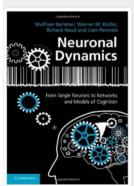
**Alexey Brazhe** 

- http://neuronaldynamics.epfl.ch/
- http://neuronaldynamics-exercises.readthedocs.io/en/latest/

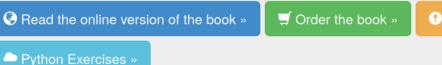
# **Neuronal Dynamics**

From single neurons to networks and models of cognition

Wulfram Gerstner, Werner M. Kistler, Richard Naud and Liam Paninski



What happens in our brain when we make a decision? What triggers a neuron to send out a signal? What is the neural code? This textbook for advanced undergraduate and beginning graduate students provides a thorough and up-to-date introduction to the fields of computational and theoretical neuroscience.

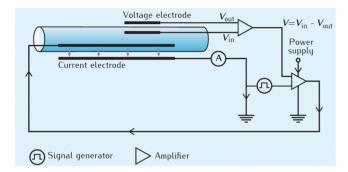


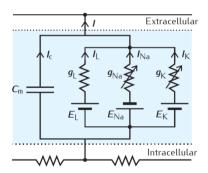
- http://lcn.epfl.ch/~gerstner/NeuronalDynamics-MOOC1.html
- http://neuronaldynamics.epfl.ch/lectures.html
- https://senselab.med.yale.edu/ModelDB/ModelList.cshtml?id=1 13733&allsimu=true

