

# Introduction to Computational Neuroscience

Biol 698

Math 635

Math 430



## Bibliography:

- "Mathematical Foundations of Neuroscience", by G. B. Ermentrout & D. H. Terman - Springer (2010), 1st edition. ISBN 978-0-387-87707-5
- \* "Foundations of Cellular Neurophysiology", by Daniel Johnston and Samuel M.-S. Wu. The MIT Press, 1995. ISBN 0-262-10053-3
  - \* "Dynamical Systems in Neuroscience: The Geometry of Excitability and Bursting", by Eugene M. Izhikevich. The MIT Press, 2007. ISBN 0-262-09043-8
  - \* "Biophysics of Computation - Information processing in single neurons", by Christof Koch. Oxford University Press, 1999. ISBN 0-19-510491-9
  - \* "Theoretical Neuroscience: Computational and Mathematical Modeling of Neural Systems", by Peter Dayan and Larry F. Abbott. The MIT Press, 2001. ISBN 0-262-04199-5



# Overview

- The Hodgkin-Huxley model (review)
- The cable equation
- Multiple compartmental approach
- B



# Hodgkin-Huxley model

$$\begin{aligned}C\dot{V} &= I - \overbrace{\bar{g}_K n^4 (V - E_K)}^{I_K} - \overbrace{\bar{g}_{Na} m^3 h (V - E_{Na})}^{I_{Na}} - \overbrace{g_L (V - E_L)}^{I_L} \\ \dot{n} &= \alpha_n(V)(1 - n) - \beta_n(V)n \\ \dot{m} &= \alpha_m(V)(1 - m) - \beta_m(V)m \\ \dot{h} &= \alpha_h(V)(1 - h) - \beta_h(V)h ,\end{aligned}$$

$$\alpha_n(V) = 0.01 \frac{10 - V}{\exp(\frac{10 - V}{10}) - 1}$$

$$\alpha_m(V) = 0.1 \frac{25 - V}{\exp(\frac{25 - V}{10}) - 1}$$

$$\alpha_h(V) = 0.07 \exp\left(\frac{-V}{20}\right)$$

$$\beta_n(V) = 0.125 \exp\left(\frac{-V}{80}\right)$$

$$\beta_m(V) = 4 \exp\left(\frac{-V}{18}\right)$$

$$\beta_h(V) = \frac{1}{\exp(\frac{30 - V}{10}) + 1}$$

# Hodgkin-Huxley model

$$\begin{aligned}
 C \dot{V} &= I - \overbrace{\bar{g}_K n^4 (V - E_K)}^{I_K} - \overbrace{\bar{g}_{Na} m^3 h (V - E_{Na})}^{I_{Na}} - \overbrace{g_L (V - E_L)}^{I_L} \\
 \dot{n} &= (n_\infty(V) - n) / \tau_n(V) , \\
 \dot{m} &= (m_\infty(V) - m) / \tau_m(V) , \\
 \dot{h} &= (h_\infty(V) - h) / \tau_h(V) ,
 \end{aligned}$$

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

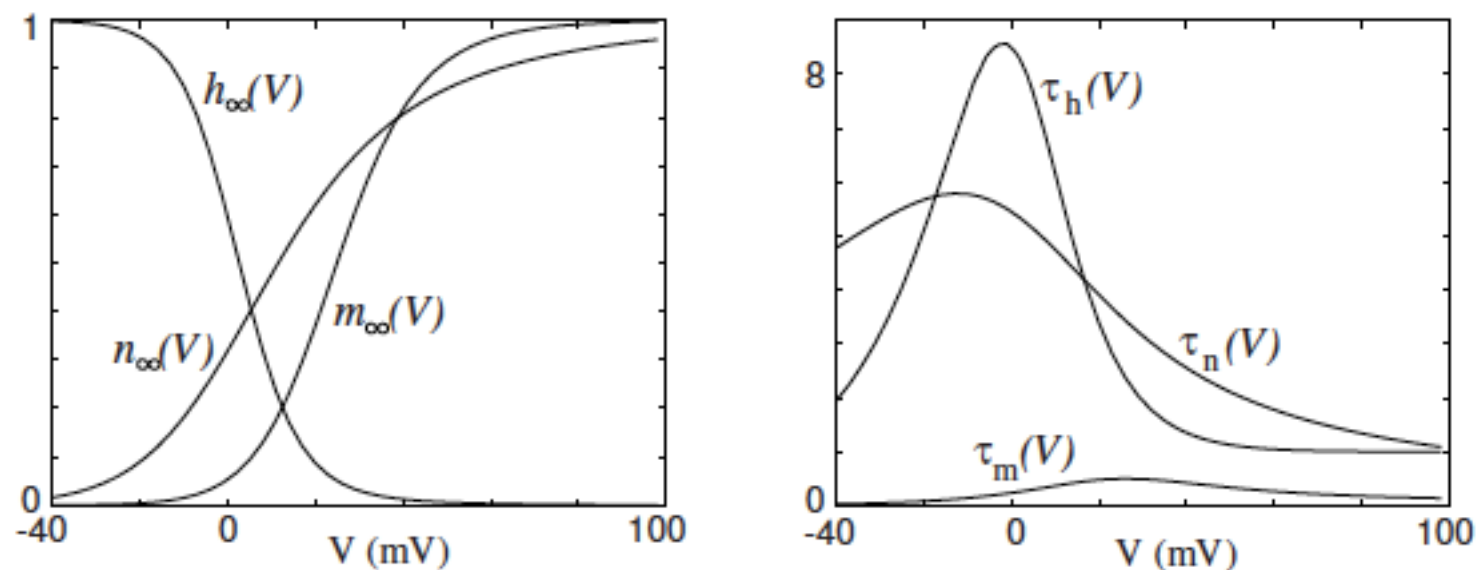


Figure 2.13: Steady-state (in)activation functions (left) and voltage-dependent time constants (right) in the Hodgkin-Huxley model.



# Hodgkin-Huxley model

$$\begin{aligned}C \dot{V} &= I - \overbrace{\bar{g}_K n^4 (V - E_K)}^{I_K} - \overbrace{\bar{g}_{Na} m^3 h (V - E_{Na})}^{I_{Na}} - \overbrace{g_L (V - E_L)}^{I_L} \\ \dot{n} &= \alpha_n(V)(1 - n) - \beta_n(V)n \\ \dot{m} &= \alpha_m(V)(1 - m) - \beta_m(V)m \\ \dot{h} &= \alpha_h(V)(1 - h) - \beta_h(V)h ,\end{aligned}$$

