

Theoretical & computational  
Neuroscience:

*Programming the Brain*

(BM 6140)

2-credit

What are the underlying assumptions ?

# Assumptions

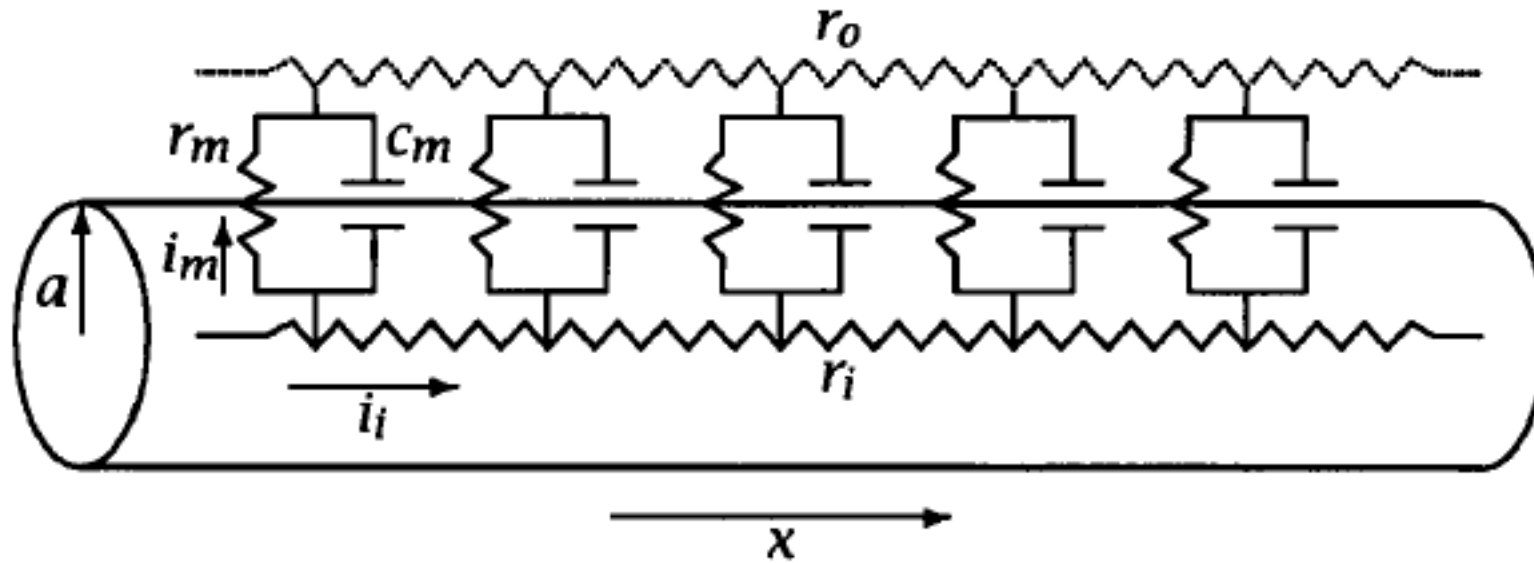
- Ion channel = Cell ???

For realistic cell, increase in surface area causes decrease in input resistance

- Even after this compensation, entire cell is not at same potential

How do we modify the equivalent circuit ?

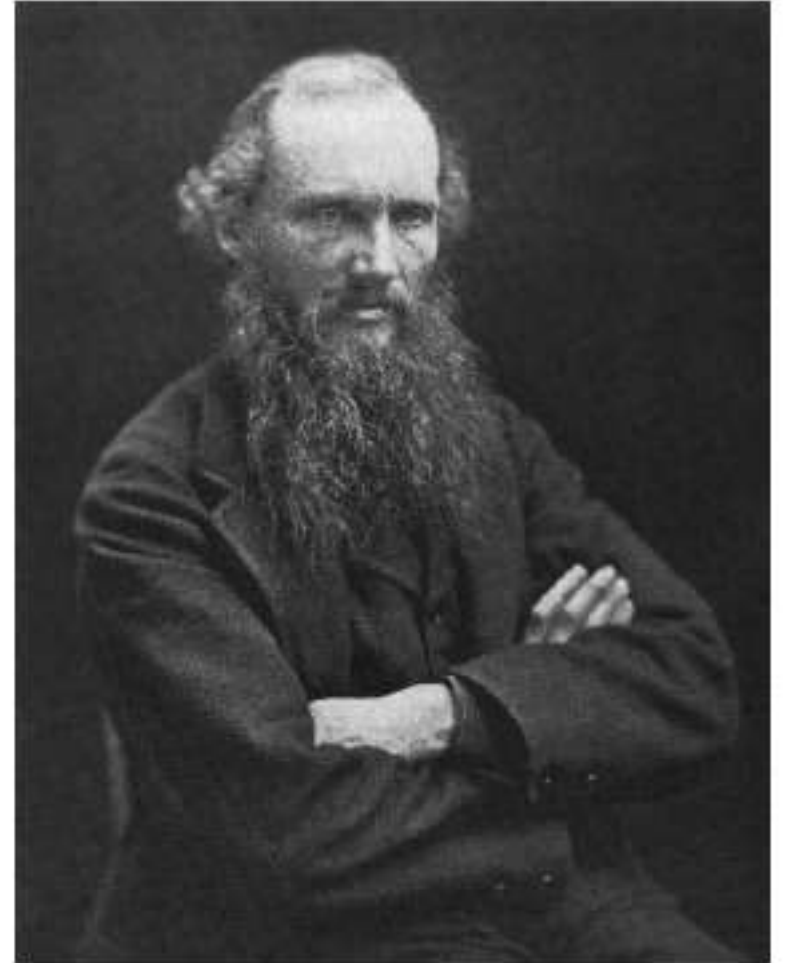
# Neurons are not point objects !



**Figure 4.6** Diagram for current flow in a uniform cylinder such as an axon or segment of dendrite.

# Cable theory

- Lord Kelvin (William Thomson)
- Originally developed for the transatlantic telegraph cable laying project



**Lord Kelvin  
(William Thomson)  
1824-1907**

# Spatially extended cell

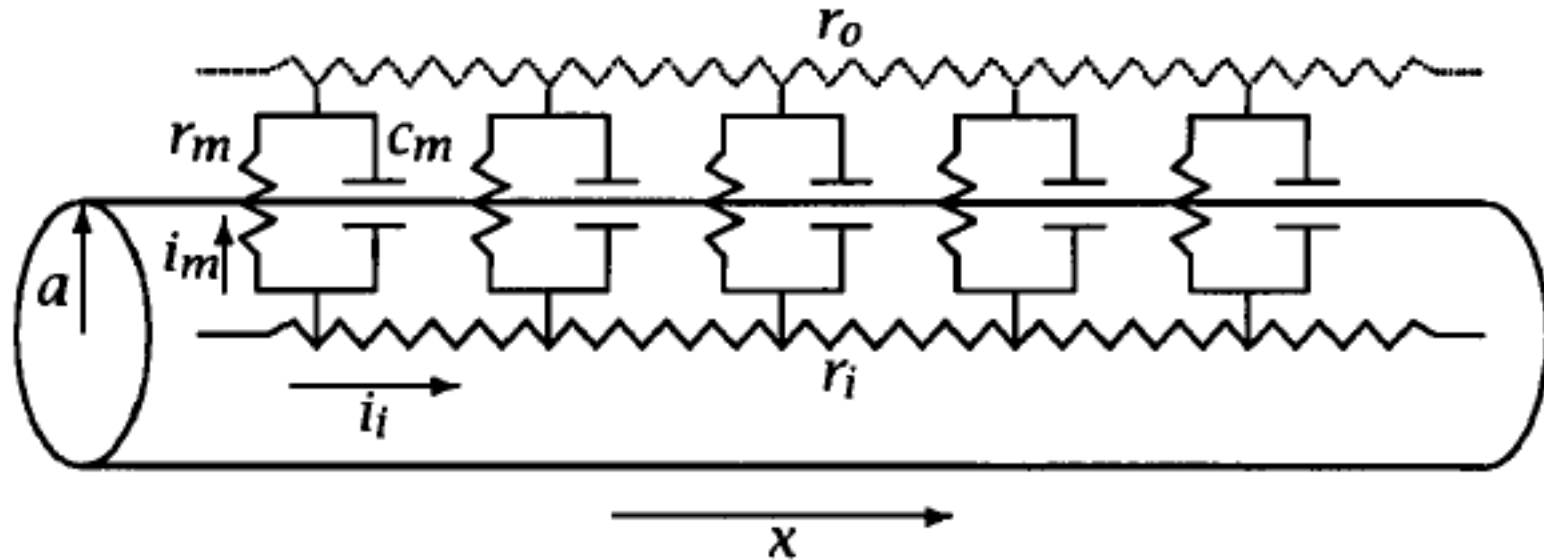
Assume extracellular medium is isopotential

