## Systems Biology: Theoretical Biology



Levien van Zon, Theoretical Biology, UU

The Neuron Mystery

Alan Hodgkin

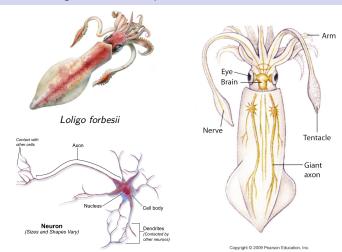


Andrew Huxley



Loligo forbesii

#### Introducing The Giant Squid Neuron



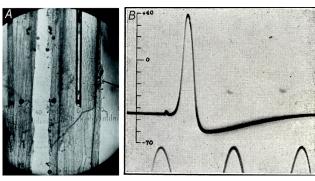
#### A Five-Year Interruption





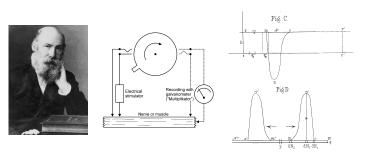


#### 1939: First Recorded Action Potential (Inside an Axon)



Hodgkin, A. L., & Huxley, A. F. (1939). Action potentials recorded from inside a nerve fibre. Nature, 144(3651), 710-711.

#### Back In Time: Julius Bernstein (1839-1917)

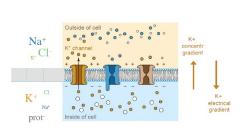


#### Bernstein's Membrane Theory (1902)



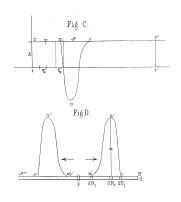
Walther Nernst (1864-1941)

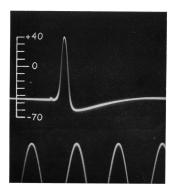
#### Electrochemical Equilibrium



Nernst Equilibrium:  $\overline{V_{K^+}} = \frac{RT}{z_K F} \ln \frac{[K^+]_o}{[K^+]_i} \approx -80 \, \text{mV}$ 

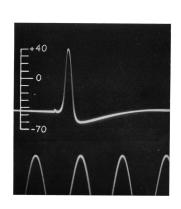
#### Bernstein's Membrane Theory Scrutinised



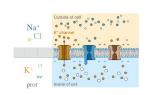


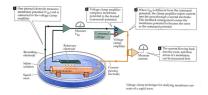
#### The Role Of Sodium?

# 

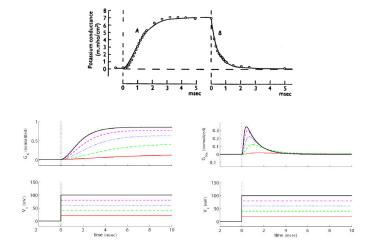


## The Voltage Clamp

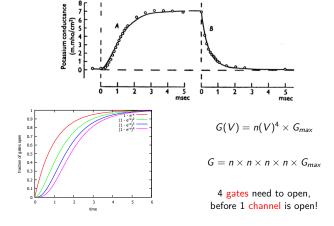




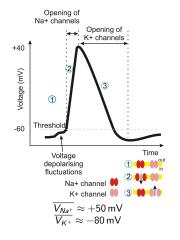
#### Voltage Clamp Results

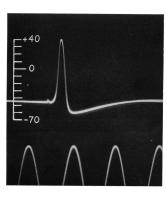


#### Voltage Clamp Results vs. Channel Model

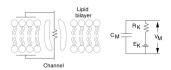


#### Hodgkin & Huxley's Theory





#### Membrane Currents and Voltages



Current / and charge Q:

$$I = \frac{dQ}{dt}$$

Ohm's Law, resistance *R* and conductance *G*:

$$V = I \times R$$

$$I = \frac{1}{R} \times V$$

$$I = G \times V$$

Capacitance C, storing charge:

$$Q(t) = V(t) \times C$$

$$\frac{dQ}{dt} = \frac{dV}{dt} \times C$$

$$I = \frac{dV}{dt} \times C$$

$$\frac{dV}{dt} = \frac{1}{C} \times I$$

$$\frac{dV}{dt} = \frac{1}{C} \times G(V) \times V$$

#### A Simple Model for Channels

$$\frac{\mathsf{d}x}{\mathsf{d}t} = \alpha(1-x) - \beta x$$

Fraction of open channels: x Fraction of closed channels: (1-x) Rate at which channels open:  $\alpha$  Rate at which channels close:  $\beta$ 