$$E_K = -12 \text{ mV}$$

$$E_{Na} = 120 \text{ mV}$$

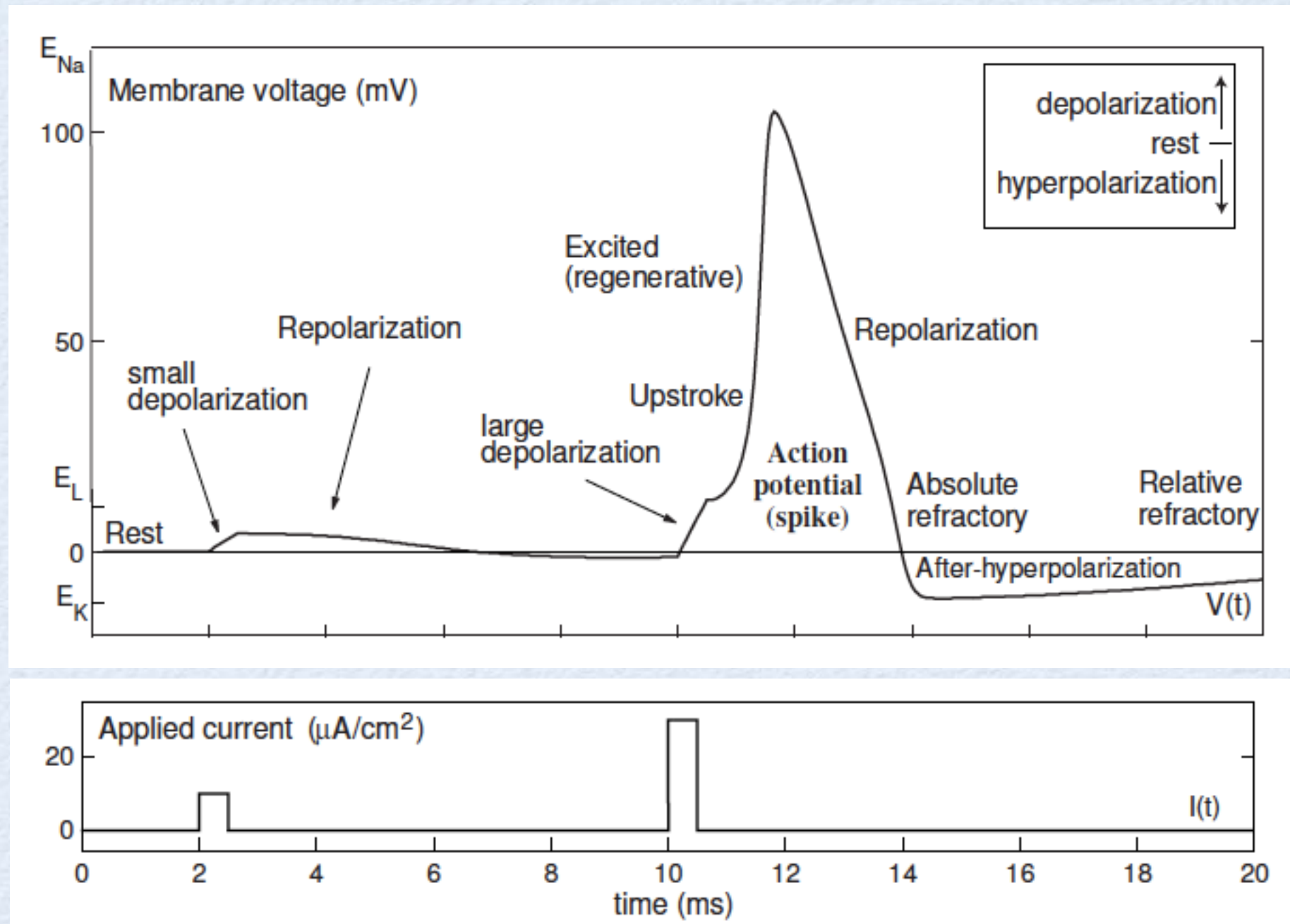
$$E_L = 10.6 \text{ mV}$$

$$\bar{g}_K = 36 \text{ mS/cm}^2$$

$$\bar{g}_{Na} = 120 \text{ mS/cm}^2$$

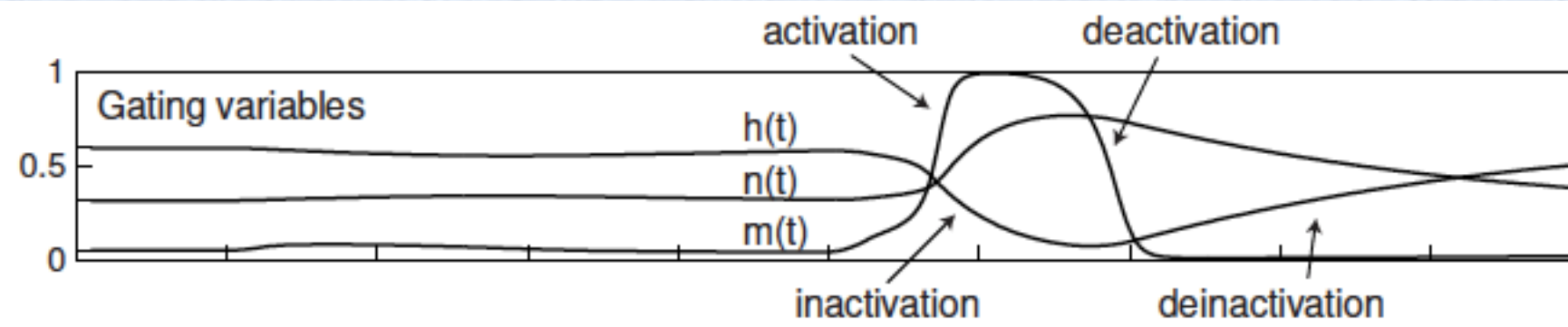
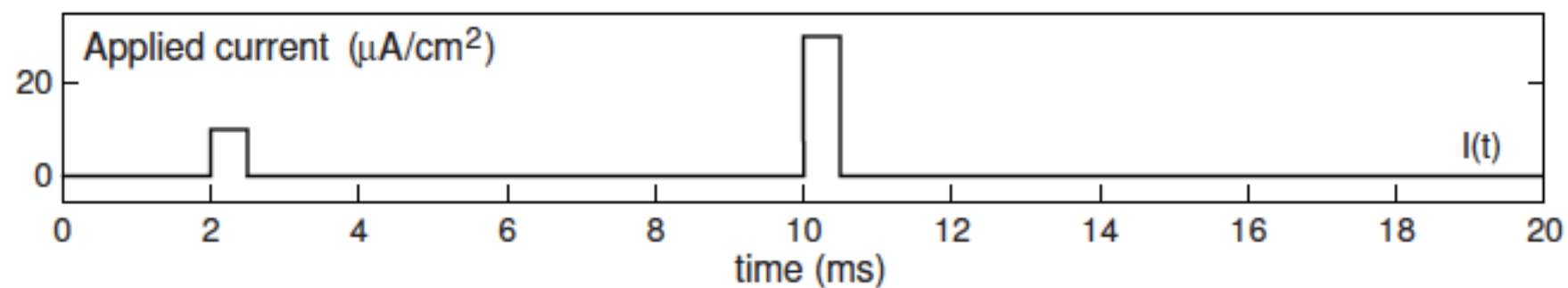
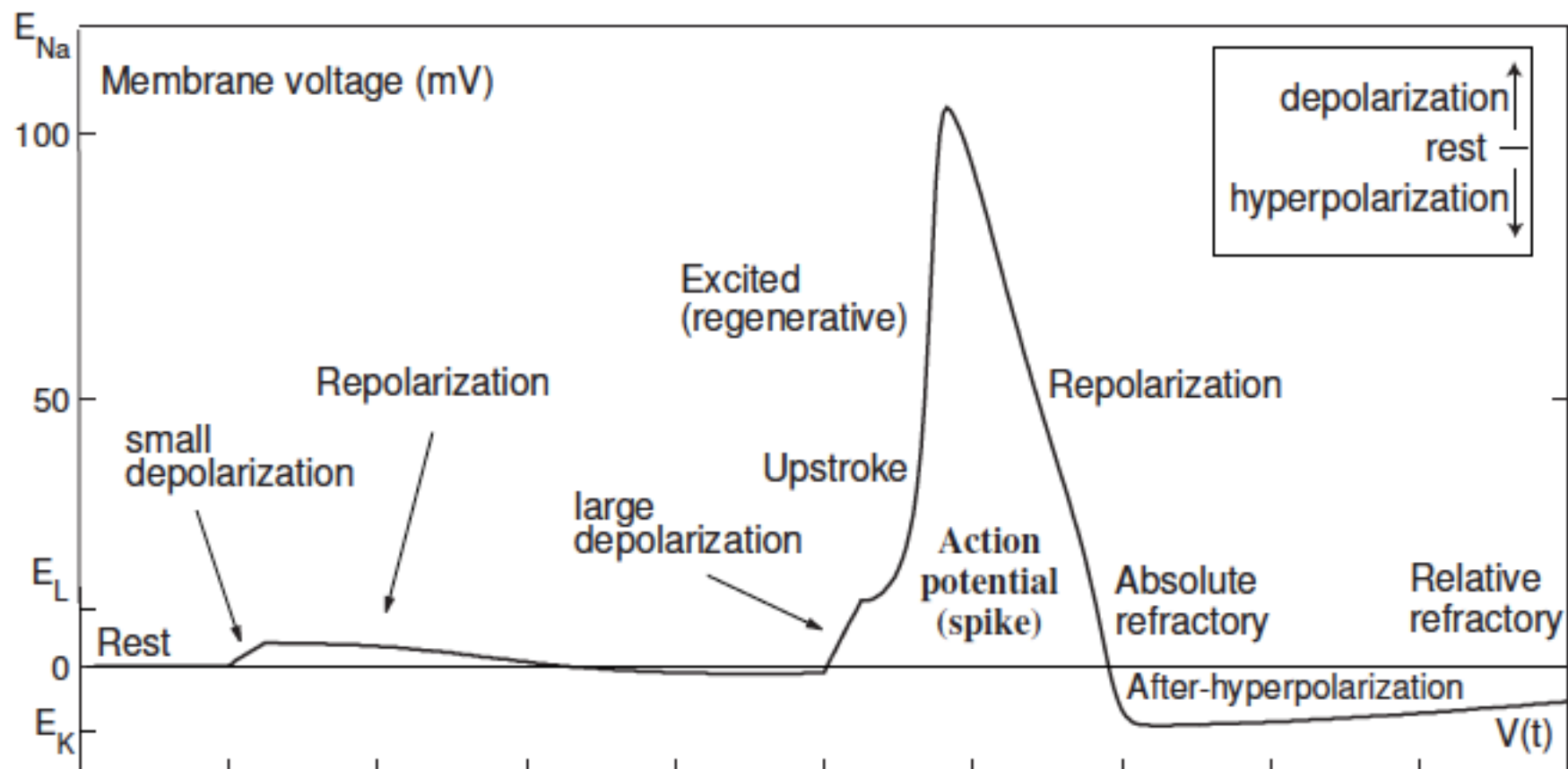
$$g_L = 0.3 \text{ mS/cm}^2$$

# Hodgkin-Huxley model



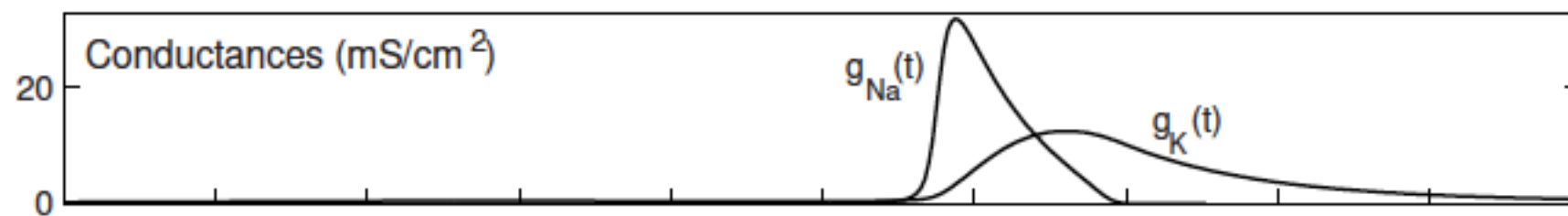
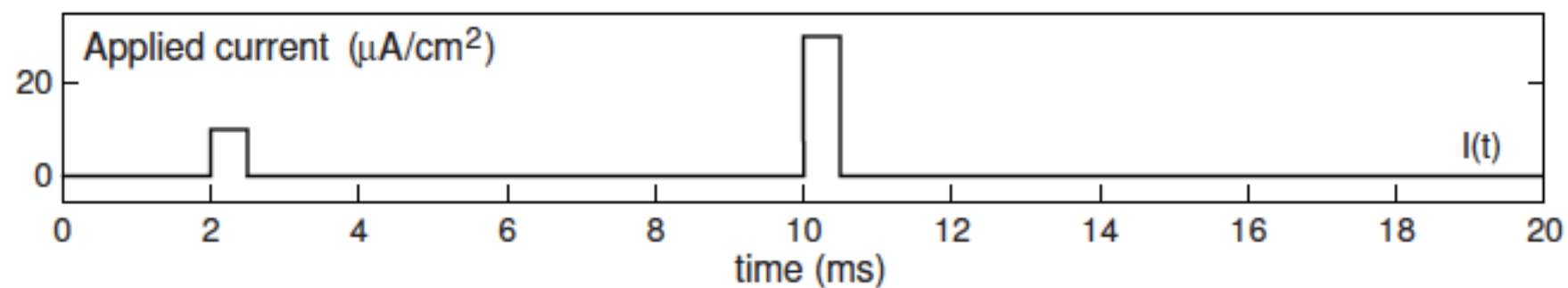
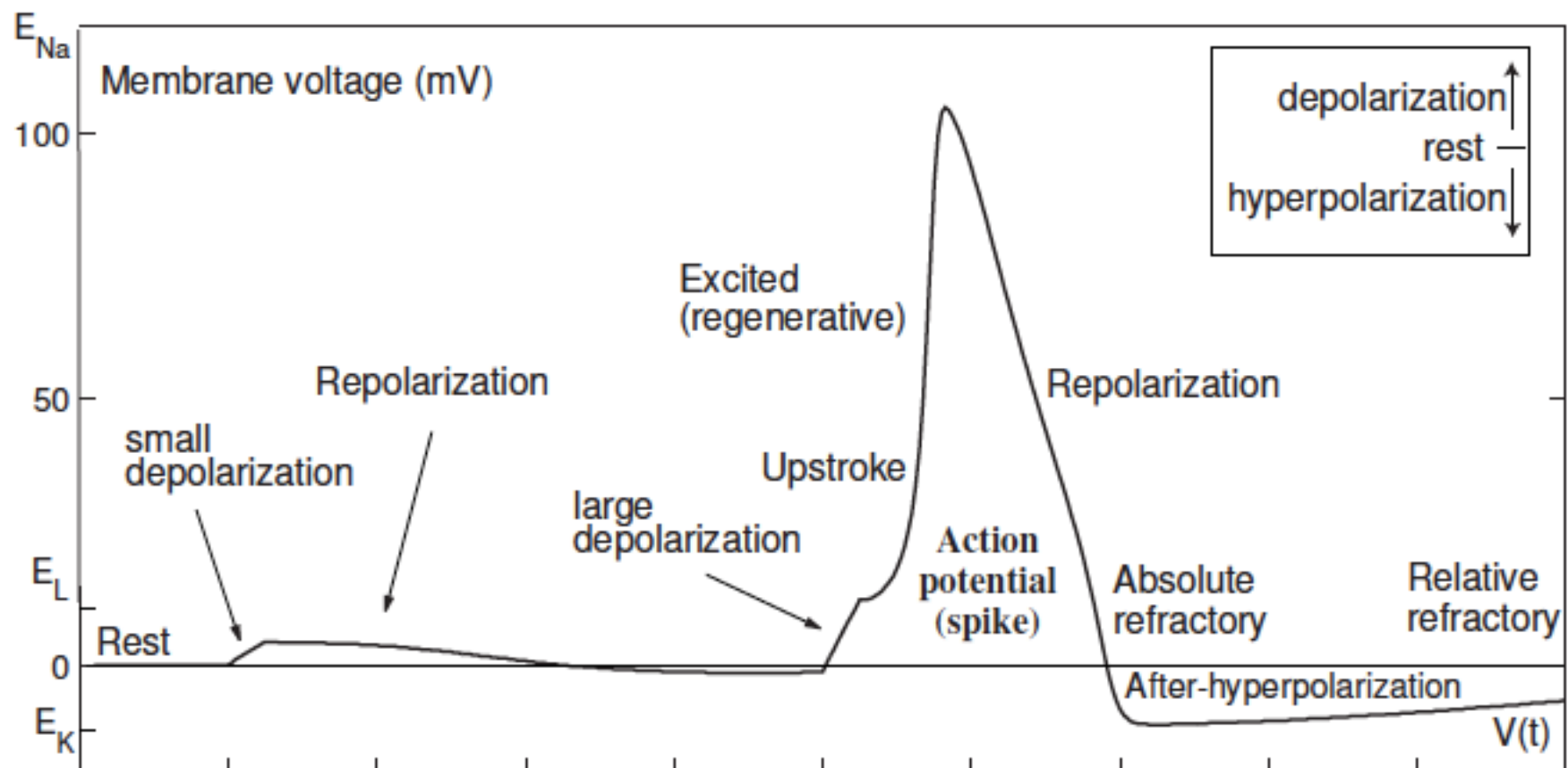


