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Oct. 8, 2004

Oct. 4, 2005

- Skills development points:
need to sign by sleep

- name /email
Q's name /email

~~format~~

review session: Friday 2-3, here

- ~~home work~~

- reading: now on the web ... /courses

- homework: assigned ^{Tue} ~~Fri~~ 20% of grade on website

- class: 11-1 w/ 10
min break around
12. please ask lots
of questions

- main textbook: "theor. neuro," dayan + abbot

- prerequisites: math math math, physics $v=ix = \omega L$, $v = \int \omega^2 dt$
Calculus (ODE's), linear algebra,
probability theory ^{9 prob's}, integrals, derivatives

(see also website)

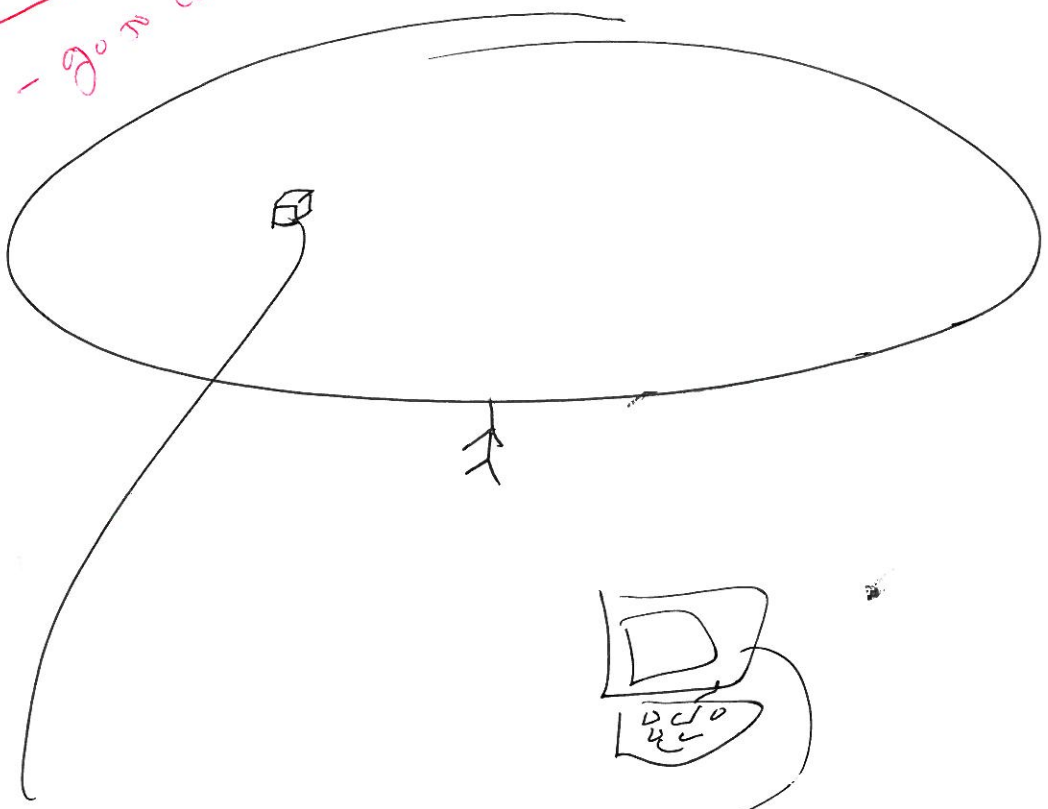
... ~ zoubin/course ⁵ ... look for "cribsheet"



Next: outline

Now on slides
 - go to course outline

(2)



$\text{mm}^3 (\approx 3 \cdot 10^5 \text{oz})$

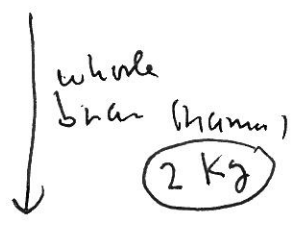
50 thousand neurons
 ~5000 connections/neuron

\Rightarrow 250 million connections
 4 km axons

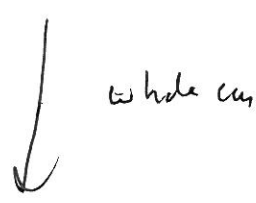
mm^2

1 million transistors
 ~? 2 connections/transistor

2 m of wires



10^{11} neurons
 $5 \cdot 10^{14}$ conn
 84 million km of axons
 (10x times so man + br)



1 billion transistors
 2 km of wire
 (not enough to reach to
 top of reasonable size mountain)

input neurons: $\sim 10^6$
 output neurons: $\sim 10^6$

the brain mainly talks to itself!!! \leftarrow 80-90% of connections local

Outline of course

1. building blocks: single neurons/axons/dendrites/synapses Lat
2. language of neurons: neural coding
3. what we know about networks of neurons
+ how they compute (very little) Manish Sahani
Liam Paninski
KPF
4. learning at network & behavioral level Peter Dayan

Final exam ~~is~~ ~~at~~ ~~the~~ ~~end~~? (ask Peter)

What you will learn
- Comput

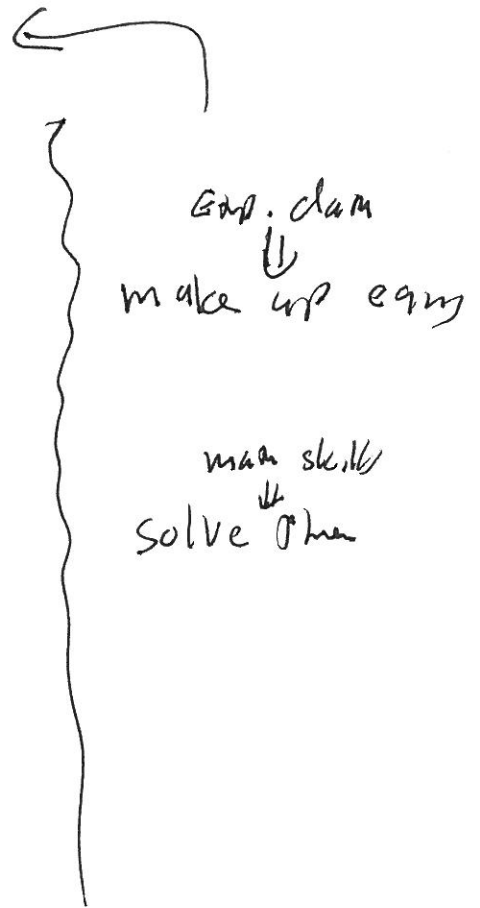
What you will learn:

- computational aspects

→ single neurons
networks (a little)

What you will learn:

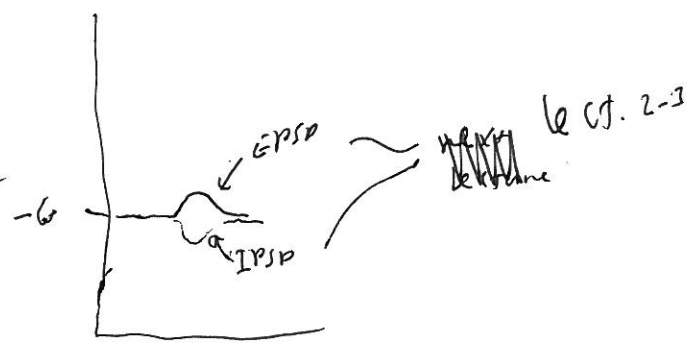
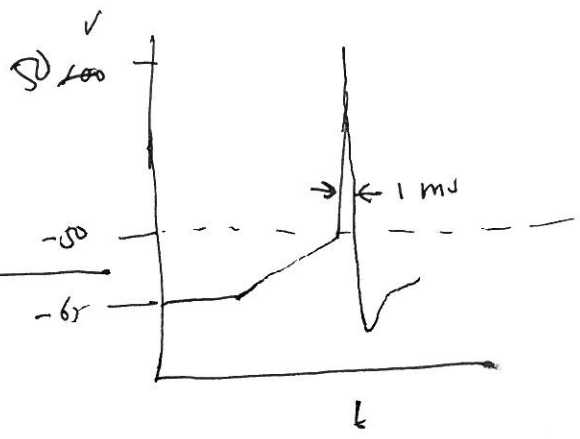
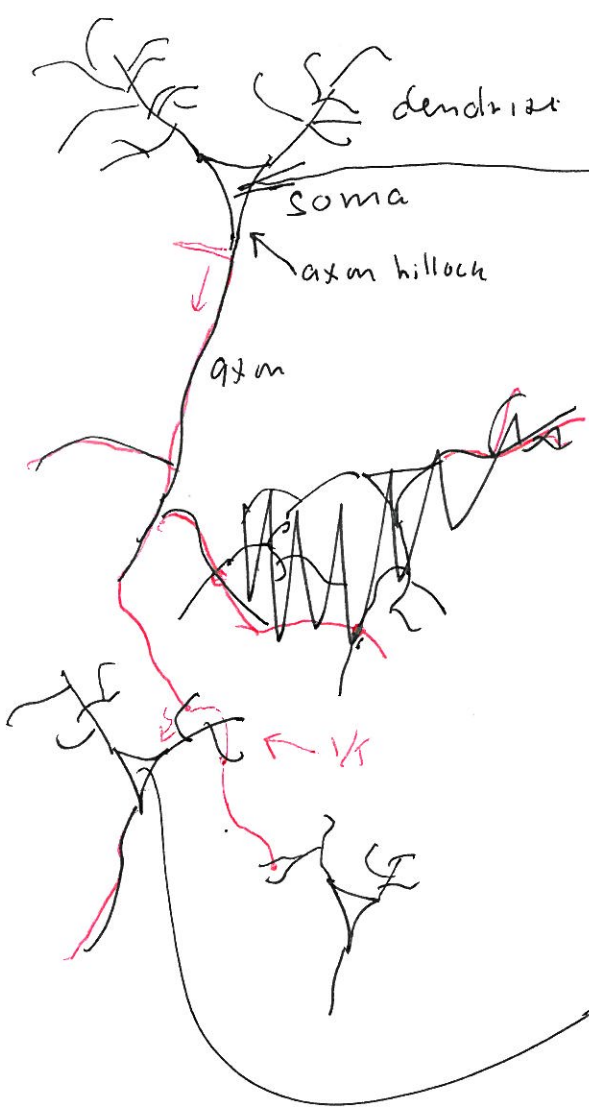
- ~~experiment~~
- anatomy.
- experimental facts.