$$\frac{\partial V_m(x, t)}{\partial x} = -r_i i_i.$$

$$\frac{\partial i_i}{\partial x} = -i_m.$$

$$\frac{\partial^2 V_m}{\partial x^2} = -r_i \frac{\partial i_i}{\partial x} = r_i i_m.$$

$$\frac{1}{r_i} \frac{\partial^2 V_m}{\partial x^2} = c_m \frac{\partial V_m}{\partial t} + \frac{V_m}{r_m}.$$



$$i_m = i_C + i_{\text{ionic}} = c_m \frac{\partial V_m}{\partial t} + \frac{V_m}{r_m}$$

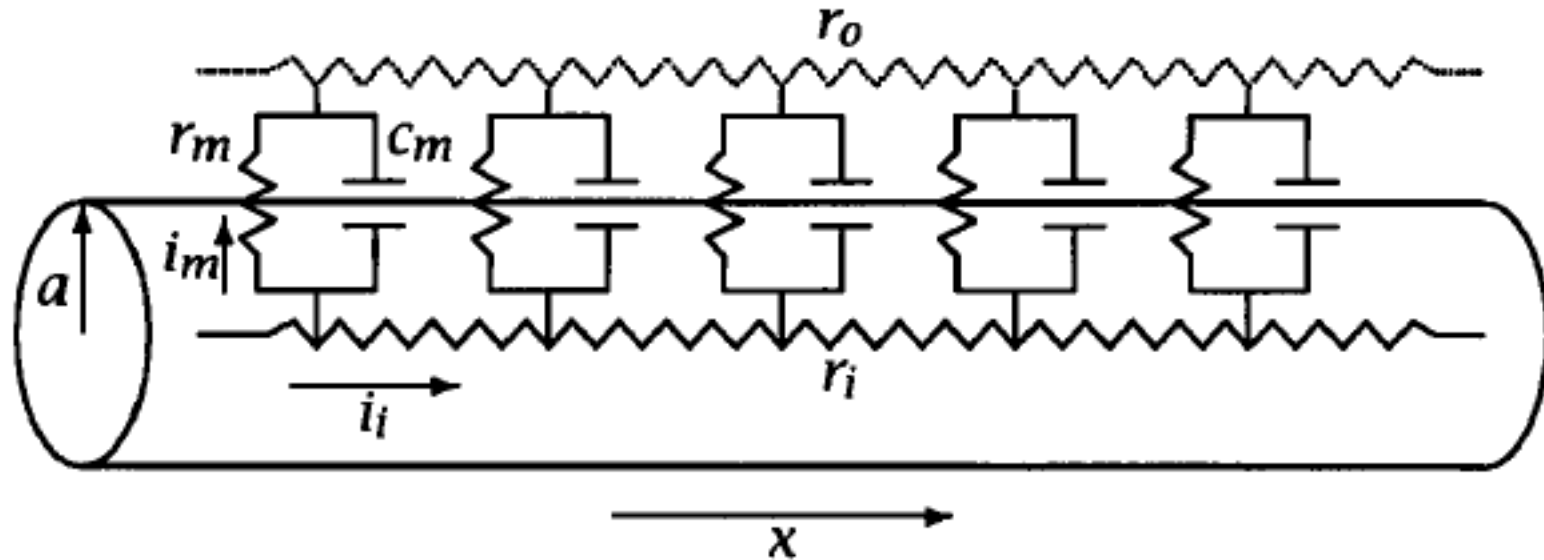
# Spatially extended cell

$$\frac{1}{r_i} \frac{\partial^2 V_m}{\partial x^2} = c_m \frac{\partial V_m}{\partial t} + \frac{V_m}{r_m}.$$

$$\lambda^2 \frac{\partial^2 V_m}{\partial x^2} = \tau_m \frac{\partial V_m}{\partial t} + V_m,$$

where

$$\lambda = \sqrt{\frac{r_m}{r_i}} = \sqrt{\frac{aR_m}{2R_i}}.$$



Note the conversion between  $r$  and  $R$

# Solutions of the cable equation : assuming Infinite cable

A general solution to the cable equation is

$$V_m(T, X) = \frac{r_i I_0 \lambda}{4} \left[ e^{-X} \operatorname{erfc} \left( \frac{X}{2\sqrt{T}} - \sqrt{T} \right) - e^X \operatorname{erfc} \left( \frac{X}{2\sqrt{T}} + \sqrt{T} \right) \right],$$

X, T are distance and time  
normalized by space and time  
constants

$$\operatorname{erfc}(x) = 1 - \operatorname{erf}(x) = 1 - \frac{2}{\sqrt{\pi}} \int_0^x e^{-y^2} dy = \frac{2}{\sqrt{\pi}} \int_x^\infty e^{-y^2} dy,$$

where  $\operatorname{erf}(0) = 0$ ,  $\operatorname{erf}(\infty) = 1$ , and  $\operatorname{erf}(-x) = -\operatorname{erf}(x)$ .



# Why are we looking at cable properties ?

Neuronal inputs come in at the dendrite.