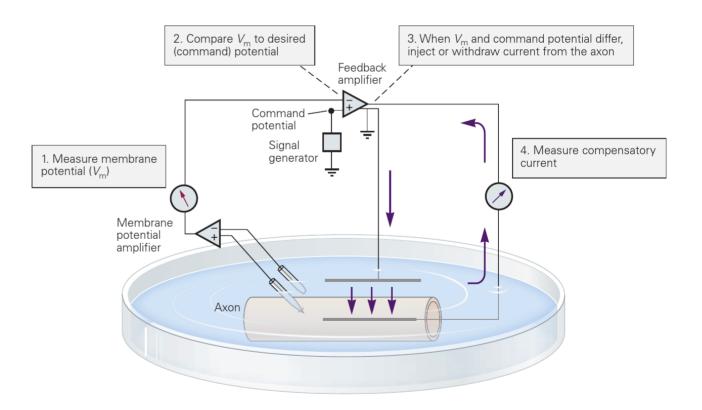
lacktriangle

### Ion currents in the squid giant axon

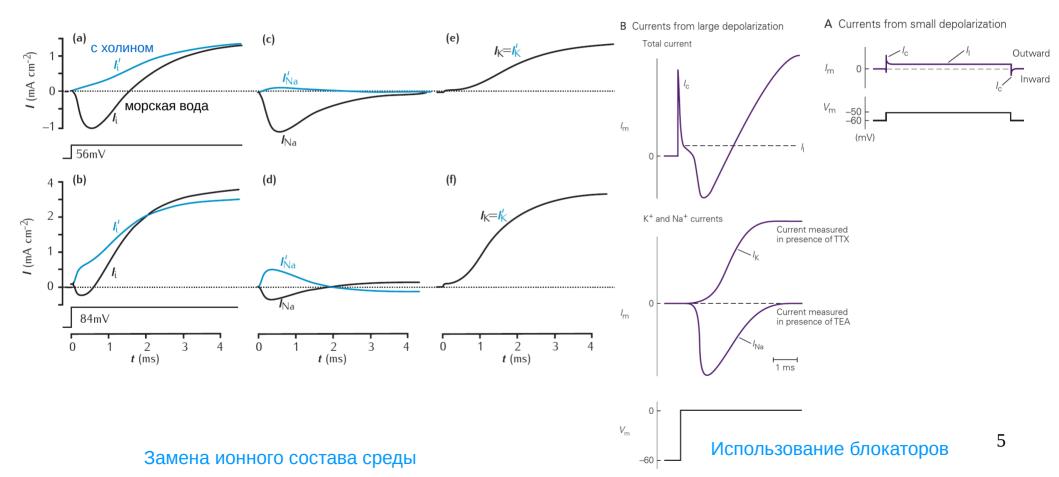






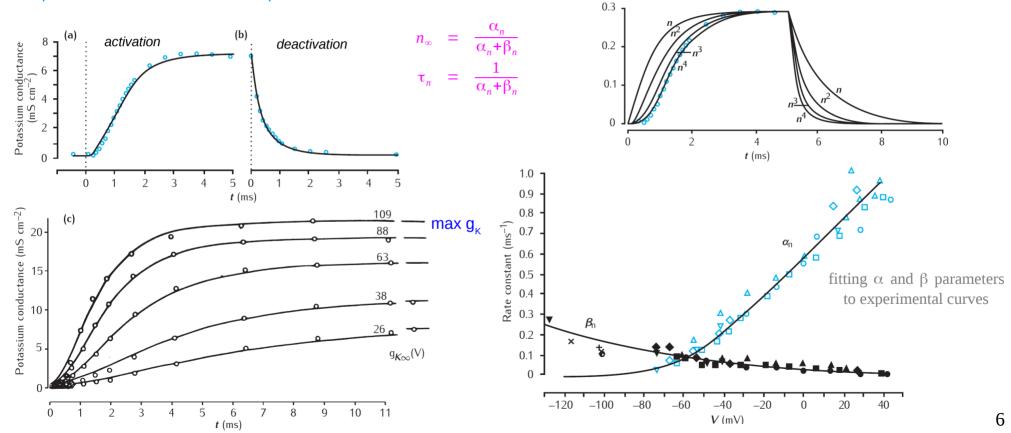


# Ходжкин-Хаксли: разделение токов на $I_{\!\scriptscriptstyle Na}$ и $I_{\!\scriptscriptstyle K}$



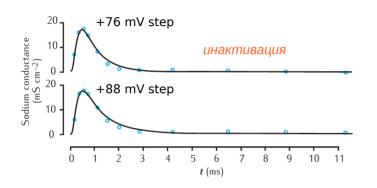
### Potassium current in the HH model

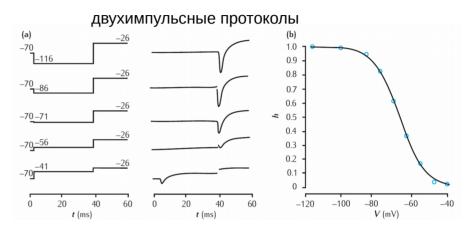
#### Dependence of K conductance on potential

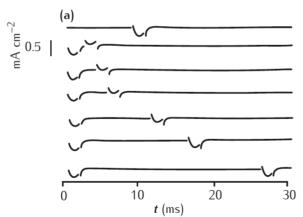


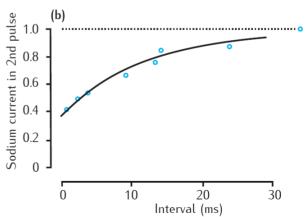
#### Sodium current in the HH model

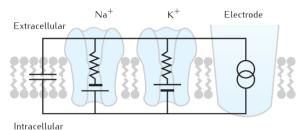
 $I_{Na} = \overline{g}_{Na} m^3 h (V - E_{Na})$ 











Membrane potential dynamics is governed by an ODE:

$$C_{m} \frac{dV}{dt} = I_{electrode} - \overline{g}_{L}(V - E_{L}) - \overline{g}_{Na} m^{3} h(V - E_{Na}) - \overline{g}_{K} n^{4}(V - E_{K})$$

#### General summary

1) 
$$I_i = g_i(V - E_{iNernst})$$
 Instantaneous I-V relationship is linear

2) 
$$g_i = \bar{g}_i w^y v^\delta$$
 Instantaneous conductance is maximal conductance weighted by fraction of open channels (2 types of gates)

$$3)\frac{dw}{dt} = \frac{1}{\tau_w}(w_{\infty} - w) \equiv \alpha_w(1 - w) - \beta_w w \text{ Linear gate kinetics}$$

4) 
$$\alpha_w = f_1(V)$$
,  $\beta_w = f_2(V)$  Gate kintetic rates are nonlinear functions of Vm

$$I_k = \overline{g}_K n^4 (V - E_K)$$

$$I_{Na} = \overline{g}_{Na} m^3 h (V - E_{Na})$$

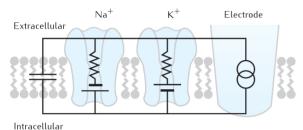
$$I_L = \overline{g}_L (V - E_L)$$

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

K-current (through Kv channels)