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Jump

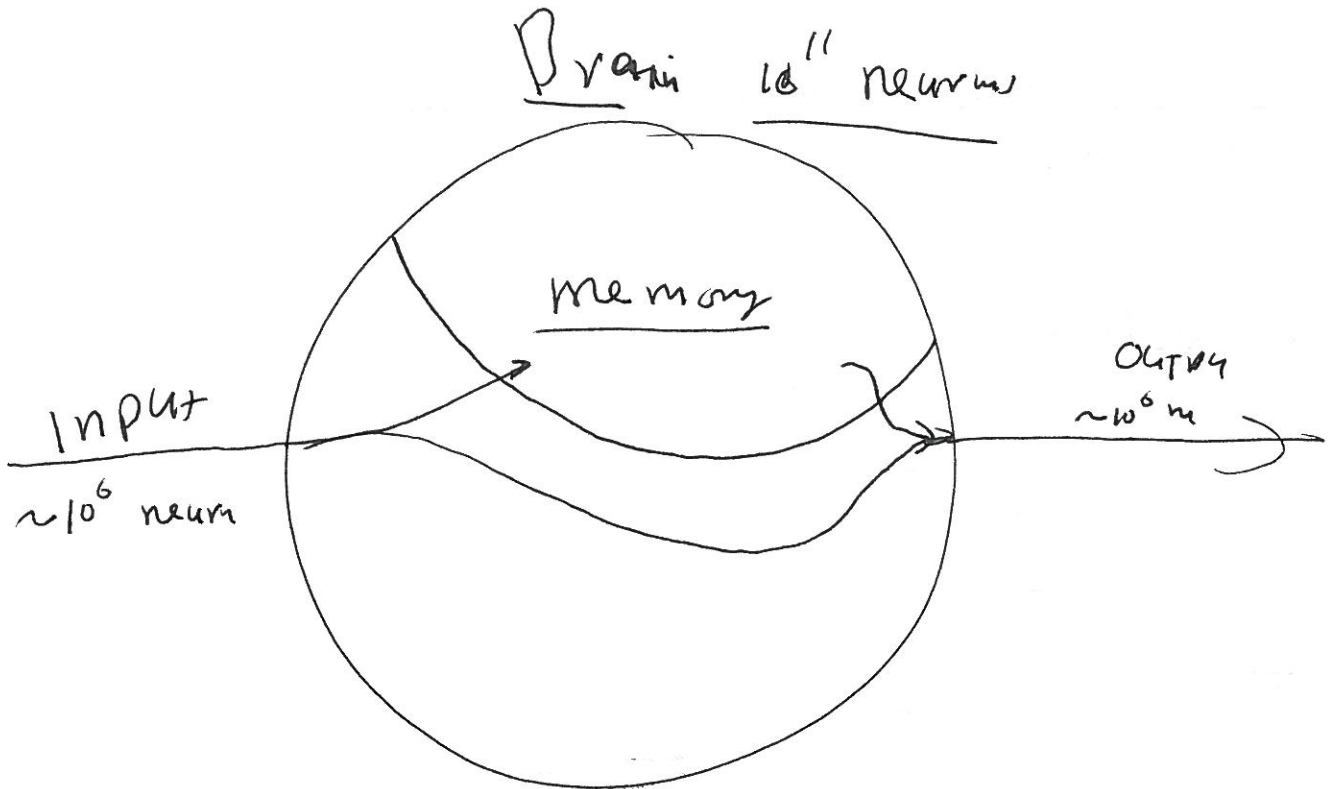
Single neuron



Why spikes?

1. long distance
2. other reasons

rewrite + sample in



How does this thing work?

- what we know think.

1. brain is divided into different areas which do different things. (memory) (~~store info~~)
2. processing is done by neurons (we think)
3. learning / memory involves adjusting synaptic strength (we think)

~~4. face + too of little faces.~~

- Have to do experiments.

- Can control inputs

- Can measure outputs

- Can record from neuron (only at most, 100 at most, typically 1)

Models one may build

$$\# X_i(t+\delta t) = \begin{cases} 1 & V_i > \theta \\ 0 & \text{or } V_i \leq \theta \end{cases} \quad \begin{array}{l} \text{(spike)} \\ \text{(no spike)} \end{array}$$

$$V_i = \sum_j W_{ij} X_j(t)$$

- if one chooses W 's correctly, you will get a function brain
 problem: most of what the brain does we don't know how to do

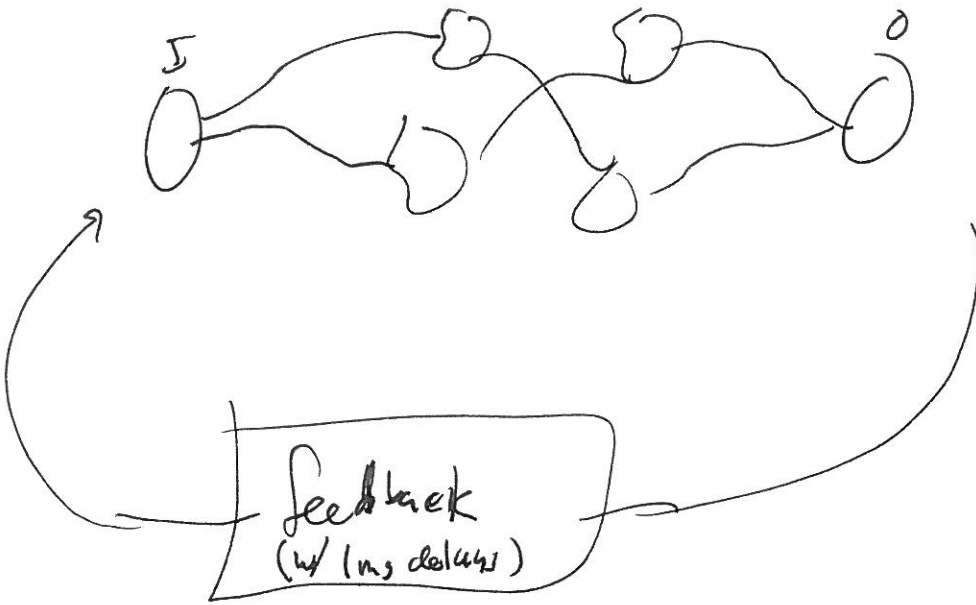
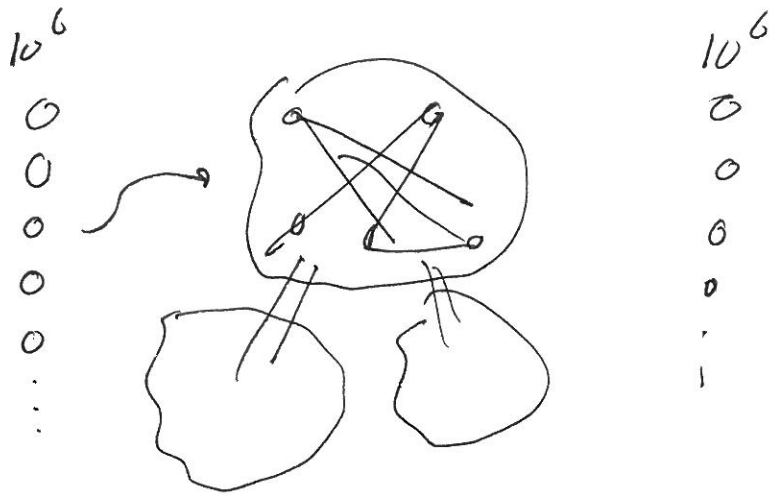
~~$$\frac{dW_{ij}}{dt} = f(X_i, X_j)$$~~

$$W_{ij}(t+\delta t) = f(X_i, X_j)$$

- if you choose f correctly, you'll get a function brain.