But the integration happens (at least was thought so until recently) at soma

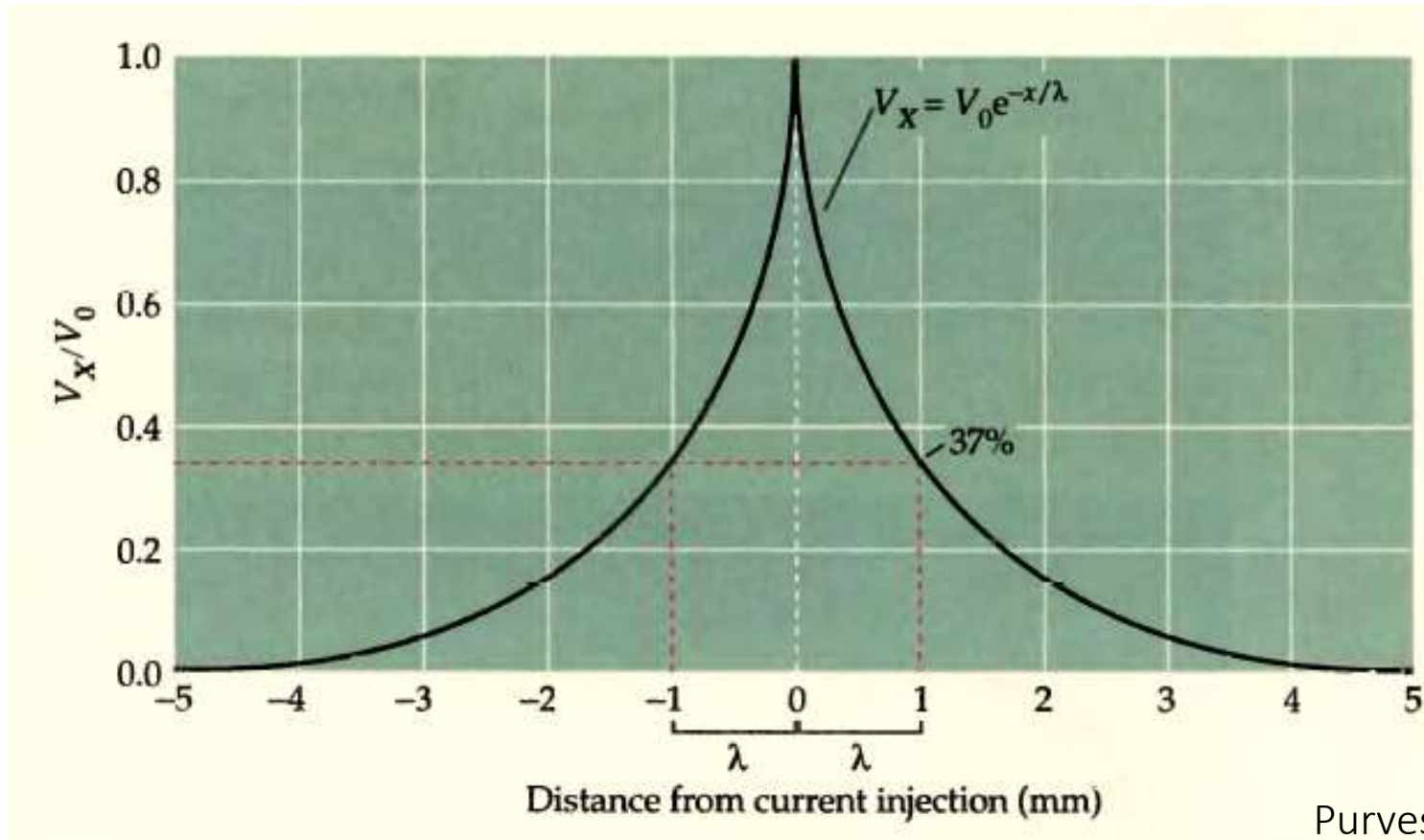
Cable properties are critical to understanding computational properties of a neuron

# Insights from infinite cable theory solutions

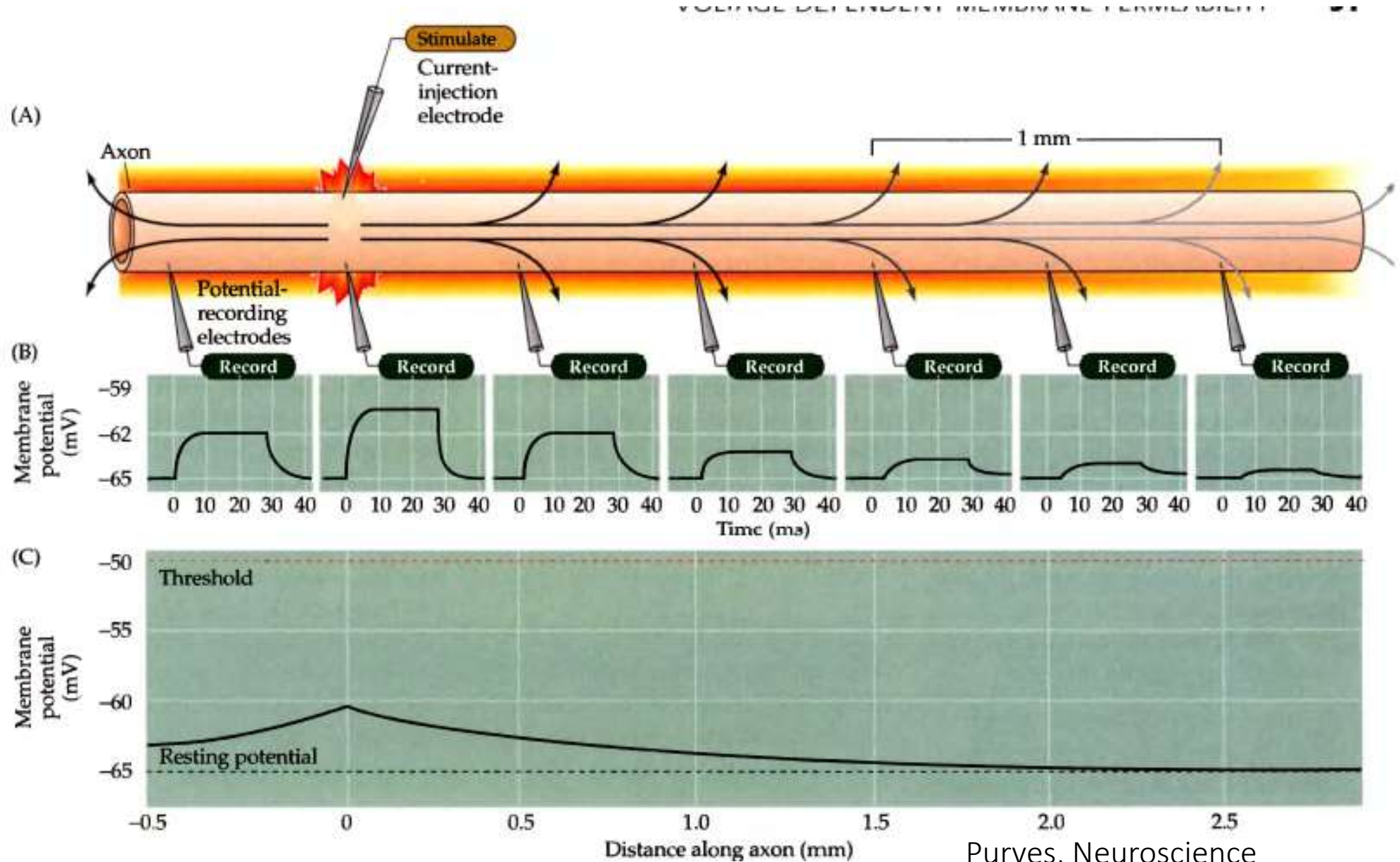
$V_m(\infty, X)$ : *Steady state Voltages at different points* = ?