Na-current (through Nv-channels)

Non potential-sensitive leak



Membrane potential dynamics is governed by an ODE:

$$C_{m} \frac{dV}{dt} = I_{electrode} - \overline{g}_{L}(V - E_{L}) - \overline{g}_{Na} m^{3} h(V - E_{Na}) - \overline{g}_{K} n^{4}(V - E_{K})$$

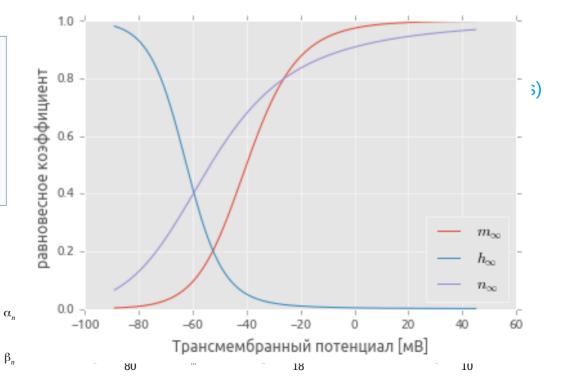
#### General summary

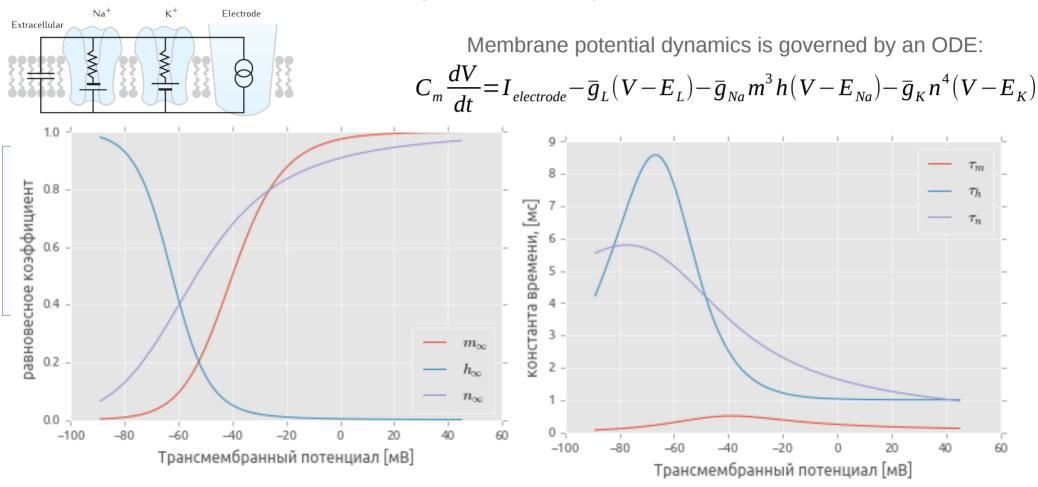
1) 
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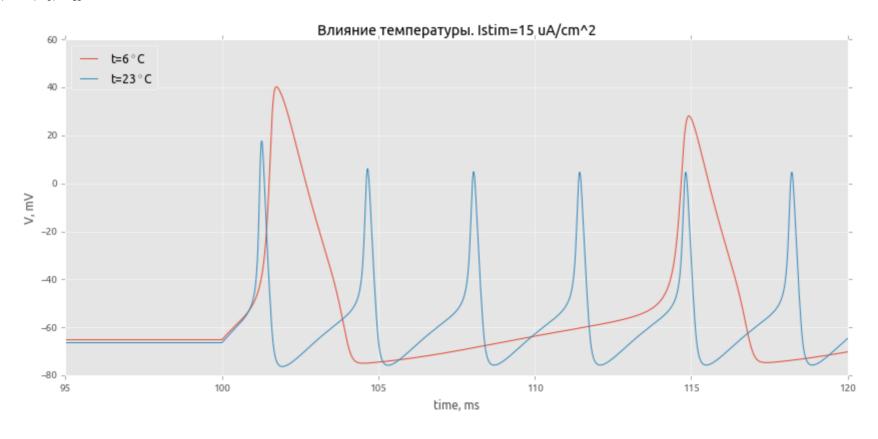
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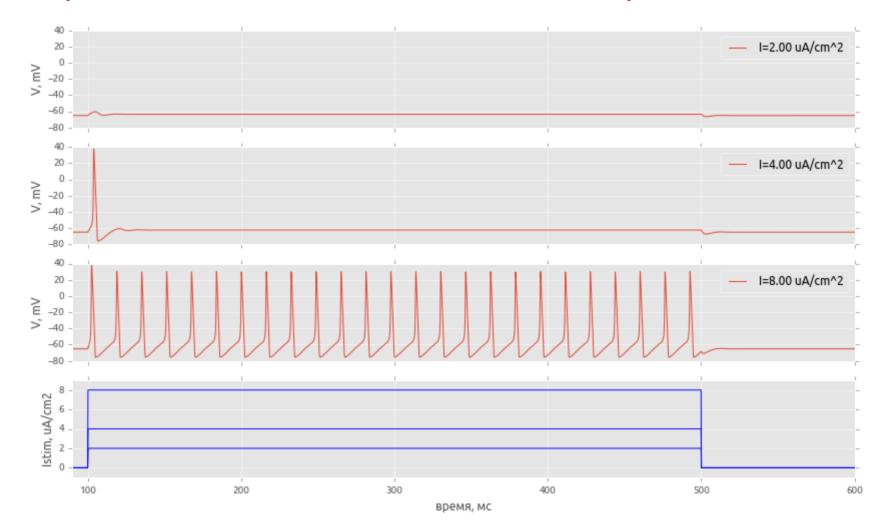


