



# Mathematical Foundations of Neuroscience -Lecture 3. Electrophysiology of neurons continued

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Winter 2009/2010



Currents Resting potential Conductances



## Short summary

- We know from elsewhere that in the steady state equilibrium the total current across the membrane is  $I_{total} = 0$ .
- We know the Nerst potentials of lons, we only need to know the respective conductances to get the equation:

$$C\frac{dV(t)}{dt} = I(t)_{\text{total}} - I_{Na} - I_{K} - I_{CI} - I_{Ca}$$

running and find out what is the steady state membrane voltage.

• Sadly this is where the neuronal story begins...

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#### Equivalent circuit



Figure: Electrical circuit equivalent to a patch of neuronal membrane.



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## Resting potential

- At what level the Voltage across the membrane is in equilibrium? That is to say when is  $\frac{dV}{dt} = 0$  ?
- It is easy to see, that if there were only one ionic current (e.g. sodium) the resting potential would be equal to its Nerst potential

$$0 = \frac{dV}{dt} = -I_{Na} = -g_{Na}(V - E_{Na})$$

since  $g_{Na} \neq 0$  it follows that  $V_{\text{rest}} = E_{Na}$ 

• But there are unfortunately more currents.

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## Resting potential

• We can solve the equation

$$Crac{dV(t)}{dt} = I(t)_{ ext{total}} - I_{Na} - I_{K} - I_{CI} - I_{Ca}$$

by setting  $\frac{dV(t)}{dt}$  and I(t) to zero. We then come up with a solution

$$V_{\text{rest}} = \frac{g_{Na}E_{Na} + g_{Ca}E_{Ca} + g_{K}E_{K} + g_{Cl}E_{Cl}}{g_{Na} + g_{Ca} + g_{K} + g_{Cl}}$$

 It is easy to verify that V<sub>rest</sub> indeed satisfies the equation. Note that V<sub>rest</sub> is a weighted (by conductances) average of all equilibrium potentials!



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#### Conversely the equation

$$C\frac{dV(t)}{dt} = I(t)_{\text{total}} - I_{Na} - I_{K} - I_{CI} - I_{Ca}$$

can be expressed

$$C\frac{dV(t)}{dt} = I(t) - g_{\rm inp}(V - V_{\rm rest})$$

where  $g_{inp} = g_{Na} + g_{Ca} + g_K + g_{Cl}$ . The quantity  $R_{inp} = \frac{1}{g_{inp}}$  is called the input resistance. It follows that

$$V 
ightarrow V_{
m rest} + IR_{
m inp}$$

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#### Ionic conductances

- So if we have the equations, we only need to get the conductances and were done!
- Unfortunately the ionic conductances are the source of neuronal excitability and various behaviors!
- Conductances are not constants (Ohmic), they are functions of time and voltage itself!
- That creates a closed loop, voltage depends on conductances which depend on voltage and so on... Smells like trouble...
- How than can we measure the conductances?

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## Voltage clamp experiment

- The idea is to artificially alter membrane voltage by the so called voltage clamp
- One electrode is used to measure membrane voltage while the other is used to apply appropriate current.
- The current variates with time, approaching steady state asymptotic value. That way the so called I-V (current-voltage) curves can be obtained.
- Further variants of the experiment have beed devised in order to measure conductances of particular ions etc.

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#### Voltage clamp experiment



#### Figure: Voltage clamp scheme

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#### Voltage clamp experiment



Figure: Typical outcome of the voltage-clamp experiment.

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## Conductances

- The ionic conductances are variable which makes the neuronal activity complex (if they weren't, things would be very simple)
- The conductance variability is due to the so called gates large particles in the neural membrane that open or close a particular ionic channel. The gates may be sensitive to:
  - $\bullet\,$  Membrane voltage voltage gated channels e.g. Na^+and K^+
  - $\bullet\,$  Secondary messengers (intracellular agents) e.g. Ca^{2+}-gated K^+ channels
  - Extracellular agents (neurotransmitters and neuromodulators) e.g. AMPA, GABA, NMDA receptors in synapses.
- Gating is a stochastic process, nevertheless since there are lots of channels on each membrane piece, globally gating can be averaged and approximated via a differential equation

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#### Conductances

Variable conductances can be employed to our equation in a following manner:

$$I = \overline{g}p(V - E)$$

where  $\overline{g}$  is the maximal conductance (with every channel open) and  $p \in [0, 1]$  is average proportion of open channels. *E* is the reverse potential, that is the potential at which the current reverses direction. If the channels are selective to a single ionic species (which is the case), then *E* is the Nerst potential of that ion.

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## Voltage gated currents

- The most important for neural excitability a the voltage gated currents, that is currents dependent on conductances which themselves depend on membrane voltage.
- These conductances may be
  - deactivated (the channels are closed)
  - activated (the ions may flow freely)
  - inactivated (another process closes the channel)
  - deinactivated (released from inactivation)
- If the channel can only be activated and deactivated it results in *persistent* (long lasting) currents
- The channel that can be inactivated results in *transient* (short lasting) currents.