# Insights from infinite cable theory solutions

$$V_m(\infty, X) = \frac{r_i I \lambda}{2} e^{\frac{-x}{\lambda}}$$



# Passive propagation of neuron



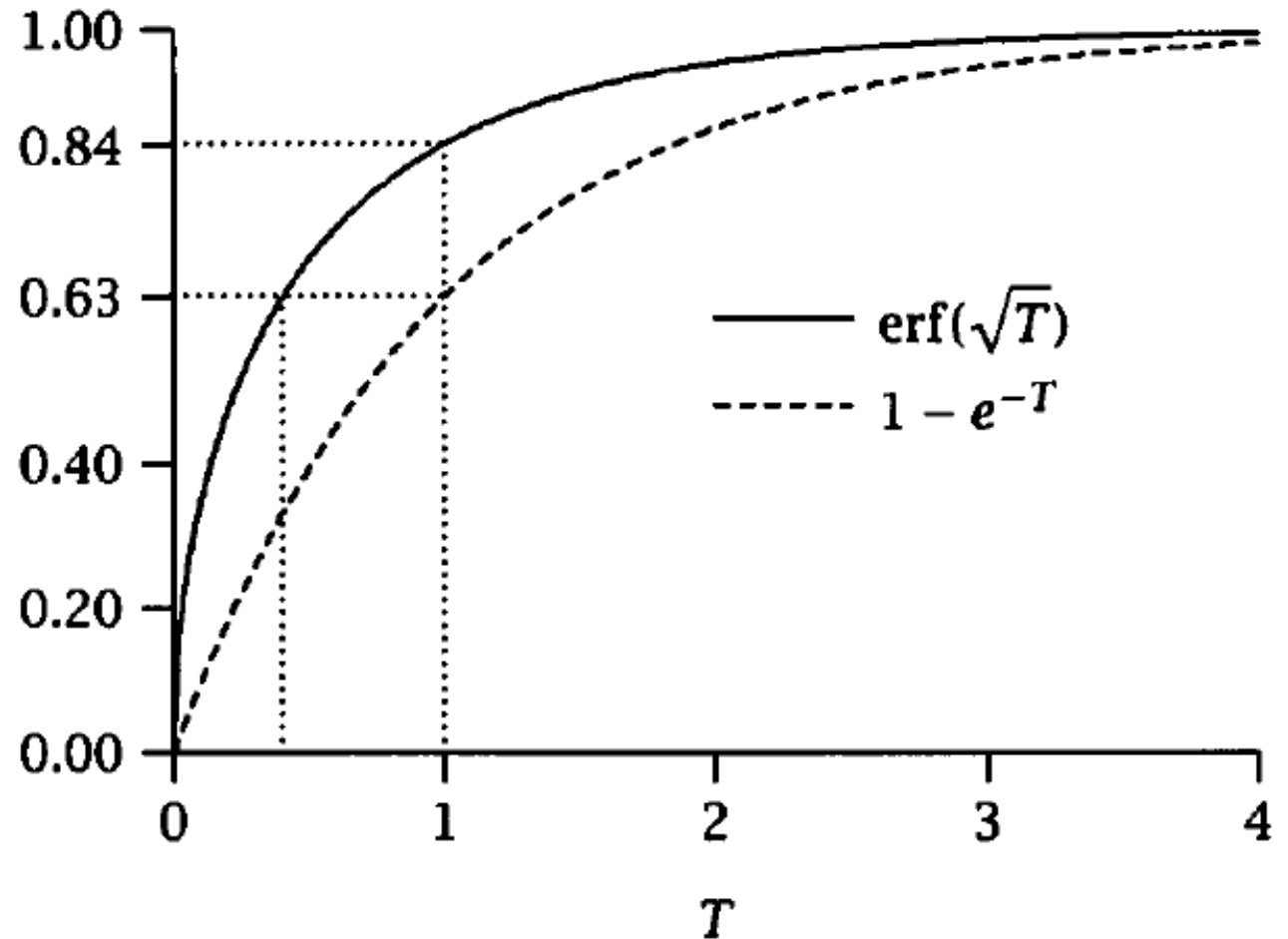
# Insights from infinite cable theory solutions

$$V_m(T, 0) = ?$$

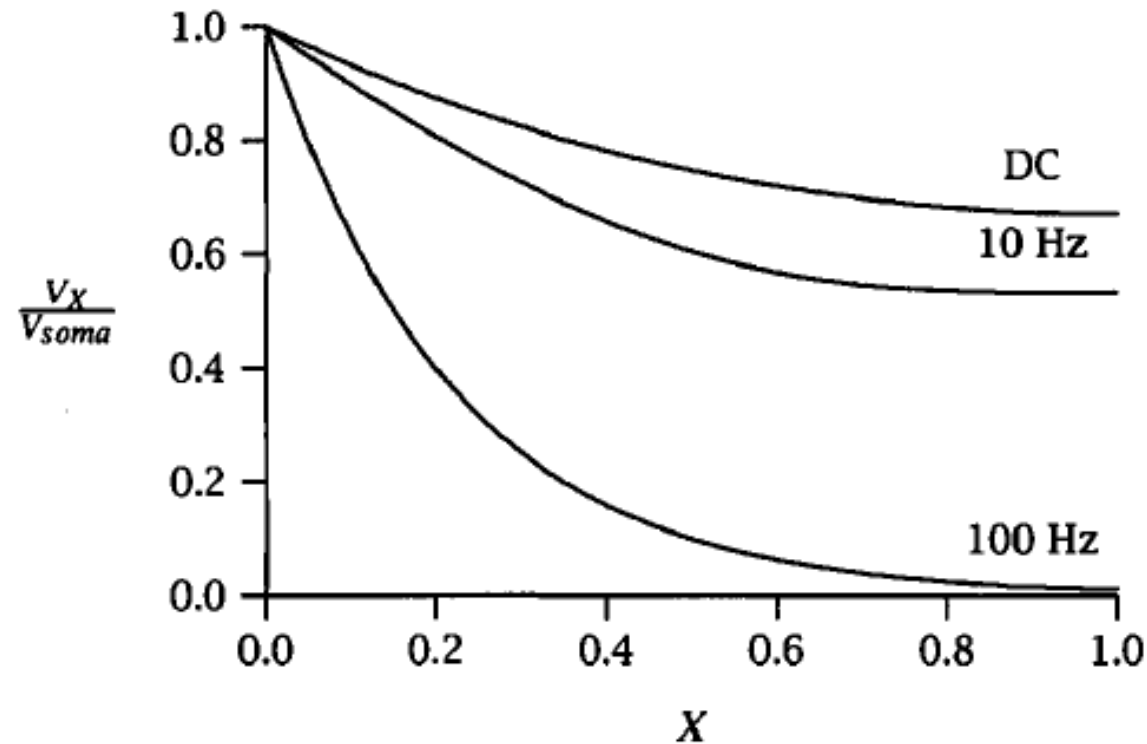
# Insights from infinite cable theory solutions

$$V_m(T, 0) = \frac{r_i I \lambda}{2} \operatorname{erfc}\left(\sqrt{\frac{t}{\tau}}\right)$$

Even with finite cable length it can be shown that charging is faster than in an isopotential sphere  $v$



# AP decays faster than a synaptic potential



**Figure 4.18** Voltage attenuation along a finite-length cable ( $L = 1$ ) for current injections (DC to 100 Hz) at  $X = 0$  (i.e., soma) ( $R_m = 50,000 \Omega\text{-cm}^2$ ).

# Insights from infinite cable theory solutions

*What is this quantity  $\frac{V_m(\infty, 0)}{I}$  ?*



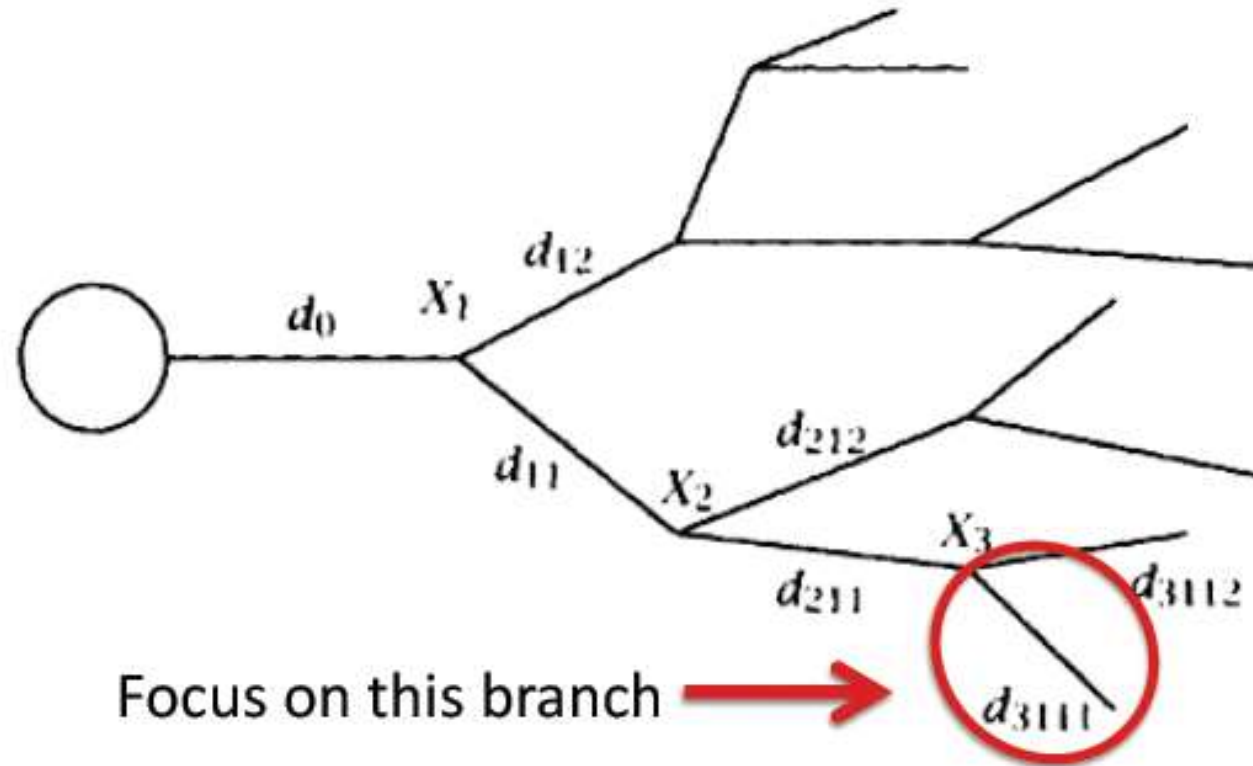
# Insights from infinite cable theory solutions