Equilibrium  $\overline{x}$ :

Solution x(t):

$$\alpha(1-x) - \beta x = 0$$

$$\alpha - \alpha x - \beta x = 0$$

$$-(\alpha + \beta)x = -\alpha$$

$$\overline{x} = \frac{\alpha}{\alpha + \beta}$$

$$x(t) = \overline{x} - (\overline{x} - x_0)e^{-(\alpha + \beta)t}$$

#### A Simple Model for Potassium Gates

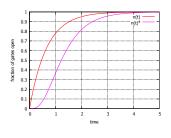
$$\frac{\mathrm{d}n}{\mathrm{d}t} = \alpha(V)(1-n) - \beta(V)n$$

$$\frac{\mathrm{d}n}{\mathrm{d}t} = \frac{1}{\tau_n}(\overline{n}-n)$$

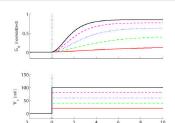
Fraction of open  $K^+$  gates: n

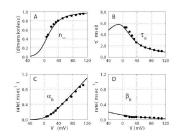
Equilibrium  $\overline{n}(V)$  or  $n_{\infty}$ :  $\overline{n}(V) = \frac{\alpha(V)}{\alpha(V) + \beta(V)}$ 

Time constant  $\tau(V)$ :  $\tau_n(V) = \frac{1}{\alpha(V) + \beta(V)}$ 



## Finding $\overline{\mathbf{n}}$ , $\tau$ , $\alpha$ and $\beta$



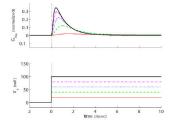


$$\alpha_n(V) = \frac{\overline{n}(V)}{\tau_n(V)}$$
$$\beta_n(V) = \frac{1 - \overline{n}(V)}{\tau_n(V)}$$

$$\alpha_n(V) = \frac{0.01(10 - V)}{e^{(1 - 0.1V)} - 1}$$

$$\beta_n(V) = 0.125e^{-\frac{V}{80}}$$

#### A Simple Model for Sodium Gates



$$\frac{\mathrm{d}m}{\mathrm{d}t} = \alpha_m (1 - m) - \beta_m m$$

$$\frac{\mathrm{d}h}{\mathrm{d}t} = \alpha_h (1 - h) - \beta_h h$$

Two types of Na<sup>+</sup> gates:

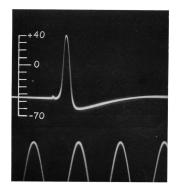
- 1 m-gates open rapidly in response to voltage
- h-gates close slowly in response to voltage

m and h are the fractions of m-gates and h-gates that are open.

#### What Were We Modelling Again?



Nernst Equilibria:  $\frac{\overline{V_{K^+}}}{V_{Na^+}} \approx -80 \,\mathrm{mV}$  $\approx +50 \,\mathrm{mV}$ 



#### The Full Model

$$\begin{cases} \frac{\mathrm{d}V}{\mathrm{d}t} = \frac{1}{\overline{C}} \left( G_K(\overline{V_K} - V) + G_{Na}(\overline{V_{Na}} - V) + G_R(\overline{V_R} - V) \right) \\ \frac{\mathrm{d}m}{\mathrm{d}t} = \alpha_m (1 - m) - \beta_m m \\ \frac{\mathrm{d}h}{\mathrm{d}t} = \alpha_h (1 - h) - \beta_h h \\ \frac{\mathrm{d}n}{\mathrm{d}t} = \alpha_n (1 - n) - \beta_n n \end{cases}$$