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#### Voltage gated currents



Figure: Channels that can be activated and inactivated.

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## Voltage gated currents

- Activation and inactivation are a processes that take some time, historically the activation is denoted with variable m (or n) while the inactivation is denoted with h.
- Consequently the total conductance of a channel is expressed

$$p=m^ah^b$$

where a and b are numbers of activation and inactivation gates per channel (activities of gates are assumed to be independent)

- If the channel has no inactivation gates then b = 0.
- The only thing needed to have a decent model of neuronal membrane is to investigate the activation and inactivation dynamics!



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## Hodgkin-Huxley neuron

- The pioneering measurements leading to fairly full description of neuronal excitability were conducted by Alan Lloyd Hodgkin and Andrew Huxley in 1952.
- In 1963 they both received Nobel Prize in Physiology or Medicine for the work.
- They've worked on a giant squid axon a particularly convenient neuronal cell to study due to it's large size.
- They managed to measure all the parameters required to formulate a complete model of neuronal membrane, and that could simulate excitability and spike generation mechanisms.



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## Activation kinetics

• The averaged activation can be approximated with a following differential equation

$$\frac{dm(V,t)}{dt} = (m_{\infty}(V) - m)/\tau_m(V)$$

- $m_{\infty}(V) \in [0, 1]$  is the asymptotic steady state activation function. That is with voltage V activation approaches  $m_{\infty}(V)$ .
- $\tau_m(V)$  is the rate at which *m* converges to its asymptotic value.



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Hodgkin and Huxley came up with a set of equations:

$$C_m \frac{dV}{dt} = -g_L(V - E_L) - g_{Na}m^3h(V - E_{Na}) - g_Kn^4(V - E_K)$$
$$\frac{dm}{dt} = (m_\infty(V) - m)/\tau_m(V)$$
$$\frac{dn}{dt} = (n_\infty(V) - n)/\tau_n(V)$$
$$\frac{dh}{dt} = (h_\infty(V) - h)/\tau_h(V)$$

Where  $C_m$  is the membrane capacitance (typically  $1\mu F/cm^2$ ),  $g_L = 0.3 = mS/cm^2$  is the leak conductance and  $E_L - 55.4mV$  is the leak potential,  $g_{Na} = 120mS/cm^2$ ,  $E_{Na} = 55mV$ ,  $g_K = 36mS/cm^2$ ,  $E_K = -77mV$  are conductances and Nerst potentials of sodium and potassium respectively



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*m*, *n* and *h* are gating variables,  $m_{\infty}(V)$ ,  $n_{\infty}(V)$ ,  $h_{\infty}(V)$  are steady state activation functions,  $\tau_m(V)$ ,  $\tau_n(V)$ ,  $\tau_h(V)$  are volatge dependent convergence rates. These functions have been estimated empirically and approximated by sigmoidal and unimodal exponential functions.



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Figure: Steady state activation functions in Hodgkin-Huxley model (horizontal axis stands for voltage)



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Figure: Voltage dependent convergence rates in Hodgkin-Huxley model (horizontal axis stands for voltage)



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## Action potential

- What happens to the Hodgkin-Huxley model when some stimulating current is applied to the membrane?
- The current causes the voltage to jump according to  $V \rightarrow V_{\rm rest} + IR_{\rm inp}.$
- Voltage changes alter ionic conductances, consequently m, nand h variables start to follow their new asymptotic values  $m_{\infty}(V), n_{\infty}(V), h_{\infty}(V)$  with rates  $\tau_m(V), \tau_n(V), \tau_h(V)$ .
- Sodium Na<sup>+</sup>has the fastest kinetics, therefore initial voltage jump quickly increases Na<sup>+</sup>conductance. If the jump was strong enough it may ignite a self perpetuating process, since the inflow of sodium increases membrane polarization (further increase in V) !



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#### Action potential

- If the process ignites, then membrane voltage quickly jumps up to say 50*mv* before other gates start their action.
- After a while sodium inactivation catches up, and inactivates the sodium channel.
- In the mean while, slow potassium activation variable *n* grows, causing huge outflow of K<sup>+</sup>ions. Consequently membrane voltage falls down below the rest state, that is it hyperpolarizes.
- Next the potassium channel slowly inactivates, and the membrane gets back to the rest state.
- The whole process is called an action potential or a spike (due to a sudden spike like increase in membrane potential).



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Figure: A spike in HH model. In response to a 1ms stimulation of 10pA, the neuron ignites a huge jump in the membrane voltage.



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Figure: Na<sup>+</sup> and K<sup>+</sup> conductances during a spike (time scale as on previous figure).

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Figure: Activation and inactivation variables during a spike (time scale as on previous figure). Blue and red are Na<sup>+</sup>activation and inactivation respectively, green is the slow  $K^+$ activation.



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Figure: Neuronal voltage (HH model) in response to a stimuli depicted with green line. Note the post inhibitory spike!