$$\frac{V_m(\infty, 0)}{I} = \textit{Input resistance} = \frac{r_i \lambda}{2} = \frac{\sqrt{r_m r_i}}{2} = \frac{\sqrt{\frac{R_m R_i}{2}}}{2\pi a^{(\frac{3}{2})}}$$

# Rall's law

Take an arbitrary dendritic tree

Represent the soma as an isopotential sphere

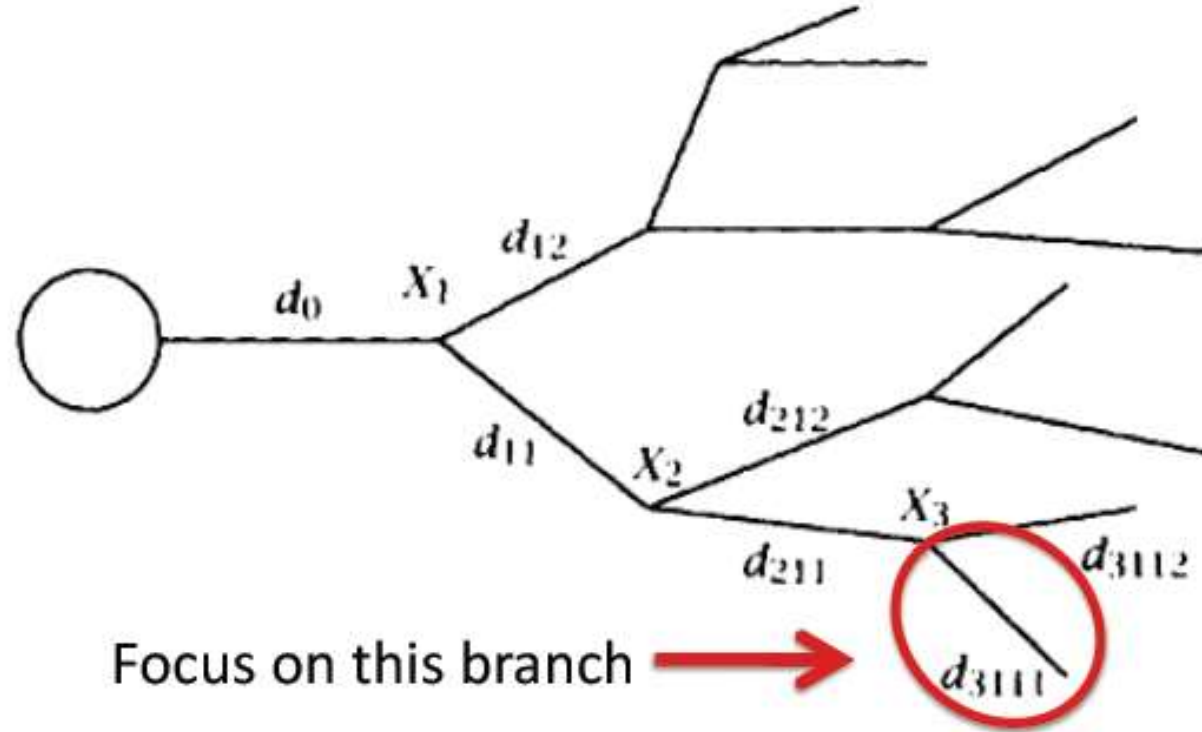


As an semi-infinite cylinder, its input resistance as an independent cable is:

$$R_{in}(3111) = \frac{2\sqrt{R_m R_i}}{\pi d_{3111}^{3/2}}$$

# Rall's law

## Conductances in parallel sum up

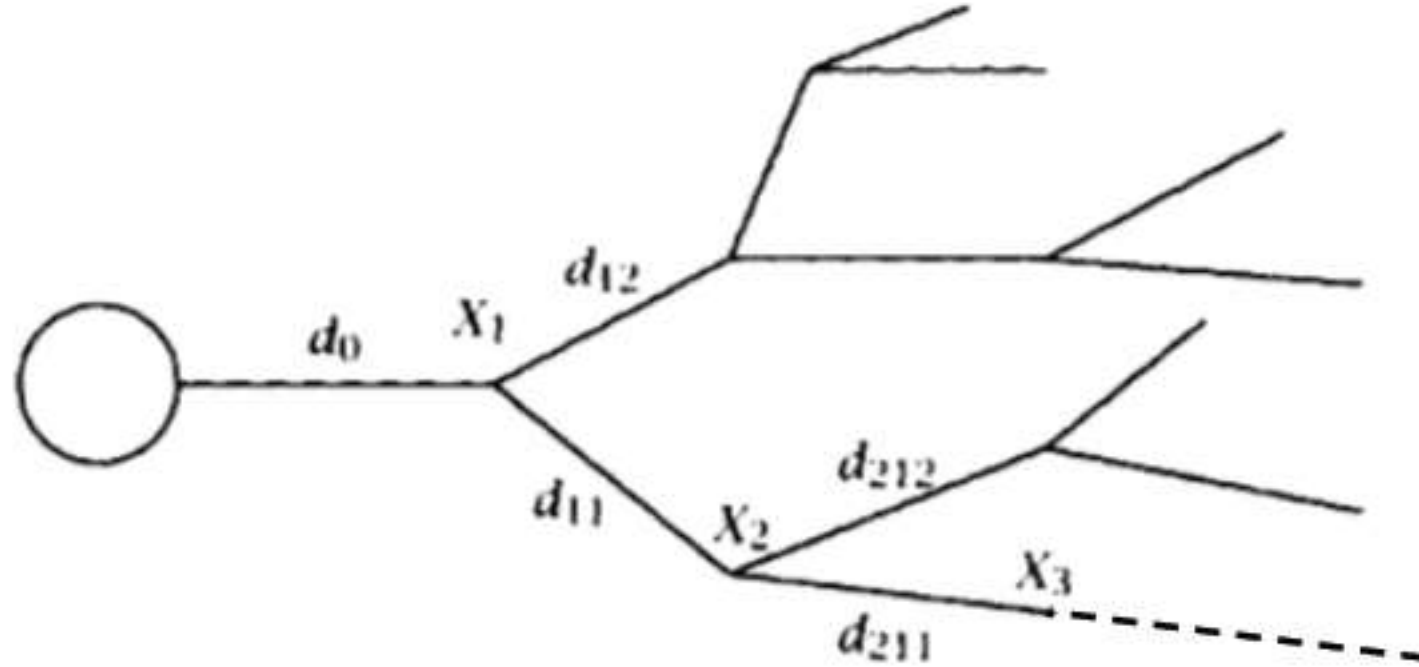


Input conductance for branch 3111:  $G_{in}(3111) = \frac{\pi d_{3111}^{3/2}}{2\sqrt{R_m R_i}} = K d_{3111}^{3/2}$

At node  $X_3$ :  $G_{in}(X_3) = G_{in}(3111) + G_{in}(3112) = K(d_{3111}^{3/2} + d_{3112}^{3/2})$

# Rall's law

If branch point  $X_3$  were absent...