## Effect of temperature

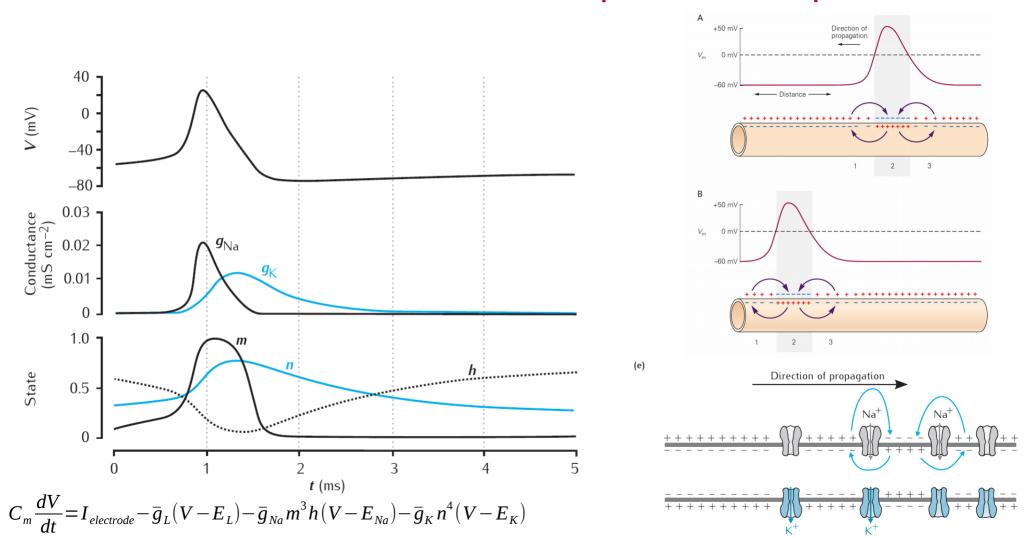
$$\alpha(T) = \alpha(T_0) Q_{10}^{\frac{T-T_0}{10}}$$



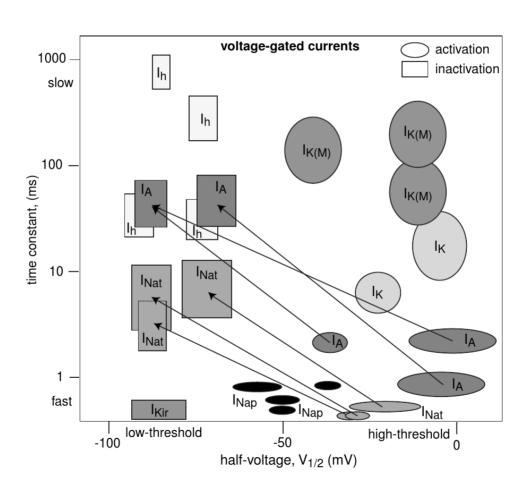
## Response of the HH model to current pulses: Class 2