# Hodgkin-Huxley model

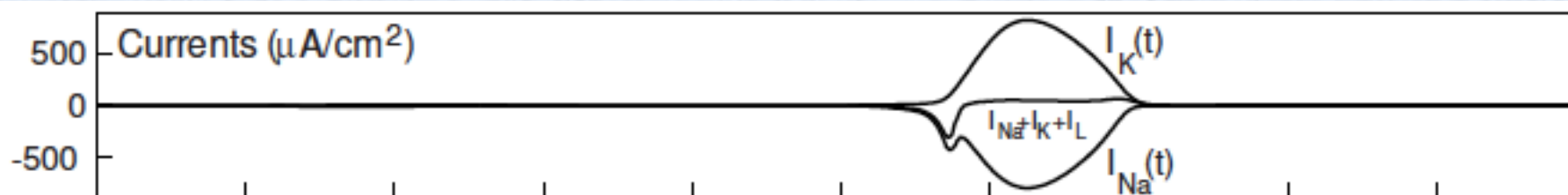
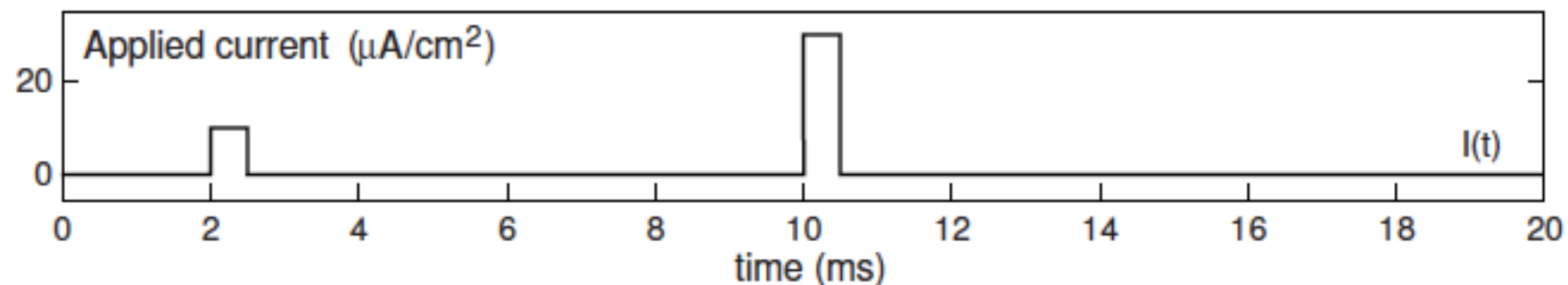
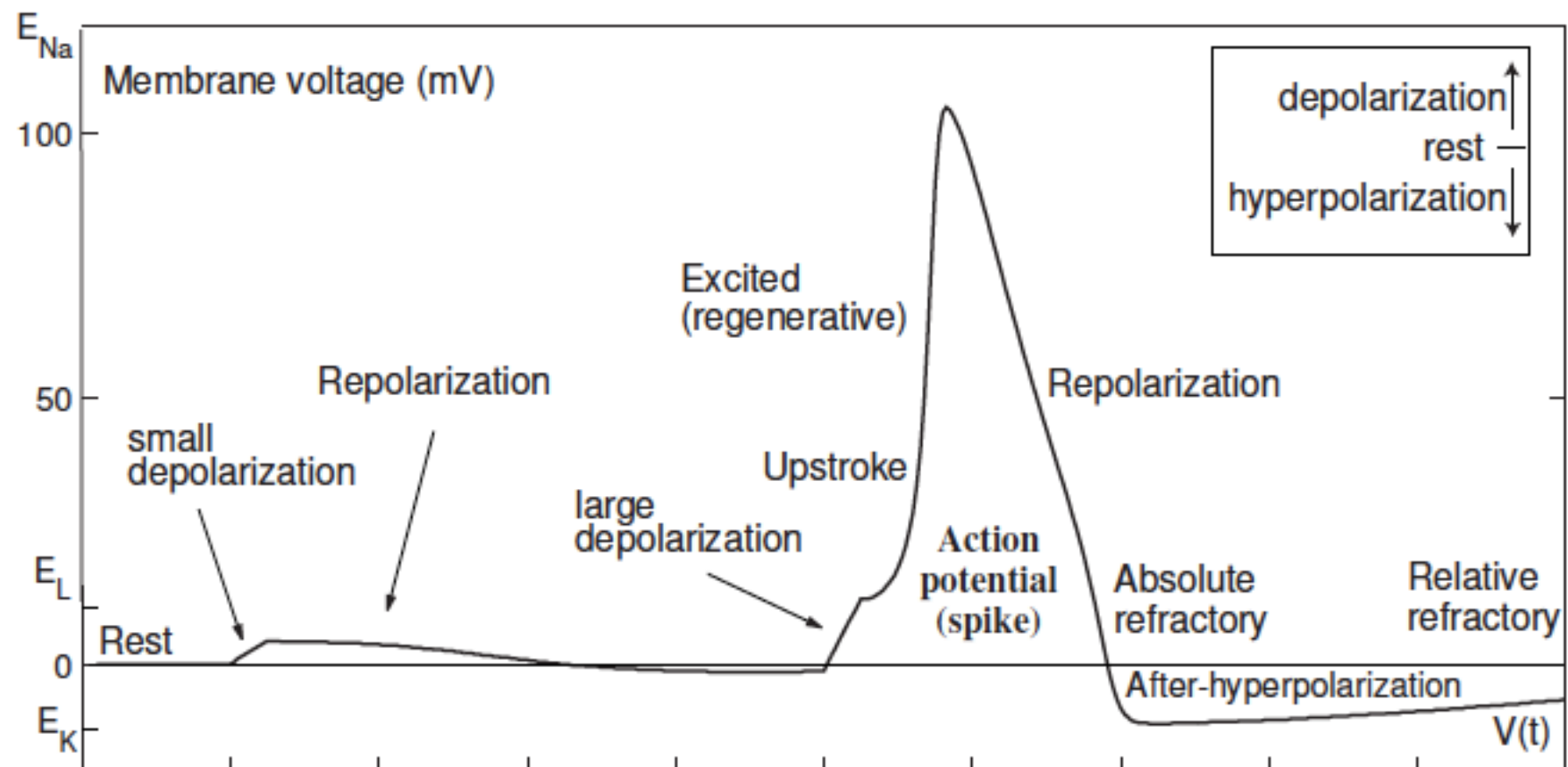




# Hodgkin-Huxley model



# Hodgkin-Huxley model





# Hodgkin-Huxley model

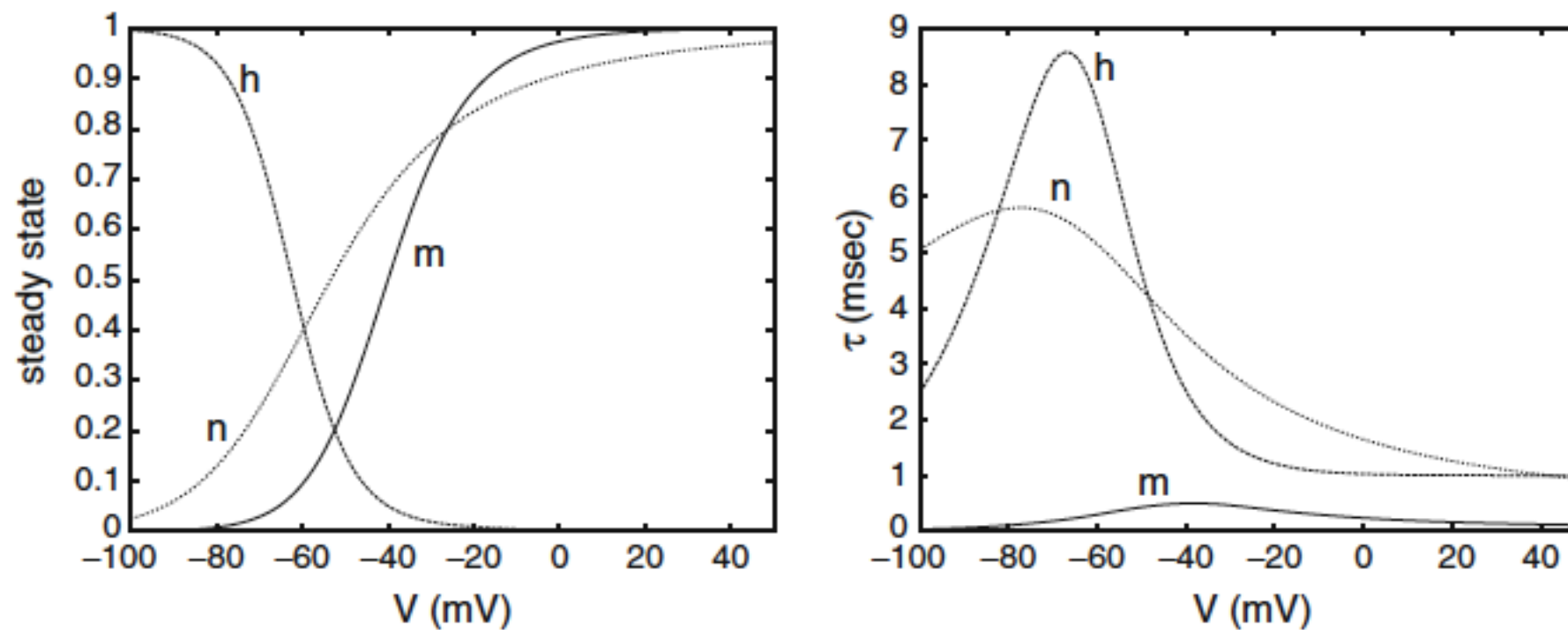


Fig. 1.11 Hodgkin-Huxley functions. *Left* the steady-state opening of the gates and *right* the time constants