problem: ~~success has been limited.~~
credit assignment

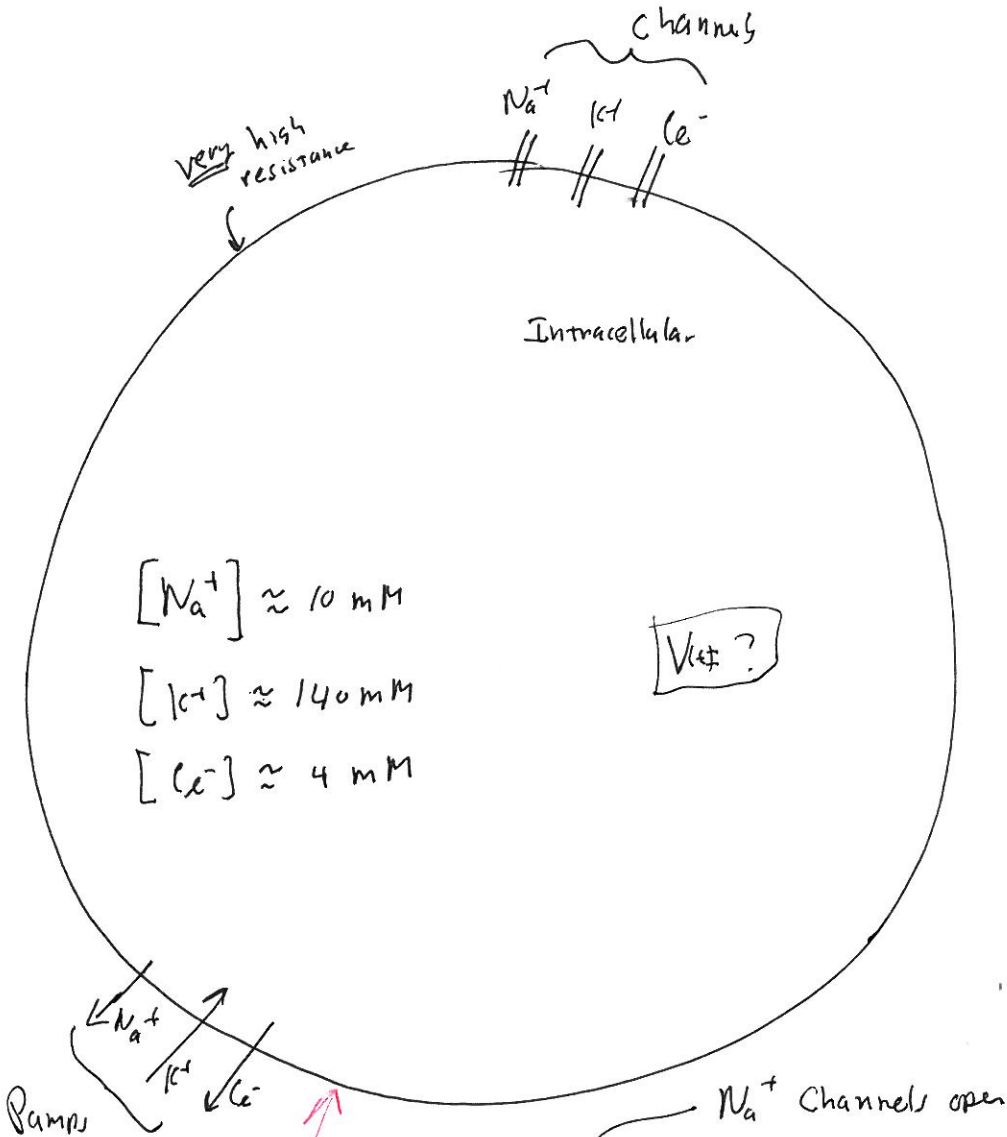
for 10^6 possible
writing it.



- credit assignment problem!

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What makes a neuron spike?



Extracellular

$$[Na^+] \approx 145 \text{ mM}$$

$$[K^+] \approx 5 \text{ mM}$$

$$[Cl^-] \approx 110 \text{ mM}$$

$$[Na^+] \approx 10 \text{ mM}$$

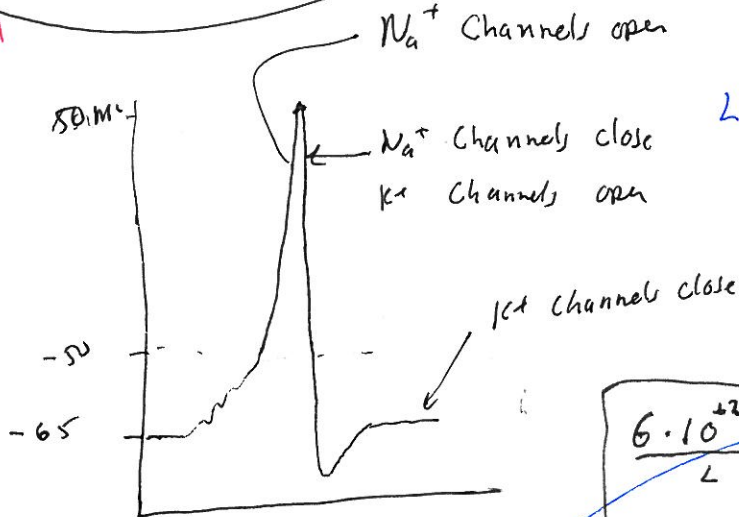
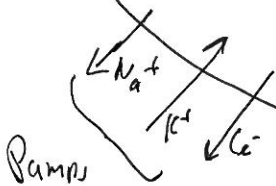
$$[K^+] \approx 140 \text{ mM}$$

$$[Cl^-] \approx 4 \text{ mM}$$

$V_m?$

$$V = 0$$

Very few ions needed to change voltage - so concentration doesn't change much



$$N = 10^6 \Rightarrow 1.6 \text{ nM}$$

$$V = \frac{N \cdot e \cdot \epsilon_0}{C \cdot R} = \frac{N \cdot 1.6 \cdot 10^{-19} \cdot 8.85 \cdot 10^{-12}}{10^{-3} \cdot 10^{-2}} = \frac{N \cdot 1.6 \cdot 10^{-30}}{10^{-5}} = N \cdot 1.6 \cdot 10^{-25}$$

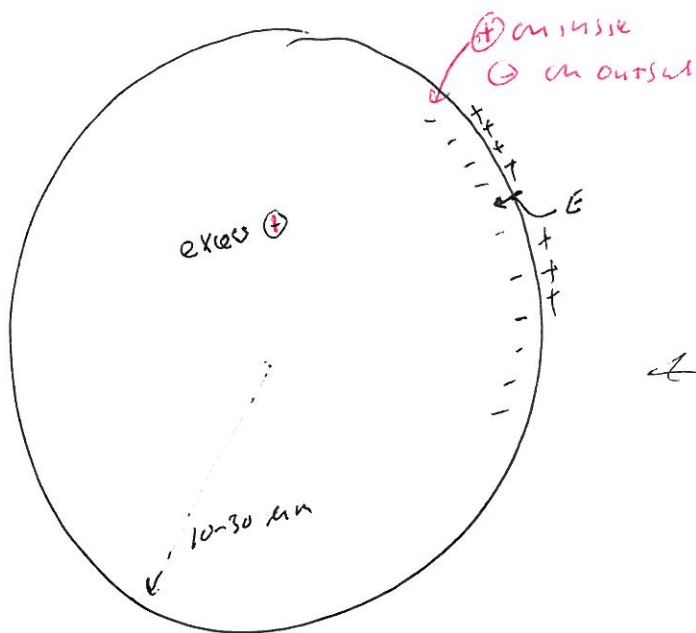
$$\frac{6 \cdot 10^{23}}{10^{24}} \cdot 10^{-3} = 6 \cdot 10^{-4} = 6 \cdot 10^5$$

Key point: Current is a function of voltage

Can we find $V(t)$?
Given external current?

