta(t - t_0)$$

$$x(t+dt) = x(t) + f(x) dt + \int_t^{t+dt} g(x) \delta(t-t_0) dt$$

$$t < t_0 < t+dt \Rightarrow \text{jump}$$

$$x(t+dt) \rightarrow x(t) + g(x) \underbrace{\int_1^t \delta(t-\tau) d\tau}_{1}$$

Ambiguous whether to use $g(x)$ before or after jump. For spikes, before jump.

at Spike

Facilitation:

$$P_{\text{pre}} \rightarrow P_{\text{pre}} + f_F (1 - P_{\text{pre}})$$

evaluated right before spike

Depression:

$$P_{\text{pre}} \rightarrow P_{\text{pre}} - (1 - f_D) P_{\text{pre}} = f_D P_{\text{pre}}$$

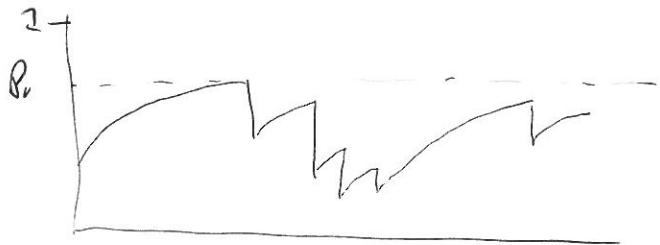
[In principle there should be ~~release~~ depression only if spike is released, but we'll ignore this]

transmitter

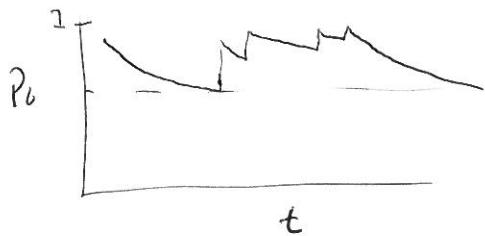
no spike if no transmitter
active

(12)

Repression



Facilitation



=====

Fitting parameters

$$\gamma \frac{dP_{\text{rel}}}{dt} = P_0 - P_{\text{rel}} + \gamma f_F (1 - P_{\text{rel}}) \sum_i \delta(t - \tau_i)$$

you ~~observe~~ know $P_0 + \gamma$

you observe $\{t_i\}$, $\{\mathbb{Z}_i\}$
 ↪ spike times ↪ whether or not there was
 a release.

What is ~~not~~ f_F ?

(13)

$$P(f_F | \{t_i, z_i\}) \propto P(\{t_i, z_i\} | f_F) P(f_F)$$

↑
ignm.
do mc

$$P(\{t_i, z_i\} | f_F) = \prod_i P_{\text{rel}}(t_i; z_i)$$

$$\prod_i P_{\text{rel}}(t_i; f_F)^{z_i} (1 - P_{\text{rel}}(t_i; f_F))^{1-z_i}$$

$P_{\text{rel}}(t_i; f_F)$ can be found by solving ODE.

Typically, maximize $\mathcal{L} = \log P(\{t_i, z_i\} | f_F)$

$$= \sum_i z_i \log P_{\text{rel}}(t_i; f_F) + (1-z_i) \log (1 - P_{\text{rel}}(t_i; f_F))$$

(3b) Long term plasticity

L T P
O n g e r m
D e p r e s s i o n

P can change

~~P~~

n can change (new/eliminated synapses. remember,
released synapses)

- \bar{g} can change

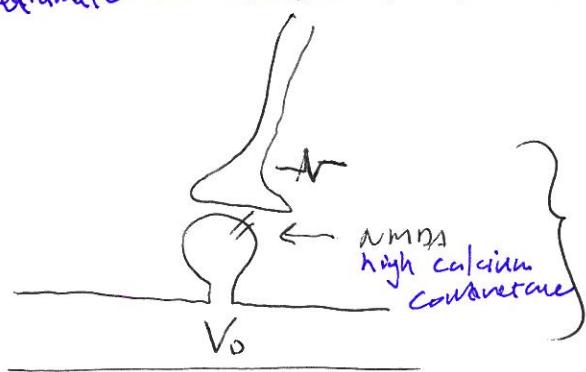
pre post. } long argument over which it was
answer: both

typically,

Change caused by Ca^{++} influx through NMDA

channel why → 1) increase in $[\text{Ca}^{++}]$ intracellular during stimulation
injecting Ca^{++} -buffer prevents
2) increasing $[\text{Ca}^{++}]$ by other means