# Hodgkin-Huxley model

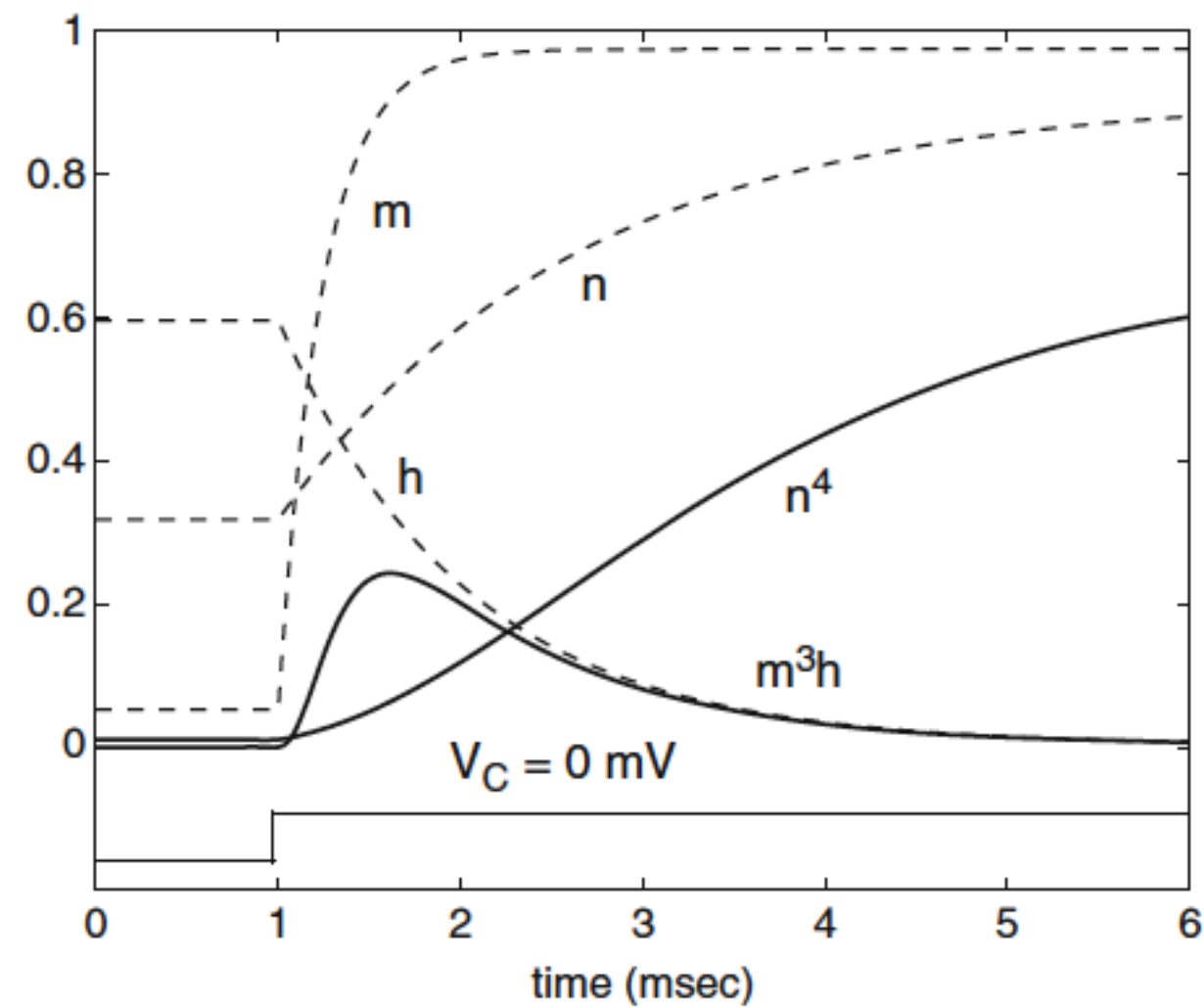
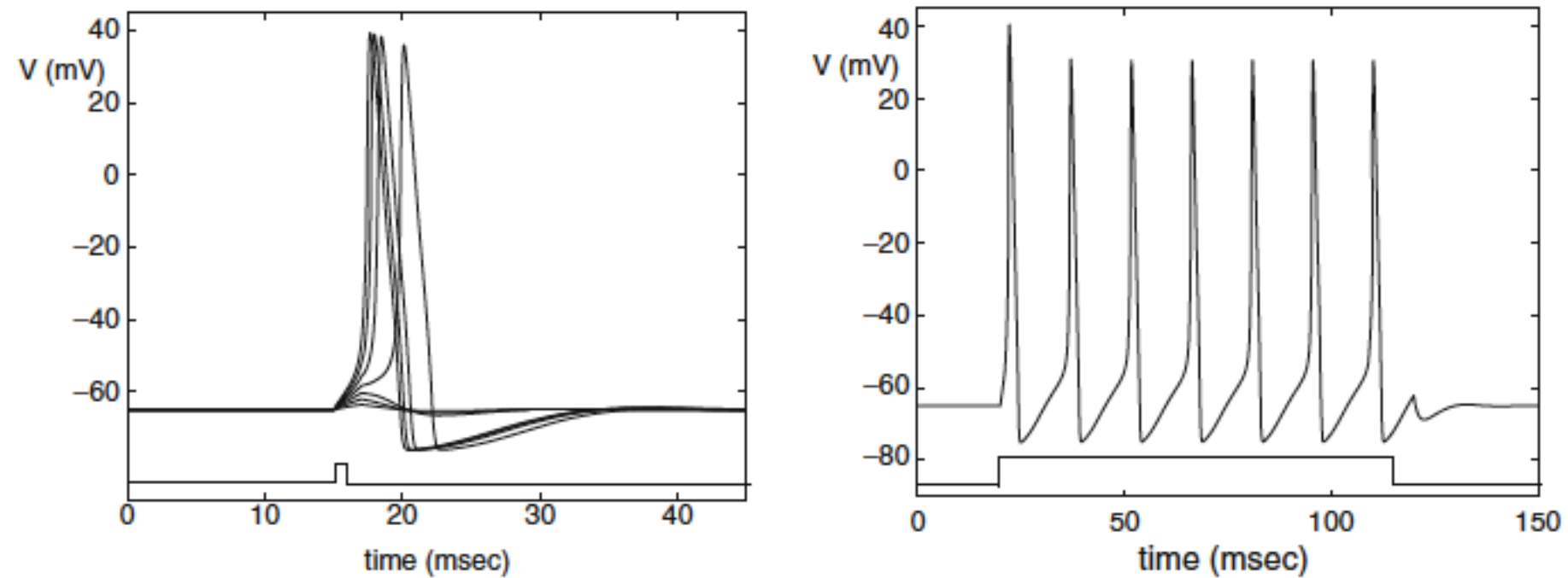


Fig. 1.12 Response of the activation and inactivation variables  $m$ ,  $h$ , and  $n$  to a step in voltage

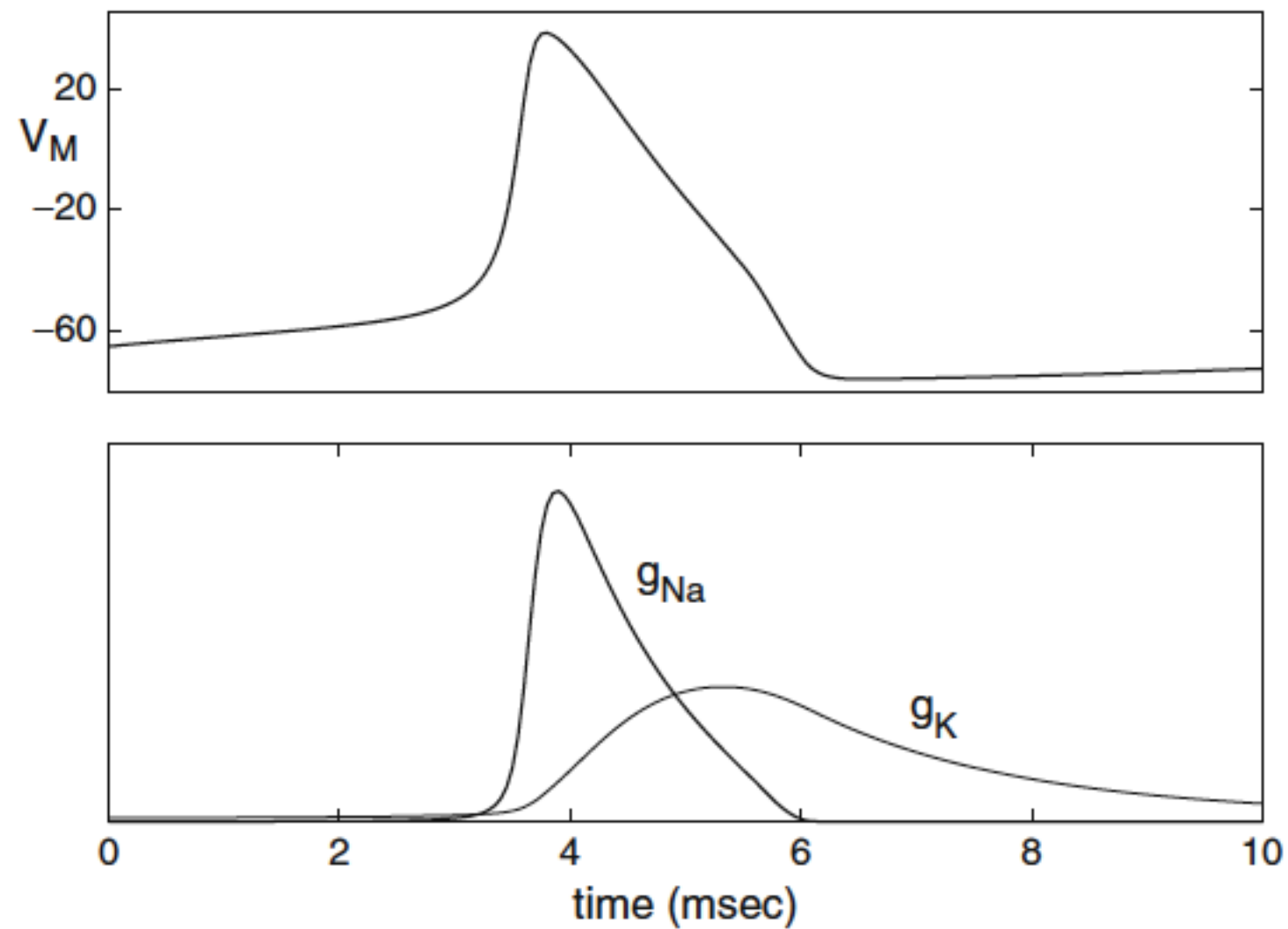


# Hodgkin-Huxley model



**Fig. 1.13** Responses of the Hodgkin-Huxley model to applied currents. *Left* transient responses showing “all-or-none” behavior and *right* sustained periodic response