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Key point: Current is a function of voltage



$E \propto Q$ $V = \int E \cdot dr = E \cdot r \quad \begin{matrix} \swarrow \\ 5 \text{ nm} \end{matrix} \quad \Rightarrow \quad \underline{E = \frac{V}{\epsilon r}}$

$V \propto \frac{Q}{\epsilon r}$

$V \equiv \frac{Q}{C}$

capacitance = $100 \frac{\mu\text{F}}{\text{cm}^2} = \frac{10 \text{ nF}}{\text{mm}^2}$ X area

$\frac{dv}{dt} = \frac{1}{C} \frac{dq}{dt} = \frac{-I(+)}{C}$ goal: find $I(t)!!!$

[Find I vs. V , so we can solve the differential equation]

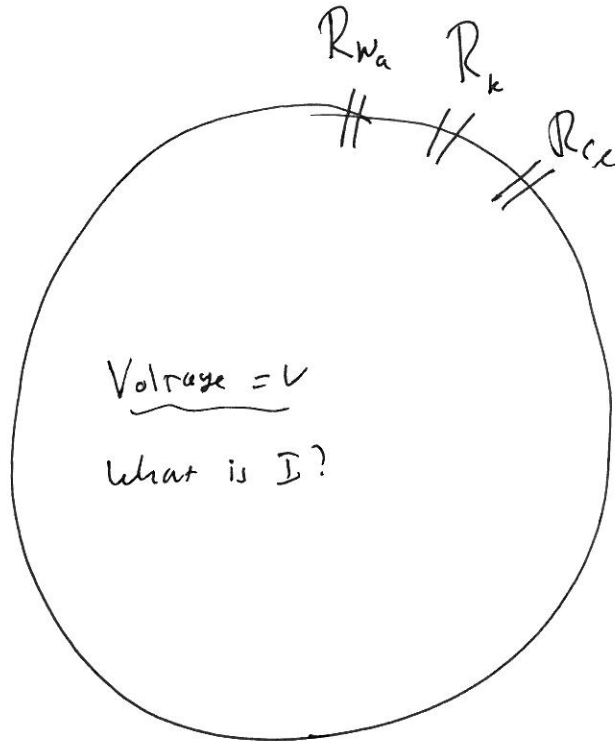
Me

Convention

(7)

Passive properties

R independent of voltage



Assume: pumps keep concentrations fixed

influx doesn't
change concentration

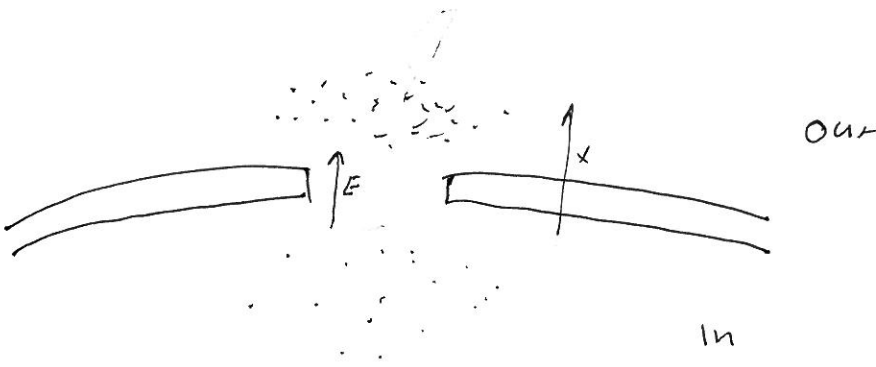
Guess #1

$$I = +\frac{V}{R_A} + \frac{V}{R_k} + \frac{V}{R_{ce}}$$

Wrong!!!

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Concentration gradients



$$J_{inward} \propto q [c] \frac{\partial V}{\partial x} - \frac{\partial [c]}{\partial x}$$

A trick: how big a voltage drop would you need to reduce current flow to zero?
 $\Delta V =$ voltage drop, then current associated w/ difference in densities is $\frac{\Delta V}{n}$

SKIP

also:
$$I \propto q [c] E - D \frac{d(c)}{dx}$$

\downarrow
 $\frac{V}{x}$

next page

$$I \propto \text{---} () V \text{---}$$

$$() [c] V - D \frac{d(c)}{dx}$$

to 1st order approx

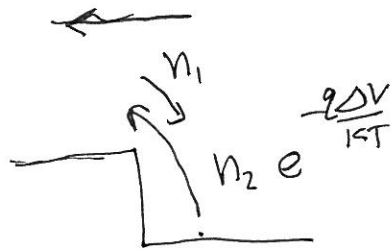
$\Rightarrow I = I(V)$; nonlinear, Mark

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Another cheap ~~trick~~ trick:



$$v_1 > v_2$$
$$q > 0$$

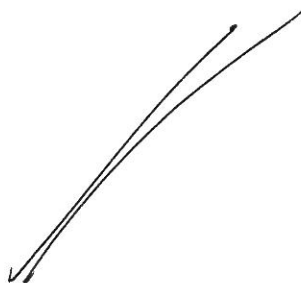


$$n_1 = n_2 e^{-\frac{q\Delta V}{kT}}$$

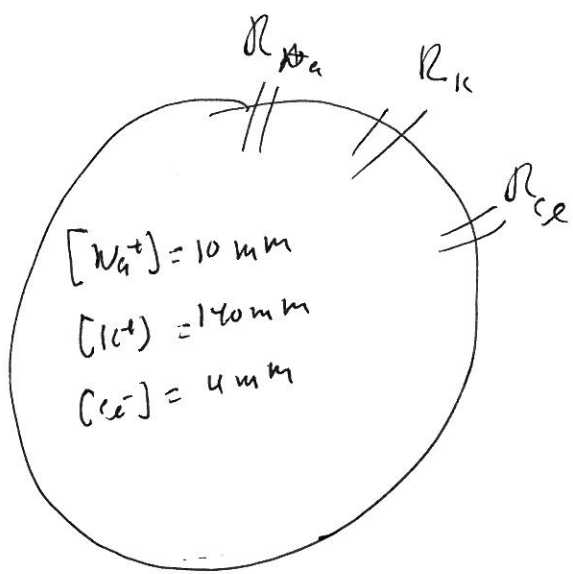
$$\log \frac{n_1}{n_2} = -\frac{q\Delta V}{kT}$$