If 3111 and 3112 were not present, the input conductance at  $X_3$  (detaching the cable 211 at the point would make it a semi-infinite cable) would have been:

Johnston, Wu, Foundation of Cellular Neuroscience

Slide : Courtesy : Dr. Rishikesh Narayanan

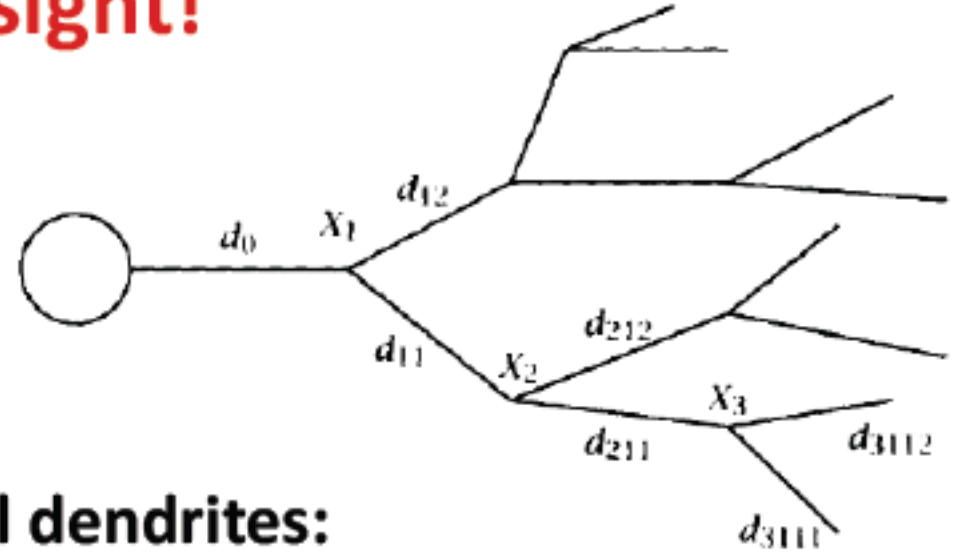
$$G_{in}(X_3) = G_{in}(211) = Kd_{211}^{3/2}$$

# Rall's law

## Rall's insight!

**Without branch:**

$$G_{in}(X_3) = G_{in}(211) = Kd_{211}^{3/2}$$



**With branch and the two additional dendrites:**

$$G_{in}(X_3) = G_{in}(3111) + G_{in}(3112) = K(d_{3111}^{3/2} + d_{3112}^{3/2})$$

**IF:**  $d_{211}^{3/2} = (d_{3111}^{3/2} + d_{3112}^{3/2})$  these two quantities will be equal!

Johnston, Wu, Foundation of Cellular Neuroscience

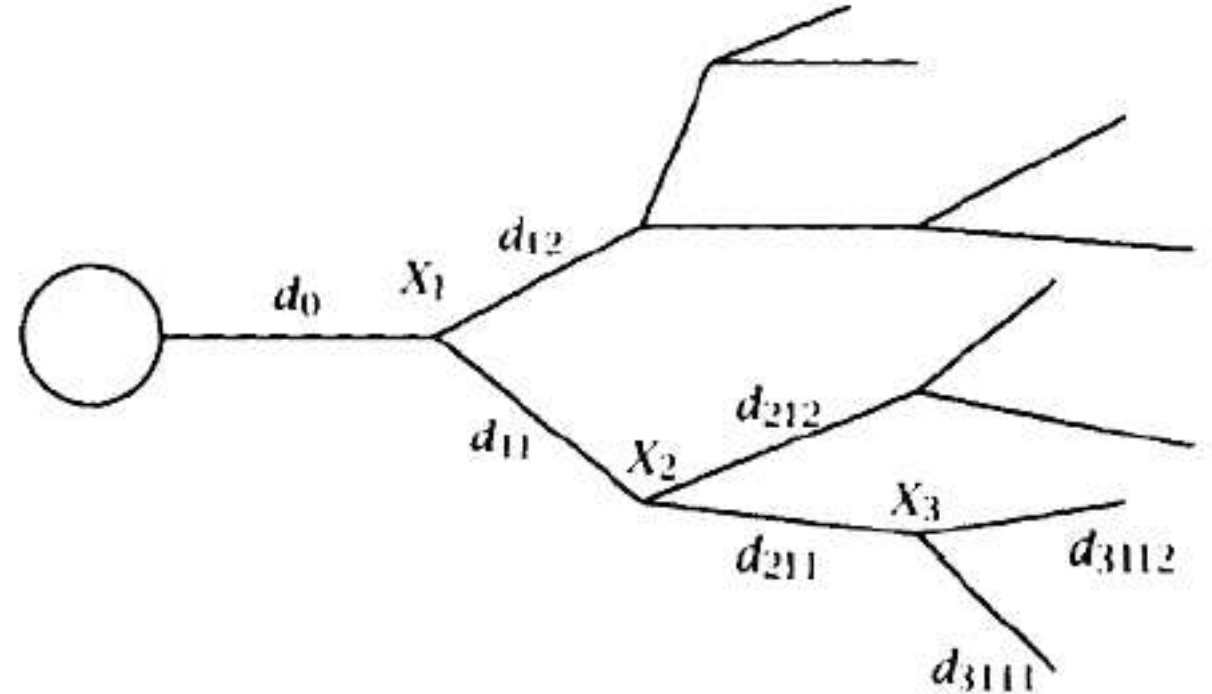
Slide : Courtesy : Dr. Rishikesh Narayanan

**Then, having the branch point  $X_3$  with branches 3111 and 3112 is equivalent to extending branch 211 to infinity.**

# Rall's law

## Ball-and-stick model

**Initial tree:**



**After applying  
equivalence at all  
branch points:**



*Johnston and Wu Book*

# Caution : Assumptions

- Passive propagation
- Extracellular medium is isopotential
- All terminal dendrites are semi infinite
- Same result holds for finite dendrites too provided all dendrites terminate at same depth (in electrotonic units -  $\lambda$ )



# Proof for Ralls law in nature

## **PASSIVE CABLE PROPERTIES AND MORPHOLOGICAL CORRELATES OF NEURONES IN THE LATERAL GENICULATE NUCLEUS OF THE CAT**

**BY STEWART A. BLOOMFIELD, JAMES E. HAMOS  
AND S. MURRAY SHERMAN**

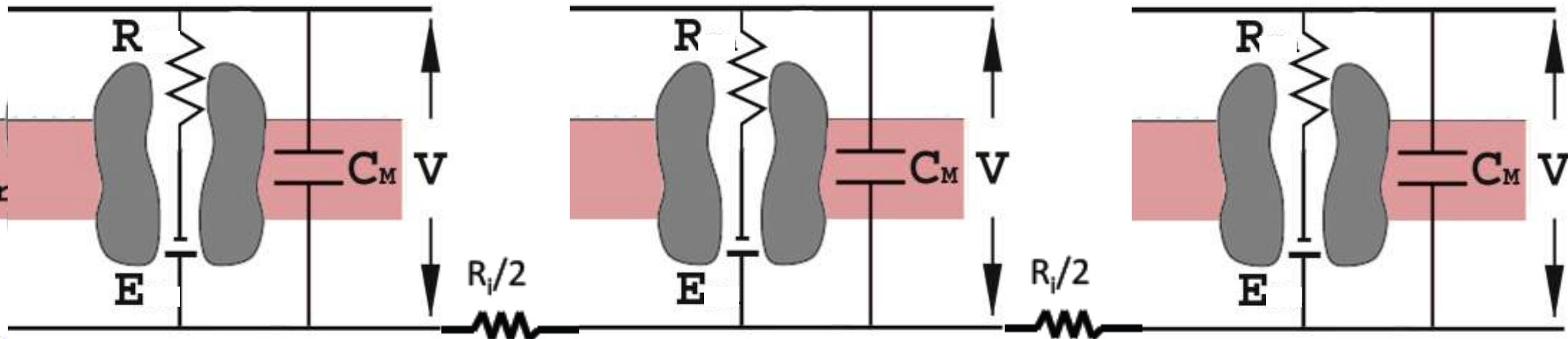
2. Analysis of HRP-labelled geniculate neurones showed that the dendritic branching pattern of these cells adheres closely to the  $\frac{3}{2}$  power rule. That is, at each branch point, the diameter of the parent branch raised to the  $\frac{3}{2}$  power equals the sum of the diameters of the daughter dendrites after each is raised to the  $\frac{3}{2}$  power. Furthermore, preliminary data indicate that the dendritic terminations emanating from each primary dendrite occur at the same electrotonic distance from the soma. These observations suggest that both X and Y cells meet the geometric constraints necessary for reduction of their dendritic arbors into equivalent cylinders.