with

$$G_K = n^4 G_{K max}$$
  
 $G_{Na} = m^3 h G_{Na max}$ 

$$G_K = n^4 G_{K_{max}}$$
  
 $G_{Na} = m^3 h G_{Na_{max}}$ 

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

 $\alpha_n = \frac{0.01(10 - V)}{e^{(1 - 0.1V)} - 1}$ 

 $\beta_{\it n}=0.125 {\rm e}^{-\frac{\it V}{80}}$ 

#### A "Simple" Model for Potassium Gates

$$\frac{\mathrm{d}n}{\mathrm{d}t} = \alpha_n(1-n) - \beta_n n$$

Fraction of open  $K^+$  gates: n

Rate "constants"  $\alpha$  and  $\beta$  are not constant, but depend on voltage:

$$\alpha_n(V) = \frac{0.01(10 - V)}{e^{(1 - 0.1V)} - 1}$$
$$\beta_n(V) = 0.125e^{-\frac{V}{80}}$$

#### A "Simple" Model for Na<sup>+</sup> Gates

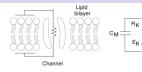
$$\frac{\mathrm{d}m}{\mathrm{d}t} = \alpha_m (1 - m) - \beta_m m$$

$$\frac{\mathrm{d}h}{\mathrm{d}t} = \alpha_h (1 - h) - \beta_h h$$

Rate "constants"  $\alpha$  and  $\beta$  are not constant, but depend on voltage:

$$\begin{aligned} \alpha_m &= 0.1 \frac{25 - V}{\mathrm{e}^{\frac{25 - V}{10}} - 1} \\ \beta_m &= 4\mathrm{e}^{(-\frac{V}{18})} \\ \alpha_h &= 0.07\mathrm{e}^{(-\frac{V}{20})} \\ \beta_h &= \frac{1}{\mathrm{e}^{(\frac{30 - V}{10})} + 1} \end{aligned}$$

#### Membrane Currents and Voltages Revisited





#### Describing the voltage:

$$\begin{split} \frac{\mathrm{d}V}{\mathrm{d}t} &= \frac{1}{C} \times G \times V \\ &= \frac{1}{C} \times (I_{K^{+}} + I_{Na^{+}} + I_{R}) \\ &= \frac{1}{C} \times (G_{K^{+}} \times (\overline{V_{K^{+}}} - V) + G_{Na^{+}} \times (\overline{V_{Na^{+}}} - V) + G_{R} \times (\overline{V_{R}} - V)) \end{split}$$

$$\frac{\mathrm{d}V}{\mathrm{d}t} = \frac{1}{C} \times \left(G_{K^{+}} \times \left(\overline{V_{K^{+}}} - V\right) + G_{Na^{+}} \times \left(\overline{V_{Na^{+}}} - V\right) + G_{R} \times \left(\overline{V_{R}} - V\right)\right)$$

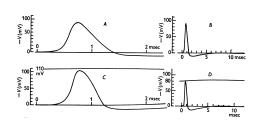
#### Please Wait, Calculating...



Brunsviga 20 — "Brains of Steel"

#### Please Wait, Calculating...





#### 2003: Prediction Confirmed!



#### Simplifying the model

#### Quasi Steady State assumption

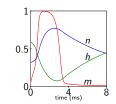
The m gate is much faster, so replace m by its steady-state  $\overline{m}$ :

$$m = \overline{m} = \frac{\alpha_m}{\alpha_m + \beta_m}$$

#### Conservation assumption

 $\emph{n}$  and  $\emph{h}$  are almost complementary:  $\emph{n}+\emph{h}\simeq 0.91$  Use this to remove  $\emph{n}:$ 

$$n = 0.91 - h$$



 $\beta_{\mathit{h}} = \frac{1}{\mathrm{e}^{\left(\frac{30-V}{10}\right)} + 1}$ 

This reduces the model to 2 variables: V and h!