# Hodgkin-Huxley model



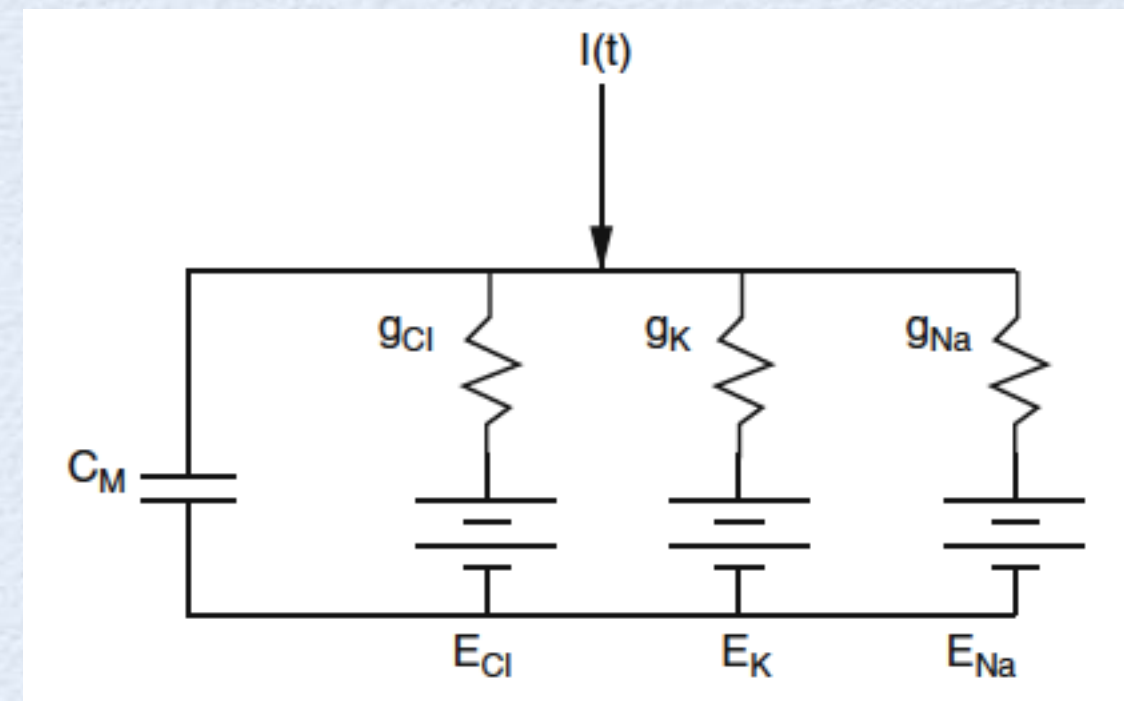
**Fig. 1.14** Solution of the Hodgkin-Huxley equations showing an action potential. Also shown are the  $\text{Na}^+$  and  $\text{K}^+$  conductances



# Hodgkin-Huxley model

## Notation:

- $C_M$ : membrane capacitance ( $c_M$ : specific membrane capacitance)
- $R_M$ : membrane resistance ( $r_M$ : specific membrane resistance)
- $i_{cap}$  ( $= C_M dV_M/dt$ ): capacitive current per unit area
- $I_{cap}$ : total capacitive current
- $I(t)$ : source current
- $i_{ion}$ : ionic current per unit area
- $I_{ion}$ : Total ionic current
- $A$ : area



$$i_{ion} = -g_{Cl}(V_M - E_{Cl}) - g_K(V_M - E_K) - g_{Na}(V_M - E_{Na})$$

$$c_M \frac{dV_M}{dt} = -g_{Cl}(V_M - E_{Cl}) - g_K(V_M - E_K) - g_{Na}(V_M - E_{Na}) + I(t)/A$$

# Hodgkin-Huxley model

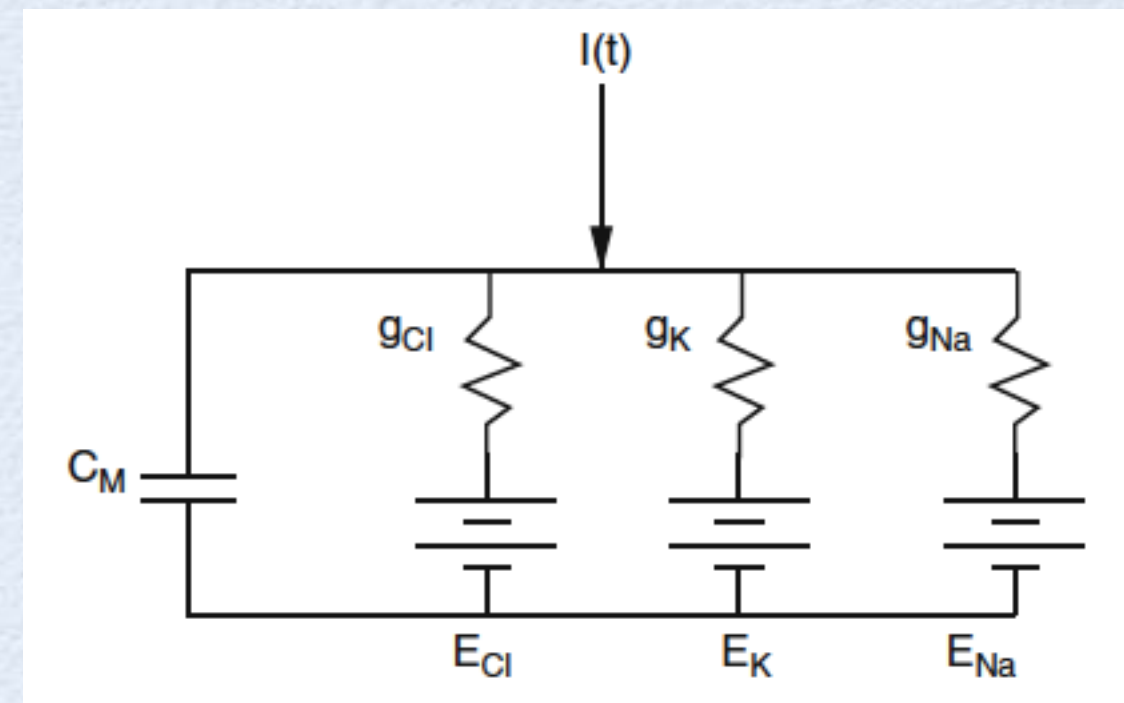
$$C_M \frac{dV_M}{dt} = -g_{Cl}(V_M - E_{Cl}) - g_K(V_M - E_K) - g_{Na}(V_M - E_{Na}) + I(t)/A$$

$$C_M \frac{dV_M}{dt} = -\frac{(V_M - E_R)}{r_M} + I(t)/A$$

$$E_R = (g_{Cl}E_{Cl} + g_K E_K + g_{Na}E_{Na})r_M$$

$$r_M = \frac{1}{g_{Cl} + g_K + g_{Na}}$$

$$V_{ss} = \frac{g_{Cl}E_{Cl} + g_K E_K + g_{Na}E_{Na} + I/A}{g_{Cl} + g_K + g_{Na}}$$





# Spherical cell - passive membrane

## Assumptions:

- Membrane is passive
- Spherical cell of radius  $\rho$
- $E_r = 0$ :  $V_M$  measures the deviation of the membrane potential from rest

## Notation:

- $I_M(t)$ : current flowing across a unit area of the membrane (injected current distributes uniformly across the surface)
- $\tau_M$ : time constant

$$c_M \frac{dV_M}{dt} = -\frac{V_M}{r_M} + I_M(t)$$

$$I_M(t) = \frac{I(t)}{4\pi\rho^2} = \begin{cases} \frac{I_0}{4\pi\rho^2} & \text{if } 0 < t < T \\ 0 & \text{otherwise.} \end{cases}$$