$$\Delta V = \frac{kT}{q} \log \frac{n_2}{n_1} \equiv \mathcal{E}$$

$$\mathcal{I} = \frac{\Delta V}{R}$$



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$[Na^+] = 145 \text{ mM}$
 $[K^+] = 5 \text{ mM}$
 $[Ce^-] = 110 \text{ mM}$

but really
 minimum

$$\begin{aligned}
 I &= + \frac{(V - E_{Na})}{R_{Na}} + \frac{(V - E_{K})}{R_{K}} + \frac{(V - E_{Ce})}{R_{Ce}} \\
 &= + \bar{g}_{Na} (V - E_{Na}) + \bar{g}_{K} (V - E_{K}) + \bar{g}_{Ce} (V - E_{Ce}) \\
 &= + \underbrace{(\bar{g}_{Na} + \bar{g}_{K} + \bar{g}_{Ce})}_{\bar{g}_L} V + \underbrace{(\bar{g}_{Na} E_{Na} + \bar{g}_{K} E_{K} + \bar{g}_{Ce} E_{Ce})}_{\bar{g}_L E_L} \\
 &= + \bar{g}_L (V - E_L)
 \end{aligned}$$

(11)

$$\Sigma_{Na} = \frac{KT}{q} \log \frac{145}{10} \approx 100 \text{ mV}$$

$$\Sigma_{K} = \frac{KT}{q} \log \frac{5}{140} \approx -90 \text{ mV}$$

$$\Sigma_{Cl} = -\frac{KT}{q} \log \frac{110}{4} \approx -70 \text{ mV}$$



$$C \frac{dv}{dt} = -g_L (v - \Sigma_L)$$

$$\frac{C}{g_L} \sim \text{time} \equiv \tau \approx 5-10 \text{ ms}$$

$$\tau \frac{dv}{dt} = - (v - \Sigma_L)$$

Solve ~~the~~ the ~~lous~~ $\tau \dot{x} = -x$
way: math $\left(\tau e^{-\frac{t}{\tau}} \frac{d}{dt} e^{+\frac{t}{\tau}} x = 0 \right)$

1) $v(0) = v_0$

2) add $I(t)$ term

$$\frac{d}{dt} [e^{\frac{t}{\tau}} x] = 0$$

$$e^{\frac{t}{\tau}} x(t) = x(0) \cdot \tau$$

$$x(t) = x(0) e^{-\frac{t}{\tau}}$$

↑
repeat w/ I_{stim}

$$\Rightarrow v - \Sigma_L = (v_0 - \Sigma_L) e^{-\frac{t}{\tau}} + \int_0^t dt' e^{-\frac{t-t'}{\tau}} (v(t') - \Sigma_L)$$

$$= \int_0^t dt' e^{-\frac{(t-t')}{\tau}} (v(t') - \Sigma_L)$$

$$= \int_0^t ds e^{-\frac{s}{\tau}} (v(t-s) - \Sigma_L)$$

Discuss LIF! point out difficulty of ~~dealing~~ dealing analytically w/ threshold

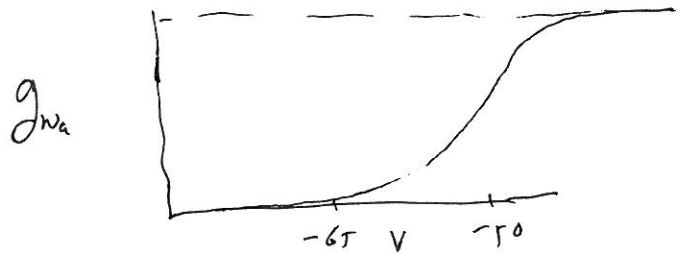
(12)

Active conductance

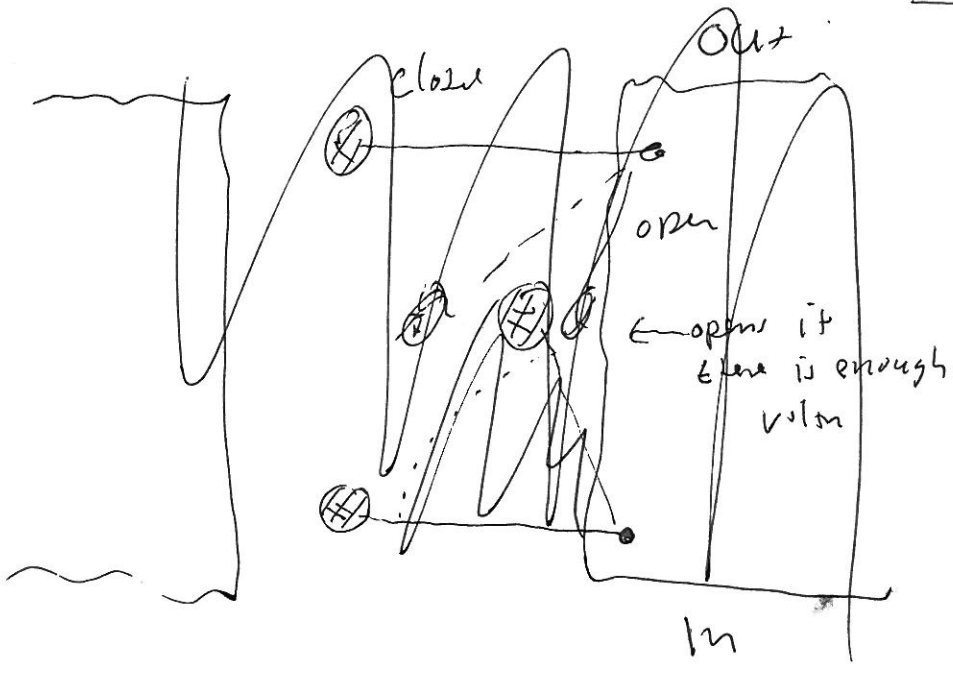
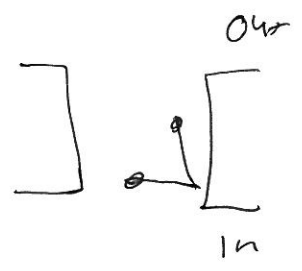
channels come in 2 types: active + passive

$$C \frac{dv}{dt} = - \bar{g}_L (v - E_L) - g_{Na}(v) (v - E_{Na}) - g_{Kc}(v) (v - E_{Kc})$$

↑
~100 mV



but life is more complicated !!!