# Modeling and simulation : Getting around complicated assumptions

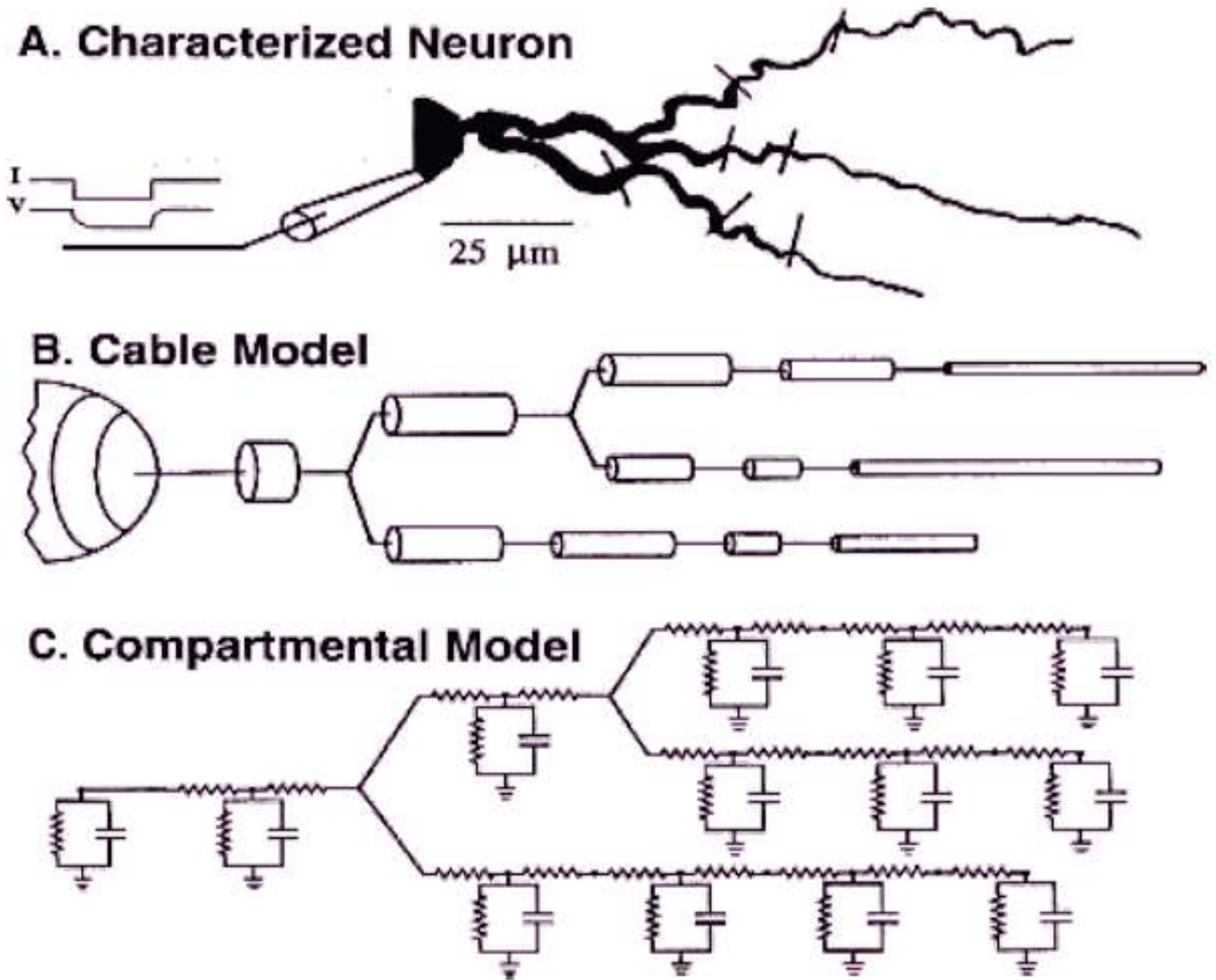
- Split cell into multiple isopotential cells connected by axial resistance