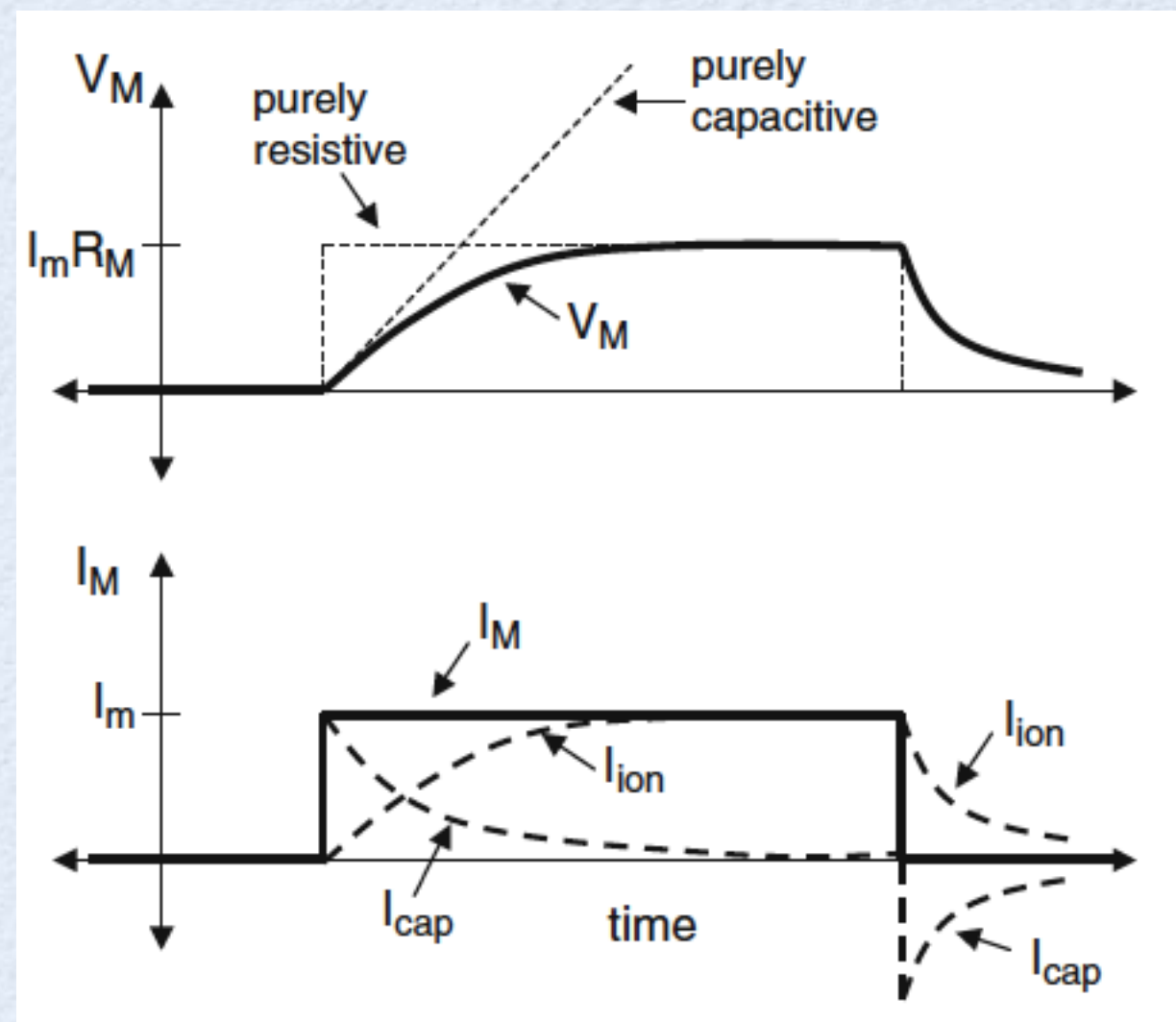
# Spherical cell - passive membrane

$$c_M \frac{dV_M}{dt} = -\frac{V_M}{r_M} + I_M(t)$$

$$I_M(t) = \frac{I(t)}{4\pi\rho^2} = \begin{cases} \frac{I_0}{4\pi\rho^2} & \text{if } 0 < t < T \\ 0 & \text{otherwise.} \end{cases}$$

- $V_M(t) = \frac{r_M I_0}{4\pi\rho^2} \left(1 - e^{-\frac{t}{\tau_M}}\right)$  for  $0 < t < T$ .
- $V_M(t) = V_M(T)e^{-\frac{t}{\tau_M}}$  for  $t > T$ .

**Fig. 1.4** The change of membrane potential in response to a step of current. The membrane potential is shown with a *solid line*. The *dashed lines* show the time courses of the purely capacitive and resistive elements. The *bottom panel* shows the time course of the total membrane current, the ionic current, and the capacitive current





# Spherical cell - passive membrane

$$c_M \frac{dV_M}{dt} = -\frac{V_M}{r_M} + I_M(t)$$

$$I_M(t) = \frac{I(t)}{4\pi\rho^2} = \begin{cases} \frac{I_0}{4\pi\rho^2} & \text{if } 0 < t < T \\ 0 & \text{otherwise.} \end{cases}$$

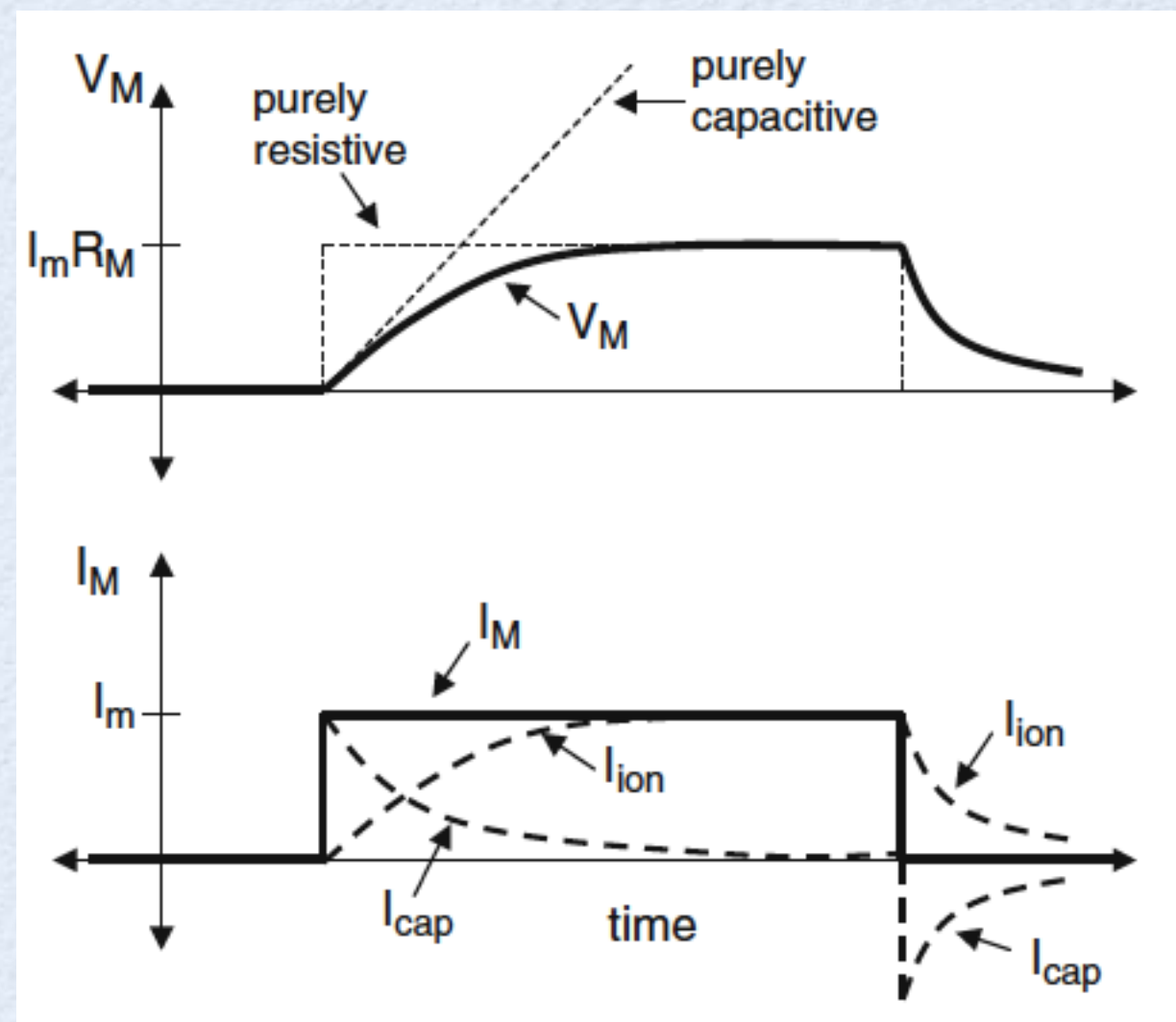
- $V_M(t) = \frac{r_M I_0}{4\pi\rho^2} \left(1 - e^{-\frac{t}{\tau_M}}\right)$  for  $0 < t < T$

- $V_M(t) = V_M(T)e^{-\frac{t}{\tau_M}}$  for  $t > T$

- $R_{INP}$ : Input resistance of the cell

$$I_0 \frac{r_M}{4\pi\rho^2} \equiv I_0 R_{INP}$$

$R_{INP}$  is the slope of the **I-V** curve obtained by plotting the steady-state voltage against the injected current





# The cable equation

- Neurons are **not isopotential**: soma, dendrites, axon and spatial extension
- **Isopotential approach**: appropriate for the study of signal generation but not for the investigation of signal propagation.
- Axons and dendrites **are better approximated by cylinders** than by spheres
- **Goal**: understanding how geometry affects the spread of the signal



# The cable equation

## Assumptions:

- Membrane is passive (applicable to dendrites rather than axons)
- Cell shaped as a long cylinder (or cable)
- Current flows along a single spatial dimension ( $x$ )
- Membrane potential depends only on  $x$ , not on the radial or angular components:  $V_M(x,t)$
- **Cable equation:** Partial differential equation (PDE) that describes how  $V_M(x,t)$  depends on currents entering, leaving, and flowing within the neuron.
- Extracellular space is isopotential



# The cable equation

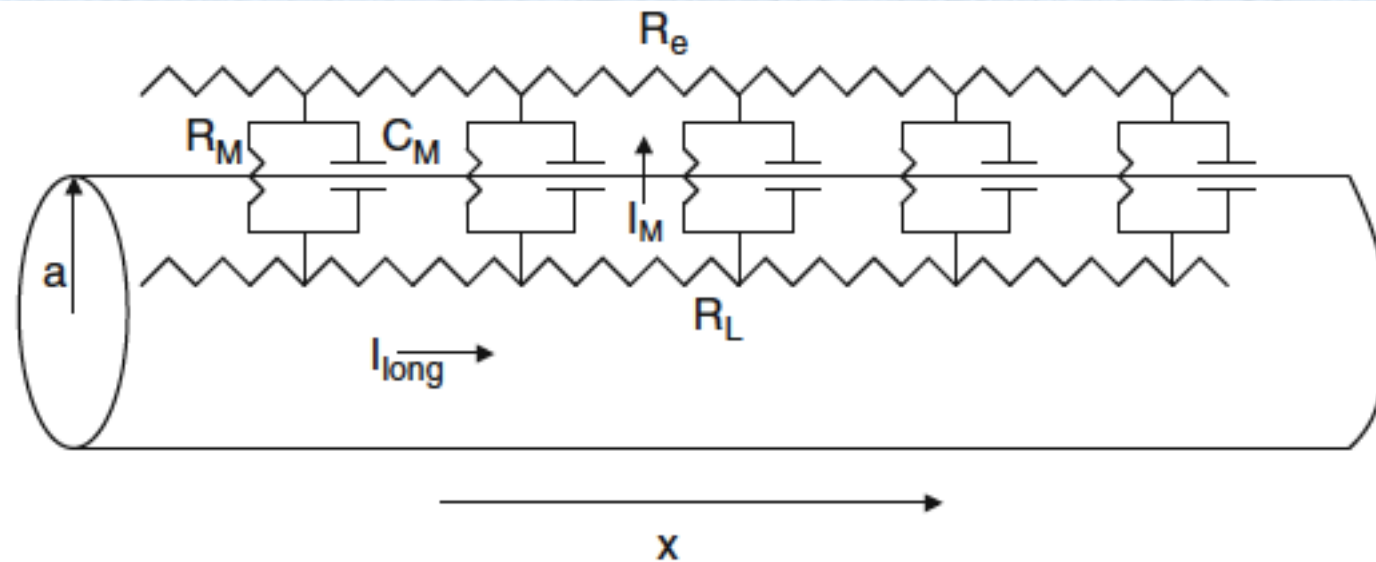


Fig. 1.5 Equivalent circuit for a uniform passive cable.  $I_{long}$  is the current along the inside of the cable,  $I_M$  is the current across the membrane,  $R_L$  is the resistance of the cytoplasm,  $R_e$  is the resistance of the extracellular space,  $R_M$  is the membrane resistance, and  $C_M$  is the membrane capacitance