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Figure: Ionic conductances of Na<sup>+</sup>and K<sup>+</sup>in HH model in response to a stimuli from previous figure.

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Figure: Activation and inactivation variables in HH model in response to a stimuli from previous figure.



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#### After spike excitability



Figure: Magnitude of stimulation required to fire another spike as a function of time from the previous spike inducing stimulus.



#### Remarks

lons and the membrane Hodgkin-Huxley neuron Recap Activation kinetics Hodgkin-Huxley equation Action potential Spatial propagation of spikes



Originally Hodgkin-Huxley equation was formulated as follows:

$$C_m \frac{dV}{dt} = -g_L(V - V_L) - g_{Na}m^3h(V - V_{Na}) - g_K n^4(V - V_K)$$
  

$$\frac{dm}{dt} = \alpha_m(V)(1 - m) - \beta_m(V)m$$
  

$$\frac{dh}{dt} = \alpha_h(V)(1 - h) - \beta_h(V)h$$
  

$$\frac{dn}{dt} = \alpha_n(V)(1 - n) - \beta_n(V)n$$
(1)

where (see next slide)

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#### Remarks continued

$$\begin{split} \alpha_n(V) &= 0.01 \frac{10 - V}{e^{\frac{10 - V}{10}} - 1}, & \beta_n(V) &= 0.125 e^{\frac{-V}{80}}, \\ \alpha_m(V) &= 0.1 \frac{25 - V}{e^{\frac{25 - V}{10}} - 1}, & \beta_m(V) &= 4e^{\frac{-V}{18}}, \\ \alpha_h(V) &= 0.07 e^{\frac{-V}{20}}, & \beta_h(V) &= \frac{1}{1 + e^{\frac{30 - V}{10}}} \end{split}$$

and typically:

$$\begin{array}{ll} E_k = -12mV, & E_{Na} = 120mV, & E_L = 10.6mV, \\ g_K = 36mS/cm^2, & g_{Na} = 120mS/cm^2, 7 & g_L 7 = 0.3mS/cm^2, \\ C = 1\mu F/cm^2 \end{array}$$



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#### Remarks continued

The ionic potentials were shifted, so that membrane rest potential would be at 0mV. Instead we are adopting the modern formulation, in which the rest potential is at -65mV. Also note that

$$\begin{split} n_{\infty} &= \alpha_n / (\alpha_n + \beta_n), & \tau_n &= 1 / (\alpha_n + \beta_n) \\ m_{\infty} &= \alpha_m / (\alpha_m + \beta_m), & \tau_m &= 1 / (\alpha_m + \beta_m) \\ h_{\infty} &= \alpha_h / (\alpha_h + \beta_h), & \tau_h &= 1 / (\alpha_h + \beta_h) \end{split}$$

(remember to shift the voltage in expressions for  $\alpha$  and  $\beta$  before trying to implement this model!)

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# Spatial propagation of spikes

- Everything derived up until now relates to infinitesimal piece of neuronal membrane and time evolution of its potential
- However neurons are spacial entities (some axons can be up to a meter long!)
- There are two approaches available for simulation of the whole neuron:
  - Via the cable equation (most adequate, but computationally demanding)
  - Via compartments connected by conductances (faster but less accurate).

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## Cable equation

The cable equation adds an extra term to the voltage/current relation. The term is proportional to the second order partial derivative of V with respect to spacial variable x.

$$C\frac{dV}{dt} = \frac{a}{2R}\frac{\partial^2 V}{\partial x^2} + I - I_K - I_{Na} - I_L$$
(2)

Where a (cm) is the radius of the cell (dendrite,axon etc...), and R  $\Omega \cdot cm$  is intracellular resistivity. It is easy to understand that equation: it basically says that the rate of change of the membrane at some point (dV/dt) depends on what happens at that particular point  $I - I_K - I_{Na} - I_L$ , but also depends on the rate of change of the difference between the voltage at current point and a neighboring point.



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## Multi compartment model

- Another somewhat easier approach is to simulate a neuron as a set of compartments.
- Each compartment has the dynamics defined by the Hodgkin-Huxley equation, with an extra current coming from neighboring comparments
- Eventually the equation is:

$$C \frac{dV}{dt} = -I(V, t) + \sum_{n \in \text{neighbors}} g_n(V_n - V)$$

where  $g_n$  is the conductance from neighboring compartment n and  $V_n$  is the value of voltage at that compartment.





- Neurons exhibit very peculiar electric activity. The charge is not transferred directly (like in copper wires), but instead causes inward and outward ionic currents across the membrane.
- Depolarization of the membrane propagates along neuronal fibers. The propagation is rather slow of order 1m/s unlike metallic conductors where voltage changes propagate at nearly speed of light.
- The mechanism is active, that is whenever input signal is strong enough, the spike generation process is ignited which amplifies the action potential.
- The first mathematical description of action potentials were introduced in 1952 by Alan Lloyd Hodgkin and Andrew Huxley.

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