Extracellular  
area

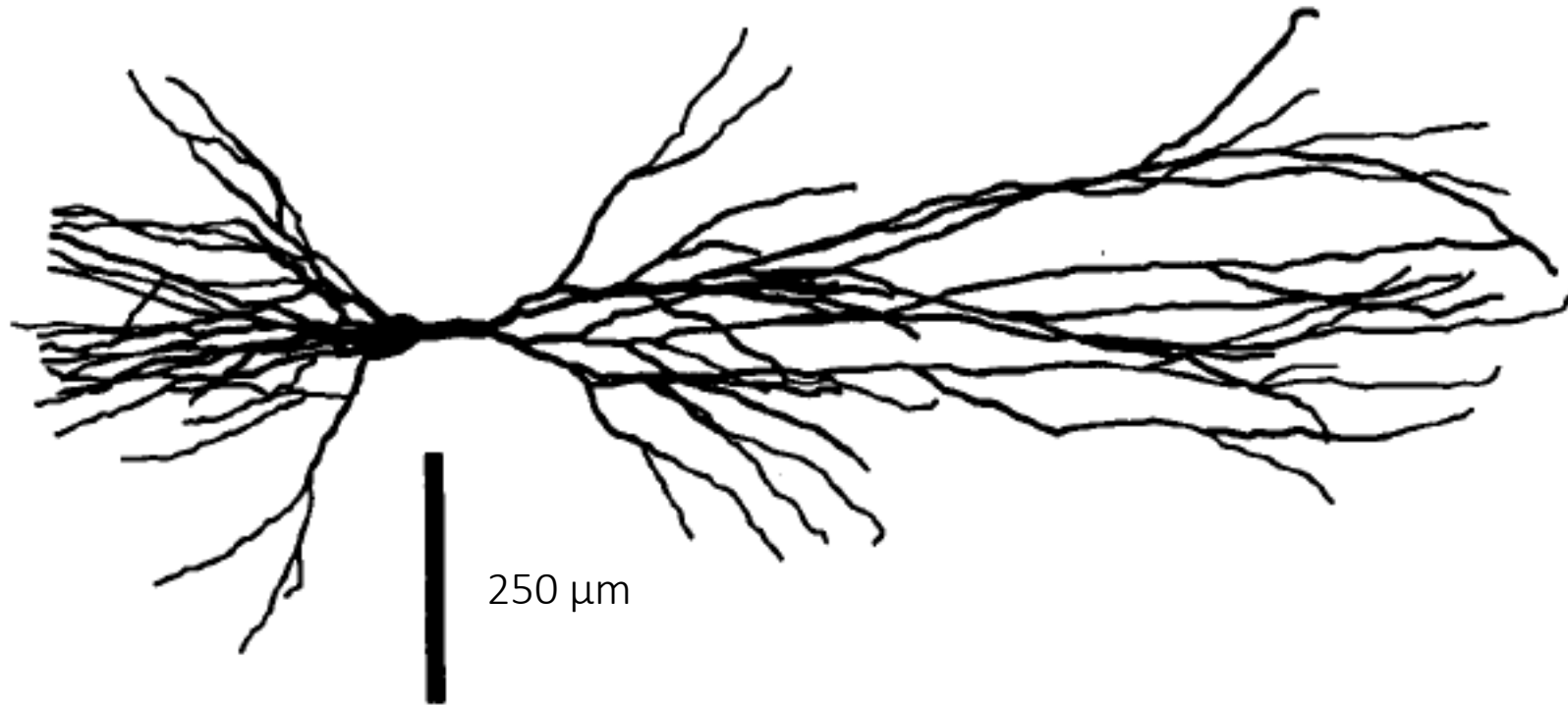


Intracellular  
area

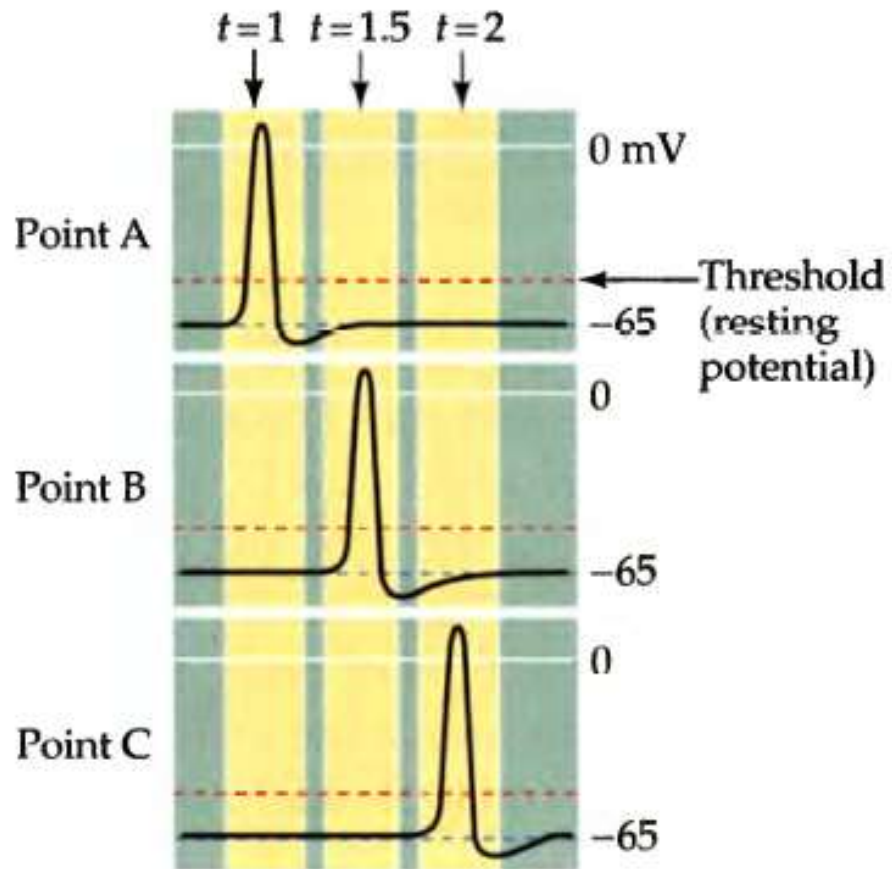
# Modeling morphological realistic neurons



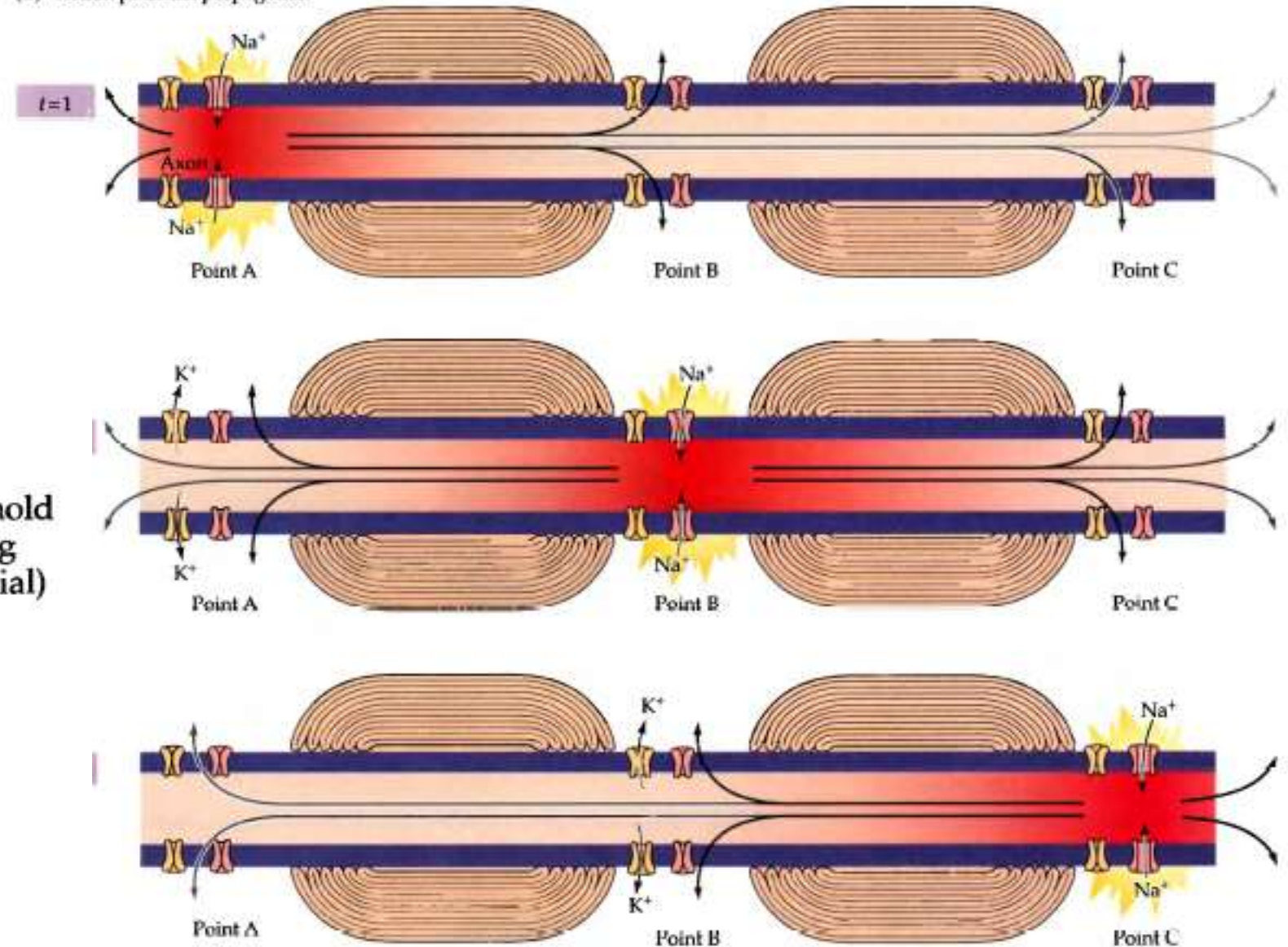
# A rat hippocampal CA3 cell



# AP propagation



(C) Action potential propagation



# Questions

How do you parcellate a long cable in to segments ? How do you choose length of segment ?  $\lambda$

How does myelination affect ???  $\lambda = \sqrt{r_m / r_i}$ ... increased space constant hence lower loss along cable

Thank you !

# Emergence of the AP (Qualitative)

- At Rest
  - *K<sup>+</sup> channel moderate conductance, Na<sup>+</sup> channel very low conductance, at around resting membrane potentials*
  - *So what will be the resting membrane potential be like? (Take a guess)*
- Depolarisation
  - *Deposit some charge inside*
  - *What happens if K<sup>+</sup> channel is the only active conductance?*
  - *What happens if Na<sup>+</sup> channel is also active albeit with low conductance?*
- At highly depolarized states ?