(13)

- lots of channels!!

$m = \overset{\text{prob}}{\#}$ of ~~open~~ N_a channel being open

$\alpha(v) =$ prob. of closed channel opening

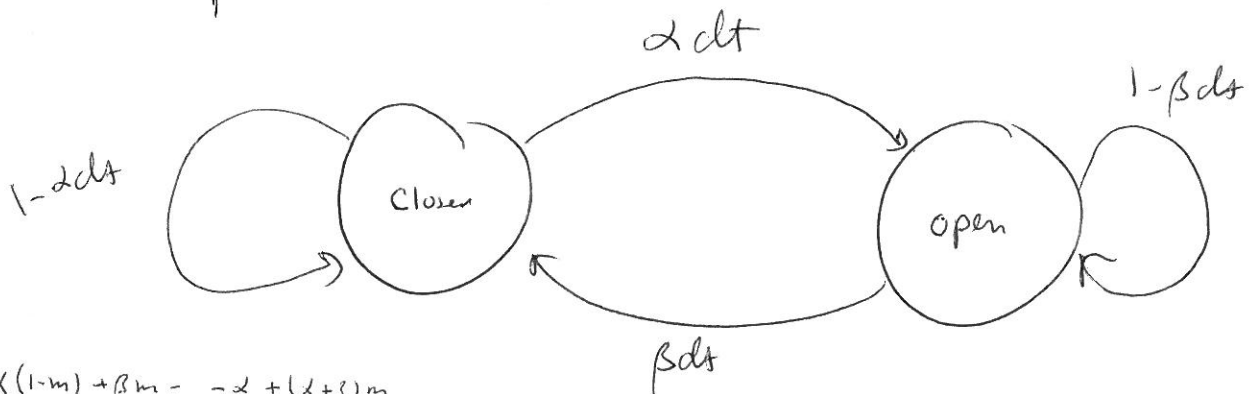
$\beta(v) =$ " " " " open ~~at~~ " closing
per unit time

$$\begin{aligned} \frac{dm}{dt} &= \alpha(v)(1-m) - \beta(v)m \\ &= \alpha(v) - [\alpha(v) + \beta(v)]m \end{aligned}$$

$$\tau(v) \frac{dm}{dt} = m_{\infty}(v) - m$$

$$\tau(v) = \frac{1}{\alpha(v) + \beta(v)}$$

$$m_{\infty}(v) = \frac{\alpha(v)}{\alpha(v) + \beta(v)}$$



$$\dot{C} = -\alpha(1-m) + \beta m = -\alpha + (\alpha + \beta)m$$

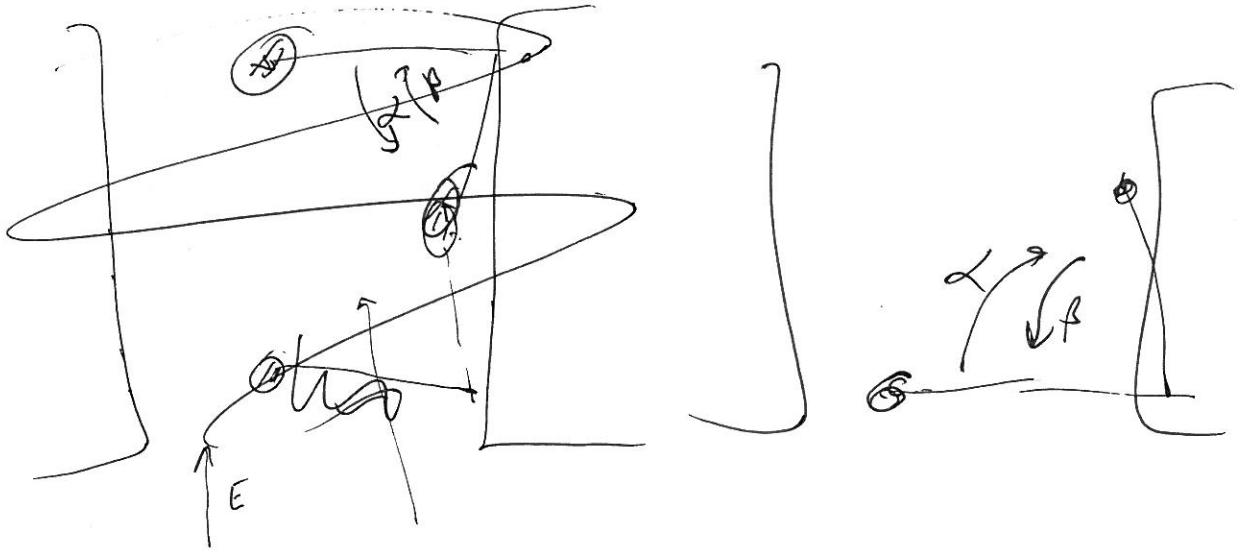
$$m(t+dt) = m(t)(1-\beta dt) + \overset{1-m(t)}{C(t)} \alpha dt$$

$$C(t+dt) = C(t)(1-\alpha dt) + m(t) \beta dt$$

$$m(t+dt) = m(t) - (\alpha + \beta)m(t) + \alpha(t)$$

$$\dot{m} = \alpha - (\alpha + \beta)m$$

(13) (14)



drop

voltage gain



$$\alpha = A_2 e^{-\frac{qE_2 V}{kT}}$$

$$f = A_f e^{\frac{qE_f V}{kT}}$$

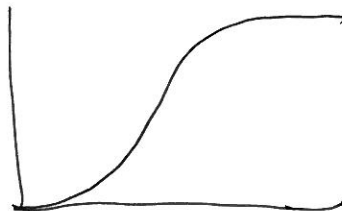
$$m_{\omega} = \frac{\phi \cdot 1}{1 + \frac{q(V_f) B(\omega)}{kT}}$$