## Generation and conduction of spike in the squid axon



### The zoo of ion currents

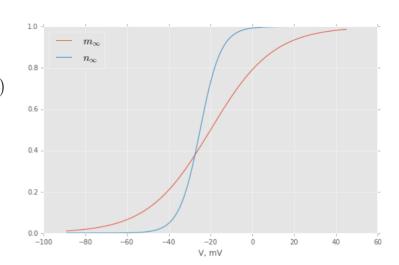


#### I<sub>Na.p</sub>+I<sub>K</sub>-model:

$$C\dot{V} = I - \bar{g}_K n(V - E_K) - \bar{g}_{Na} m_{\infty}(V)(V - E_{Na}) - g_l(V - E_l)$$

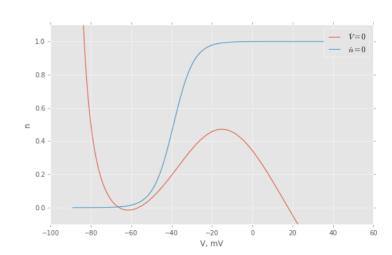
$$\tau_n \dot{n} = (n_{\infty}(V) - n)$$

$$x_{\infty} = \frac{1}{1 + \exp(\frac{V_x^{0.5} - V}{k_x})}$$

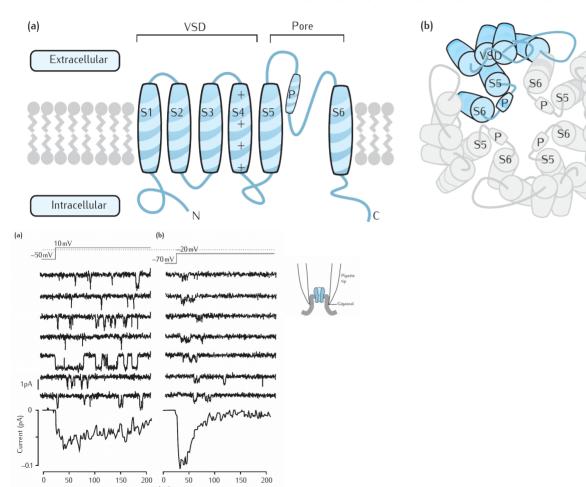


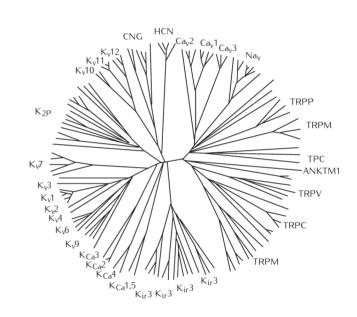
#### **Nullclines:**

$$\dot{V} = 0 \to n(V) = \frac{I - \bar{g}_{Na} m_{\infty} (V - E_{Na}) - g_l (V - E_l)}{\bar{g}_k (V - E_k)}$$
$$\dot{n} = 0 \to n(V) = n_{\infty}(V)$$



#### More detailed channel models





#### Markov models and kinetic schemes

Na,-channel (Vandenberg & Bezanilla 1991):

$$C_{1} \xrightarrow{k_{1}} C_{2} \xrightarrow{k_{1}} C_{3} \xrightarrow{k_{1}} C_{4} \xrightarrow{k_{2}} C_{5} \xrightarrow{k_{3}} O$$

$$\downarrow k_{-1} \downarrow k_{-1} \downarrow k_{-1} \downarrow k_{-2} \downarrow k_{-2} \downarrow k_{-3} \downarrow k_{4} \downarrow k_{-4}$$