#### Simplified, But Still Pretty Complicated!

$$\left\{ \begin{array}{l} \frac{dV}{dt} = \frac{1}{C}(G_K(\overline{V_K} - V) + G_{Na}(\overline{V_{Na}} - V) + G_R(\overline{V_R} - V)) \\ \frac{dh}{dt} = \alpha_h(1 - h) - \beta_h h \end{array} \right.$$

with

$$\alpha_{n} = \frac{0.01(10 - V)}{e^{(1 - 0.1V)} - 1}$$

$$G_{K} = (0.91 - h)^{4} G_{K_{max}}$$

$$G_{Na} = \overline{m}^{3} h G_{Na_{max}}$$

$$\overline{m} = \frac{\alpha_{m}}{\alpha_{m} + \beta_{m}}$$

$$\alpha_{m} = 0.1 \frac{25 - V}{e^{\frac{25 - V}{20}} - 1}$$

$$\beta_{m} = 4e^{(-\frac{V}{18})}$$

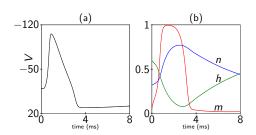
$$\alpha_{h} = 0.07e^{(-\frac{V}{20})}$$

#### Can't we do this simpler?

#### 1963: Nobel Prize!



#### 2014: Running it in GRIND

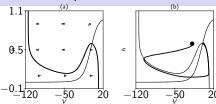


a Action potential: voltage dynamics

**b** Gate dynamics: m and h for Na<sup>+</sup>, n for K<sup>+</sup>

Note that in the original model, rest potential is 0 mV and AP is -90 mV

#### Nullclines and Phase space



thin line: h nullcline heavy line: V nullcline

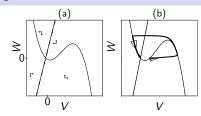
- Stable equilibrium
- V nullcline determines activation threshold
- Action potential is an excursion through phase space
- $\bullet\,$  The Na $^+$  inactivation gate is slow, closing the  $\emph{h}\textsc{-}\mathrm{gates}$  takes time
- $\bullet$  Recovery of the  $\emph{h}\text{-}\textsc{gates}$  also takes time, causing refractory period
- The voltage V changes much faster than the h-gates

#### Yes We Can: The FitzHugh-Nagumo Model

$$\begin{cases} \frac{\mathrm{d}V}{\mathrm{d}t} = -V(V-a)(V-1) - W \\ \frac{\mathrm{d}W}{\mathrm{d}t} = \epsilon(V-bW) \end{cases}$$

- Not mechanistic, but a phenomenological model
- V is voltage, W causes inactivation, refractoriness
- ullet is small, so W is a slow variable that follows V
- The  $\frac{\mathrm{d}W}{\mathrm{d}t}=0$  nullcline is a straight line:  $W=\frac{1}{b}V$
- The  $\frac{\mathrm{d}V}{\mathrm{d}t}=0$  nullcline is a cubic function: W=-V(V-a)(V-1)
- The V-nullcline intersects the V-axis at:  $V=0,\ V=a$  and V=1

#### FitzHugh-Nagumo: What Does It Look Like?



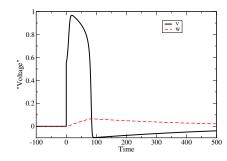
- Similar to the simplified HH model (but V and W axis mirrored)
- Stable equilibrium
- ullet V=a is the activation threshold
- Action potential is an excursion through phase space
- ullet The inactivation "gate" W is slow, inactivation takes time (right)
- ullet Recovery of W also takes time (left), causing refractory period
- ullet The voltage V changes much faster than the variable W

#### Summary

#### Hodgkin-Huxley model

- Key insight: different currents through separate channels.
- Approach: measure and model them separately, then combine.
- Ugly equations are just to fit data precisely.
- Key is opening and closing of gates that control open state of
- Different currents and gates control different phases of the action potential:
  - depolarization (Na<sup>+</sup>, m-gate)
  - repolarization (Ka<sup>+</sup>, n-gate)
    refractoriness (Na<sup>+</sup>, h-gate)
- Model can be simplified from 4 to 2 equations
- The model predicted voltage sensitive, time dependent transmembrane protein channels, long before they were found!

#### FitzHugh-Nagumo: Behavior in time



Behavior of V resembles an action potential.

http://www.scholarpedia.org/article/FitzHugh-Nagumo model

#### Summary

#### Fitzhugh-Nagumo model

- Reaching a simpler 2 variable model with similar behaviour, by considering which ingredients are necessary.
- Below the threshold a no real excitation occurs.
- Beyond the threshold a excitation must occur.
- After excitation refractoriness must occur.
- ullet Slow  $W ext{-variable}$  represses fast  $V ext{-variable}$ , and ensures refractoriness