$$V \rightarrow +\infty$$

$$m_{\omega} \rightarrow 1$$

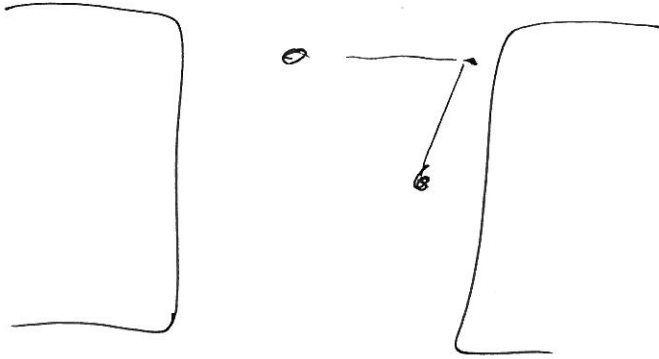
$$V \rightarrow -\infty$$

$$m_{\omega} \rightarrow 0$$

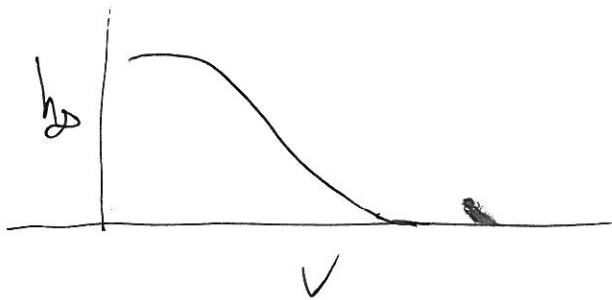


(14) (15)

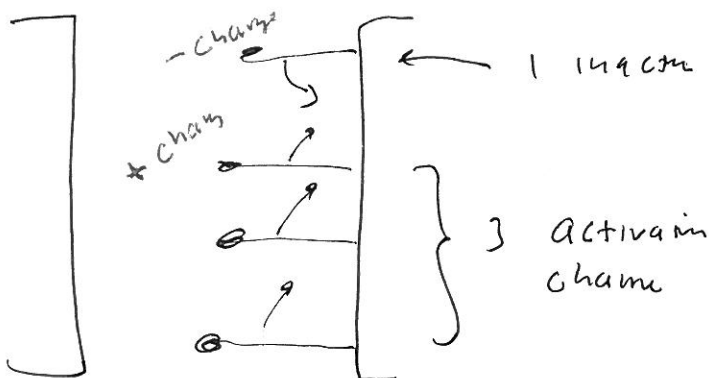
$a \rightarrow b$
twist #1



$$\int_h^{\infty} \nu(\nu) \frac{dh}{d\nu} = h_{\text{obs}}(\nu) - h$$



twist #2: multiple ~~at~~ sites

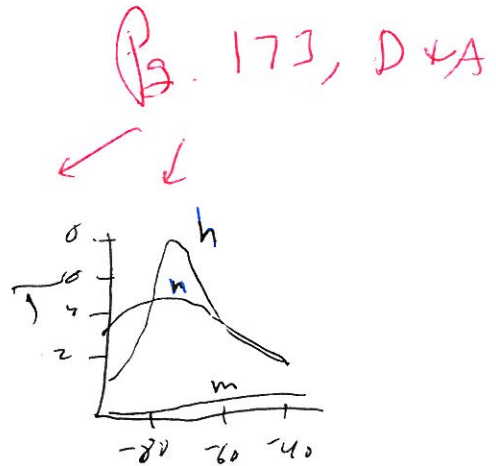
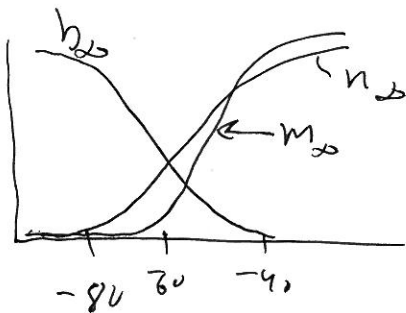


(18)

twist #3:

$$g_{Na}(v) = \bar{g}_{Na} m^3 h$$

$$g_K(v) = \bar{g}_K n^4$$



$$C \frac{dv}{dt} = -\bar{g}_L (v - E_L) - \bar{g}_{Na} m^3 h (v - E_{Na}) - \bar{g}_K n^4 (v - E_K)$$

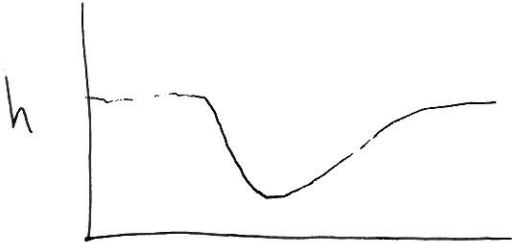
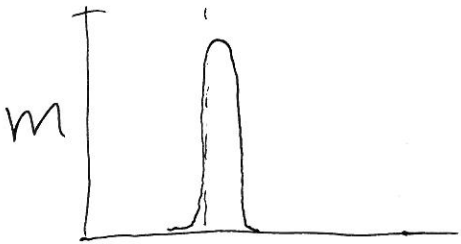
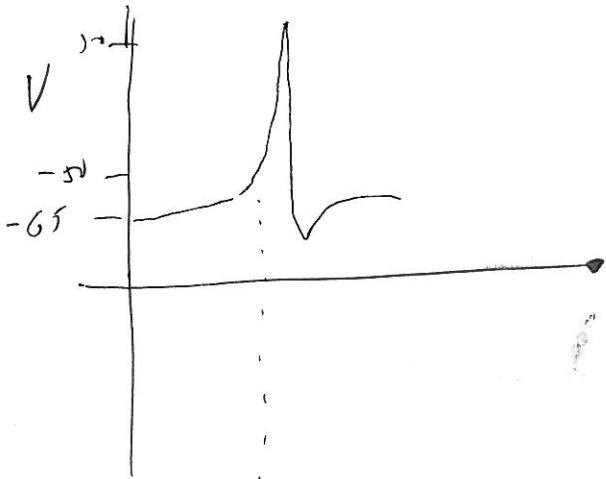
-65 mV
100 mV
-90 mV

$$\tau \frac{dx}{dt} = - (x - X_\infty) - \bar{g}_{Na} m^3 h (v - E_{Na}) - \bar{g}_K n^4 (v - E_K)$$

$$x = m, n, h \quad : \quad \tau_x(v) \frac{dx}{dt} = X_\infty(v) - x$$

Hodgkin Huxley

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(12)