$I_{long}$ : current along the inside of the cable

$I_M$ : current across the membrane

$R_L$ : resistance of the cytoplasm

$R_e$ : resistance of the extracellular space

$C_M$ : membrane capacitance

$R_M$ : membrane resistance

$a$ : radius of the cable

$\Delta x$ : length of the cable



# The cable equation

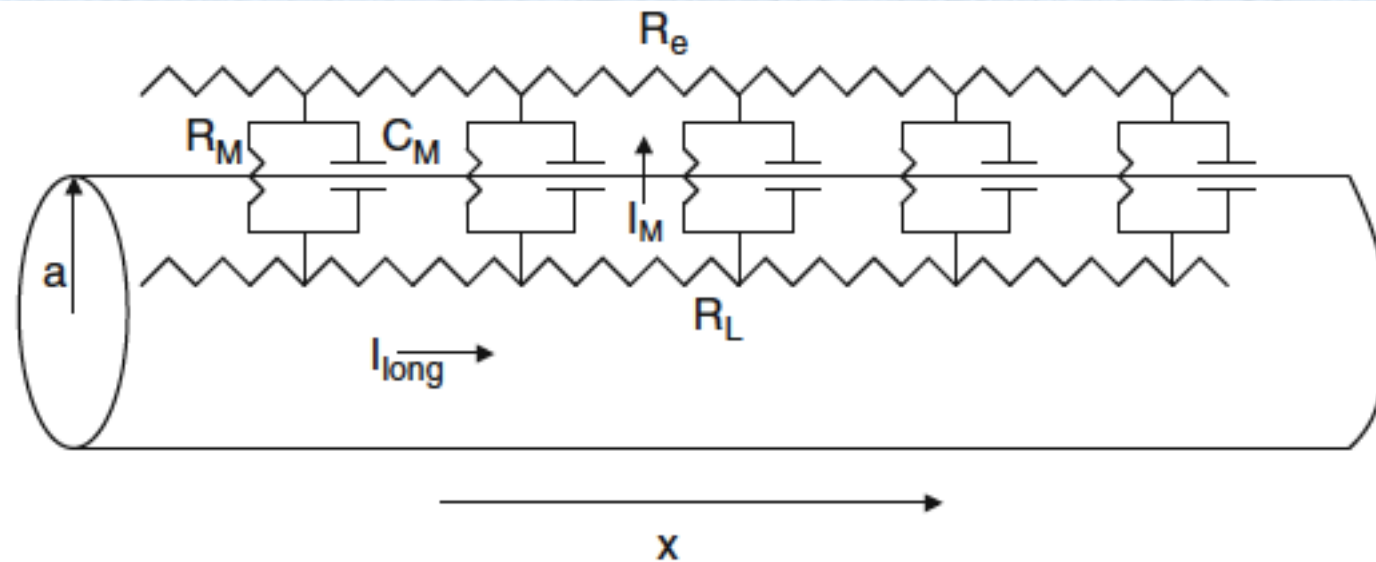


Fig. 1.5 Equivalent circuit for a uniform passive cable.  $I_{\text{long}}$  is the current along the inside of the cable,  $I_M$  is the current across the membrane,  $R_L$  is the resistance of the cytoplasm,  $R_e$  is the resistance of the extracellular space,  $R_M$  is the membrane resistance, and  $C_M$  is the membrane capacitance

## Axial current:

- current flowing along the neuron due to current gradients
- the total resistance of the cytoplasm grows proportionally to the length of the cable
- the total resistance of the cytoplasm is inversely proportional to the cross-sectional area of the cable

$$R_L = r_L \Delta x / (\pi a^2)$$



# The cable equation

Axial current:

$$V_M(x + \Delta x, t) - V_M(x, t) = -I_{\text{long}}(x, t) R_L = -I_{\text{long}}(x, t) \frac{\Delta x}{\pi a^2} r_L \quad \text{Ohm's law}$$

If voltage decreases with increasing  $x$ , then the current is positive

$$\Delta x \rightarrow 0$$

$$I_{\text{long}}(x, t) = -\frac{\pi a^2}{r_L} \frac{\partial V_M}{\partial x}(x, t)$$

ionic current:

$$I_{\text{ion}} = (2\pi a \Delta x) i_{\text{ion}}$$

capacitive current:

$$C_M = (2\pi a \Delta x) c_M$$

$$I_{\text{cap}}(x, t) = (2\pi a \Delta x) c_M \frac{\partial V_M}{\partial t}$$

$$I_{\text{cap}}(x, t) + I_{\text{ion}}(x, t) = -I_{\text{long}}(x + \Delta x, t) + I_{\text{long}}(x, t)$$

Kirchhoff's law



# The cable equation

$$(2\pi a \Delta x) c_M \frac{\partial V_M}{\partial t} + (2\pi a \Delta x) i_{\text{ion}} = \frac{\pi a^2}{r_L} \frac{\partial V_M}{\partial x}(x + \Delta x, t) - \frac{\pi a^2}{r_L} \frac{\partial V_M}{\partial x}(x, t)$$

$$\Delta x \rightarrow 0$$

$$c_M \frac{\partial V_M}{\partial t} = \frac{a}{2r_L} \frac{\partial^2 V_M}{\partial x^2} - i_{\text{ion}}$$

$$i_{\text{ion}} = V_M(x, t) / r_M$$

$$c_M \frac{\partial V_M}{\partial t} = \frac{a}{2r_L} \frac{\partial^2 V_M}{\partial x^2} - \frac{V_M}{r_M}$$

$$\tau_M \frac{\partial V_M}{\partial t} = \lambda^2 \frac{\partial^2 V_M}{\partial x^2} - V_M$$

$$\tau_M = c_M r_M$$

membrane time constant

$$\lambda = \sqrt{\frac{a r_M}{2 r_L}}$$

space (length) constant



# The cable equation

$$\tau_M \frac{\partial V_M}{\partial t} = \lambda^2 \frac{\partial^2 V_M}{\partial x^2} - V_M$$

$$\tau_M = C_M r_M$$

membrane time constant

$$\lambda = \sqrt{\frac{a r_M}{2 r_L}}$$

space (length) constant

Steady state solution (semi-infinite cable):

$$\lambda^2 \frac{d^2 V_{ss}}{dx^2} - V_{ss} = 0$$

$t \rightarrow \infty$

$$\frac{dV_{ss}}{dx}(0) = -\frac{r_L}{\pi a^2} I_0$$

boundary condition

$$V_{ss}(x) = \frac{\lambda r_L}{\pi a^2} I_0 e^{-x/\lambda}$$

solution



# The cable equation

- The thicker the cable the larger the space constant
- Thicker processes transmit signals for greater distances

$$\lambda = \sqrt{\frac{ar_M}{2r_L}}$$

Input resistance:

$$R_{\text{inp}} = V_{\text{ss}}(0)/I_0 = \frac{r_L \lambda}{\pi a^2} = \frac{1}{\pi a^{3/2}} \sqrt{r_M r_L / 2}$$

$R_{\text{inp}}$  &  $\lambda$  can be measured experimentally  $\rightarrow$   $r_M$  &  $R_L$  can be computed from experimental data



# The cable equation

Hodgkin-Huxley model:

$$\frac{a}{2r_L} \frac{\partial^2 V_M}{\partial x^2} = c_M \frac{\partial V_M}{\partial t} + I_K + I_{Na} + I_L$$

$$c_M \frac{\partial V_M}{\partial t} = \frac{a}{2r_L} \frac{\partial^2 V_M}{\partial x^2} - g_K(V_M - E_K) - g_{Na}(V_M - E_{Na}) - g_L(V_M - E_L)$$



# Multiple compartments

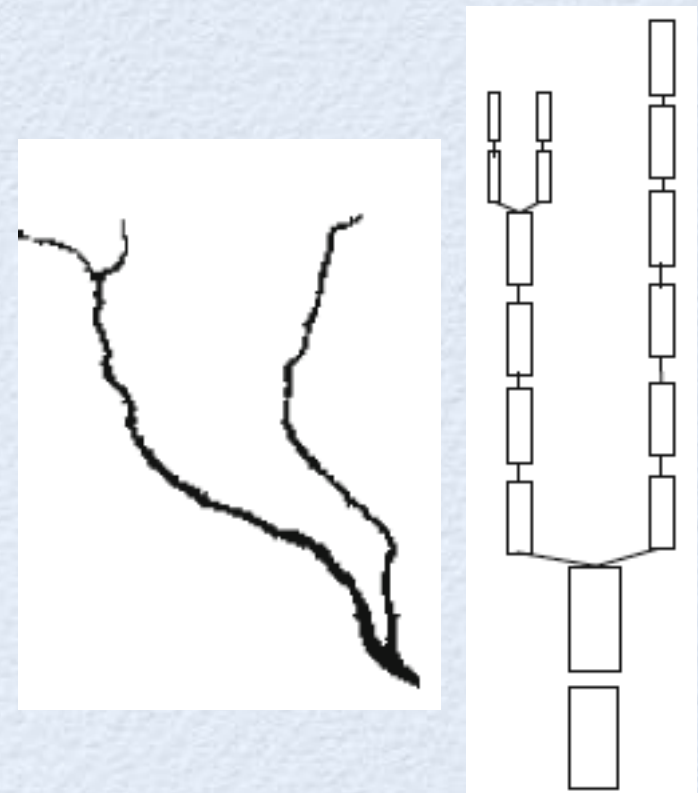
- Neurons are not isopotential (soma, dendrites, axon and spatial extension)
- The majority of the total area of many neurons is occupied by the dendritic tree
- Dendrites have a tree-like structure
- Dendrites enable neurons to connect to thousands of other cells
- Many dendrites have spines (fine structures at the ends of dendrites)
- During development, animals that are raised in rich environments have more extensive dendritic trees and more spines



# Multiple compartments

## Compartmental approach:

- Dendritic tree is divided into small segments or **compartments** that are linked together
- Each compartment is assumed to be isopotential
- Each compartment is viewed as a cylinder
- Each compartment is assumed to be **spatially uniform** in its properties (including **diameter**)
- **Differences** in voltage and nonuniformity in membrane properties **occur between compartments**





# Multiple compartments

## Two-compartment model:

$a_i$ : radius of the compartment  $i$  ( $=1,2$ )