(Most glutamate-sensitive cells express both NMDA & non-NMDA.



if spike arrives when
 $V_o > \sim -20 \text{ mV}$, (\rightarrow
then Mg^{++} block is gone),

UP-Regulation of AMPA

GluR1 tagged with GFP

Before stimulation
half spines

Synaptic strength changes

(either P or \bar{g})

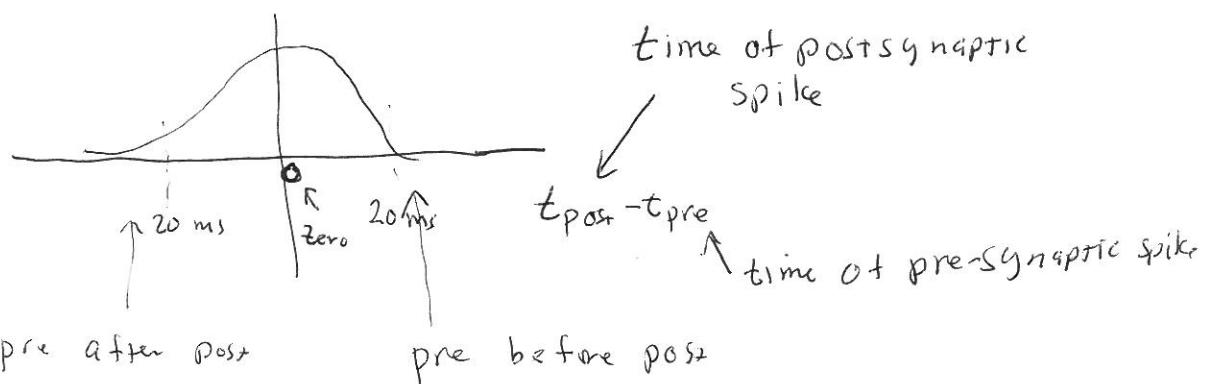
Current picture

NMDA $\rightarrow \text{Ca}^{++}$ influx $\rightarrow \text{CaMKII}$
 \rightarrow AMPA inserted

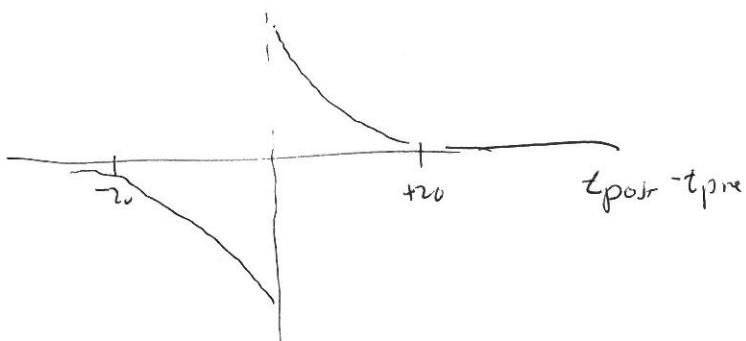
(15)

Mossy fibers of Dentate
 \rightarrow CA3
 Presynaptic LTP

Weight change, Δw , depends on timing
 of pre and post-synaptic spikes,

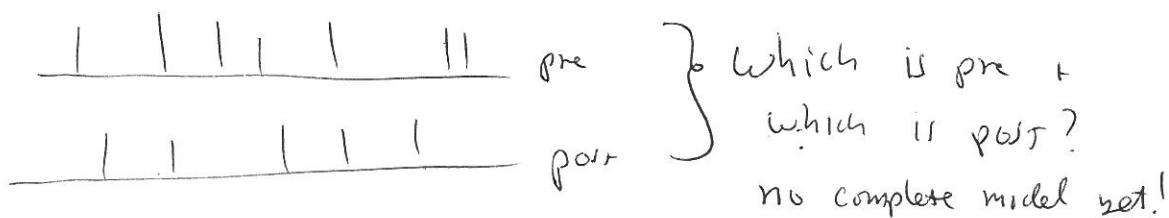
Hebb

STDP



- both are unstable unless a normalization rule is applied.