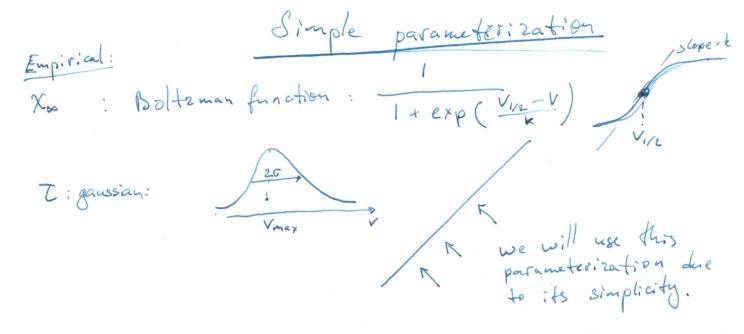
$$\downarrow k_{-1} \downarrow k_{-2} \downarrow k_{-2} \downarrow k_{-3} \downarrow k_{-4} \downarrow k_{-4}$$

$$\downarrow k_{-1} \downarrow k_{-2} \downarrow k_{-2} \downarrow k_{-3} \downarrow k_{-4} \downarrow k_{-4}$$

Why does everyone still uses HH formalism and independent gating particles?

- less parameters to fit
- less equations
- accurate enough
- when sub-ms accuracy is not required
- for large ensembles of channels

# Parameterization of gating kinetics



read more on thermodyn, models:

Tsien & Noble 1363

Deskxhe, Huguenard 2000 JCN

Or: Masher makely (stocharotic)

(cit.)

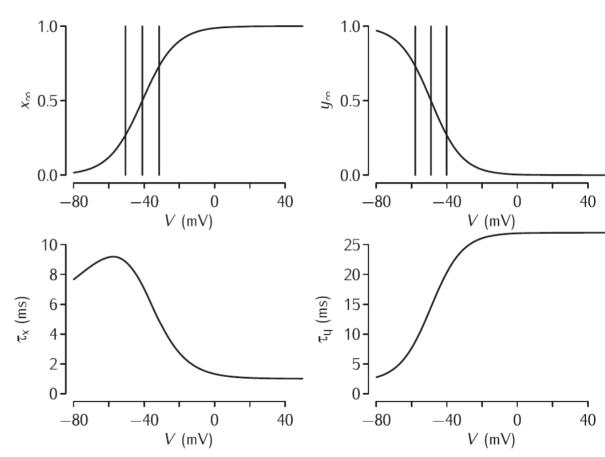
### Thermodynamic-based models

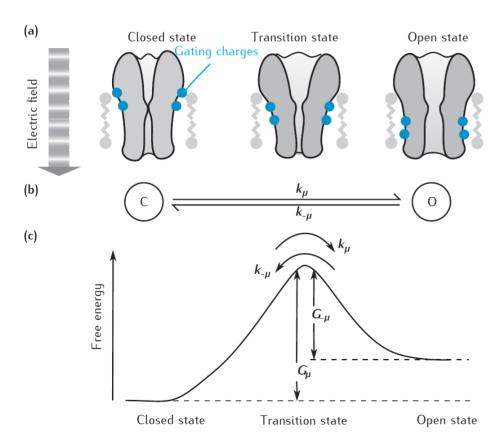
$$x_{\infty} = \frac{1}{1 + \exp(-(V - V_{1/2})/\sigma)},$$

$$\tau_{\mathbf{x}} = \frac{1}{\alpha'(V) + \beta'(V)} + \tau_{0},$$

$$\alpha_{x}'(V) = K \exp\left(\frac{\delta(V - V_{1/2})}{\sigma}\right)$$

$$\beta_x'(V) = K \exp\left(\frac{-(1-\delta)(V-V_{1/2})}{\sigma}\right).$$





$$k_{\mu} = \frac{k_{\rm B}T}{h} \exp\left(-\frac{\Delta G_{\mu}}{RT}\right) = \frac{k_{\rm B}T}{h} \exp\left(\frac{\Delta S_{\mu}}{R}\right) \exp\left(-\frac{\Delta H_{\mu}}{RT}\right)$$

$$\Delta H_{\mu}(V) = \Delta H_{\mu}^{(0)} - \delta_{\mu} z_{\mu} F V,$$

$$\Delta H_{-\mu}(V) = \Delta H_{-\mu}^{(0)} + (1 - \delta_{\mu}) z_{\mu} F V.$$