$L_i$ : length of the compartment  $i$  ( $=1,2$ )

$A_i$ : area of the compartment  $i$  ( $=1,2$ )

$$(A_i = 2 \pi a_i L_i)$$

$V_i$ : membrane potential of the compartment  $i$  ( $=1,2$ )

$c_i$ : specific membrane capacitance of the compartment  $i$  ( $=1,2$ )

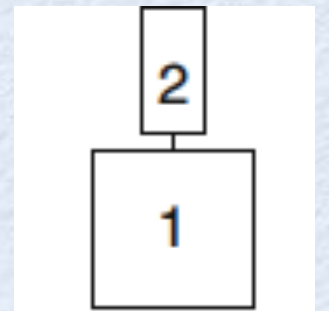
$r_{M,i}$ : specific membrane resistivity of the compartment  $i$  ( $=1,2$ )

$i_{\text{electrode}}$ : Electrode current of the compartment  $i$  ( $=1,2$ )

$r_L$ : Intracellular (or longitudinal) resistivity

$i_{\text{cap}}$ : capacitive current per unit area of membrane for compartment  $i$  ( $=1,2$ )

$i_{\text{ion}}$ : ionic current per unit area of membrane for compartment  $i$  ( $=1,2$ )





# Multiple compartments

Two-compartment model:

$$i_{\text{cap}}^i + i_{\text{ion}}^i = i_{\text{long}}^i + i_{\text{electrode}}^i$$

$$i_{\text{cap}}^i = c_i \frac{dV_i}{dt}$$

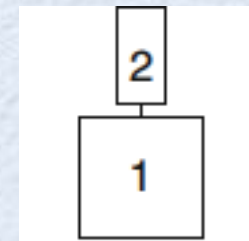
$$i_{\text{ion}}^i = \frac{V_i}{r_{\text{Mi}}}$$

$$R_{\text{long}} = \frac{r_{\text{L}}L_1}{2\pi a_1^2} + \frac{r_{\text{L}}L_2}{2\pi a_2^2}$$

$$i_{\text{long}}^1 = g_{1,2}(V_2 - V_1) \quad \text{and} \quad i_{\text{long}}^2 = g_{2,1}(V_1 - V_2)$$

$$g_{1,2} = \frac{a_1 a_2^2}{r_{\text{L}}L_1(a_2^2L_1 + a_1^2L_2)}$$

$$g_{2,1} = \frac{a_2 a_1^2}{r_{\text{L}}L_1(a_2^2L_1 + a_1^2L_2)}$$





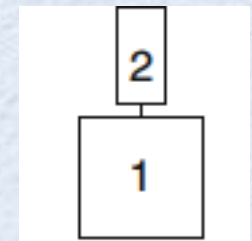
# Multiple compartments

Two-compartment model:

$$i_{\text{cap}}^i + i_{\text{ion}}^i = i_{\text{long}}^i + i_{\text{electrode}}^i$$

$$i_{\text{electrode}}^i = \frac{I_{\text{electrode}}^i}{A_i}$$

$$A_i = 2\pi a_i L_i$$



$$\begin{aligned} c_1 \frac{dV_1}{dt} + \frac{V_1}{r_{M1}} &= g_{1,2}(V_2 - V_1) + \frac{I_{\text{electrode}}^1}{A_1} \\ c_2 \frac{dV_2}{dt} + \frac{V_2}{r_{M2}} &= g_{2,1}(V_1 - V_2) + \frac{I_{\text{electrode}}^2}{A_2} \end{aligned}$$



# Multiple compartments

Two-compartment model:

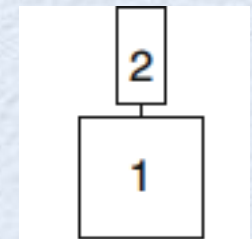
$$\begin{aligned}c_1 \frac{dV_1}{dt} + \frac{V_1}{r_{M1}} &= g_{1,2}(V_2 - V_1) + \frac{I_{\text{electrode}}^1}{A_1} \\c_2 \frac{dV_2}{dt} + \frac{V_2}{r_{M2}} &= g_{2,1}(V_1 - V_2) + \frac{I_{\text{electrode}}^2}{A_2}\end{aligned}$$

$$\begin{aligned}c_1 \frac{dV_1}{dt} + \frac{V_1}{r_{M1}} &= \frac{V_2 - V_1}{r_1} + i_1 \\c_2 \frac{dV_2}{dt} + \frac{V_2}{r_{M2}} &= \frac{V_1 - V_2}{r_2} + i_2\end{aligned}$$

$$r_1 = 1/g_{1,2}$$

$$r_2 = 1/g_{2,1}$$

$$i_i = I_{\text{electrode}}^i / A_i$$





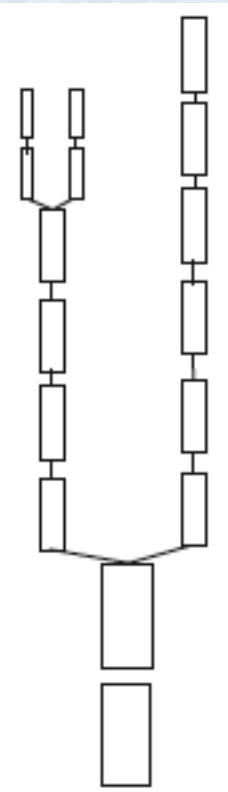
# Multiple compartments

## Cable equation:

- For each cylinder,  $j$ , with radius and length  $a_j$  and  $L_j$  in micrometers, compute the surface area,  $A_j = 2\pi a_j L_j$ , and the axial resistance factor,  $Q_j = L_j / (\pi a_j^2)$ .
- The membrane capacitance is  $C_j = c_j A_j \times 10^{-8}$  and the membrane resistance is  $R_j = (r_{mj} / A_j) \times 10^8$ .
- The coupling resistance between compartments  $j$  and  $k$  is  $R_{jk} = \frac{r_l}{2}(Q_j + Q_k) \times 10^4$ .
- The equations are then

$$C_j \frac{dV_j}{dt} = -\frac{V_j}{R_j} + \sum_{k \text{ connected } j} \frac{V_k - V_j}{R_{jk}} + I_j.$$

The factors of  $10^{\pm 8}$  and  $10^4$  are the conversion from micrometers to centimeters.





# Multiple compartments

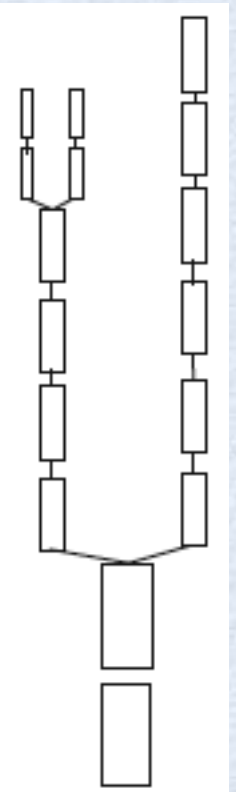
Cable equation:

## Assumptions:

- Cable defined on the interval  $(0, l)$ ,  $l > 0$
- Cable has circular cross-section and diameter  $d(x)$

## Partition:

- Break the cable into  $n$  pieces and define  $x_j = j h$  where  $h = l / n$
- Call  $d_j = d(x_j)$
- Surface area:  $A_j = h$
- Cross-sectional area:  $\pi d_j^2 / 4$
- Neglect the end points





# Multiple compartments

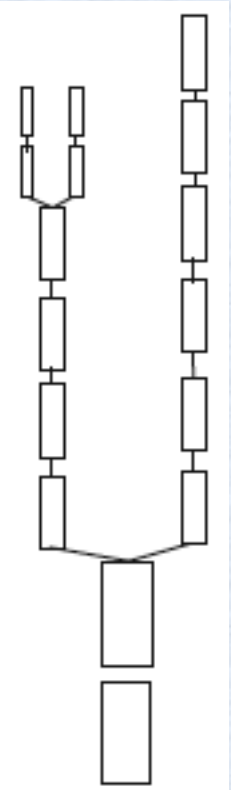
$$c_M A_j \frac{dV_j}{dt} = -\frac{V_j}{r_M/A_j} + \frac{V_{j+1} - V_j}{4r_L h / (\pi d_{j+1}^2)} + \frac{V_{j-1} - V_j}{4r_L h / (\pi d_j^2)}$$

Dividing by  $h$

$$\frac{\pi}{h} \left( \frac{d_{j+1}^2 (V_{j+1} - V_j)}{4r_L h} - \frac{d_j^2 (V_j - V_{j-1})}{4r_L h} \right)$$

As  $h \rightarrow 0$ ,

$$\frac{\pi}{4r_L} \frac{\partial}{\partial x} \left( d^2(x) \frac{\partial V}{\partial x} \right)$$





# Multiple compartments

dividing by  $\pi d(x)$

$$c_M \frac{\partial V}{\partial t} = -\frac{V}{r_M} + \frac{1}{4r_L d(x)} \frac{\partial}{\partial x} \left( d^2(x) \frac{\partial V}{\partial x} \right)$$

$$\frac{\pi d_j^2 (V_{j-1} - V_j)}{4r_L h}$$

has dimensions of current

as  $h \rightarrow 0$

$$I_L = -\frac{\pi d^2(x)}{4r_L} \frac{\partial V}{\partial x}$$

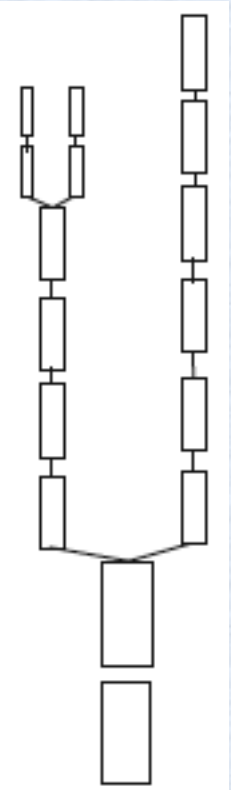
longitudinal current

$d(x) = d$  is constant.

$$\tau \frac{\partial V}{\partial t} = -V + \lambda^2 \frac{\partial^2 V}{\partial x^2}$$

$$\tau = r_M c_M$$

$$\lambda = \sqrt{\frac{dr_M}{4r_L}}$$





# Multiple compartments

$$d(x) = d \text{ is constant.}$$

$$\tau \frac{\partial V}{\partial t} = -V + \lambda^2 \frac{\partial^2 V}{\partial x^2}$$

$$\tau = r_M c_M$$

$$\lambda = \sqrt{\frac{d r_M}{4 r_L}}$$

$$c_M = 1 \mu\text{F}/\text{cm}^2$$

$$r_M = 20,000 \Omega \text{ cm}^2$$

$$r_L = 100 \Omega \text{ cm.}$$

$$d(x) = 2 \mu\text{m}$$



$$\tau = 20 \text{ ms and } \lambda = 1 \text{ mm.}$$