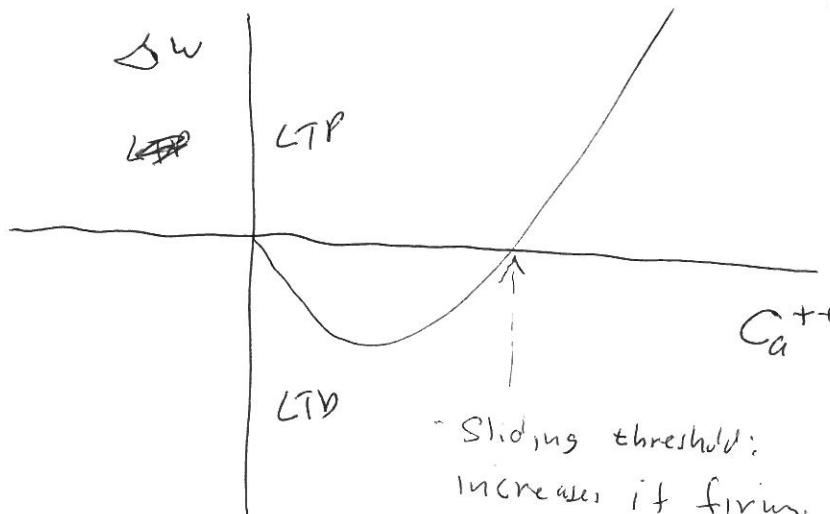
Situation is more complicated



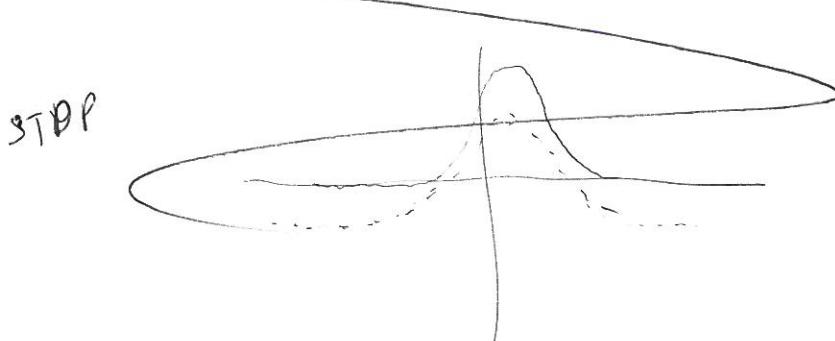
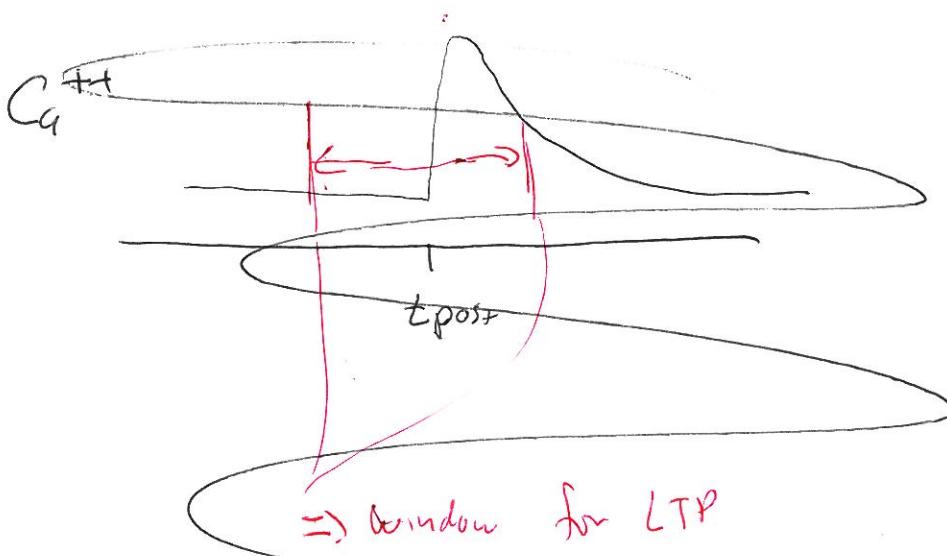
(16)

Normalization: BCM

(BCS: Bapoleen Cooper - nobel prize
 for superconductivity
 Schrieffer
 look up!)



- Sliding threshold:
increases if firing rate of cell is too high
- Some experimental evidence
- doesn't account for STDP



(17)

