

# **Modelling of physiological and pathological processes**

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Lecture 2

## **A cell must:**

- Keep its integrity
- I/O



## **The answer is:**

Membranes with “smart” I/O ports  
a.k.a. Ion Channels

## **How?**

### **What are they?**

Ion channels are membrane-bound cellular proteins that permit the flow of ions, including calcium, potassium, sodium, and chloride, into and out of cells.

### **Where are they?**

Ion channels are present in all human cells and effect such vital functions as nerve transmission, muscle contraction, and cellular secretion, to name a few.

## **Dynamical Systems Theory:**

A set of concepts, theorems and tools that allow a unified view of the physical world, both in terms of processes and in terms of systems

## **Areas of application:**

Mathematics

Physics

Chemistry

Biology

Medicine

Zoology

Finance

Economics

Meteorology

Seismology

Genetics

Controls

Electronics

Polymers

Geophysics

Fluid & Plasma Mechanics

Cosmology

Communications

Cardiology

Linguistics

Materials

Optics

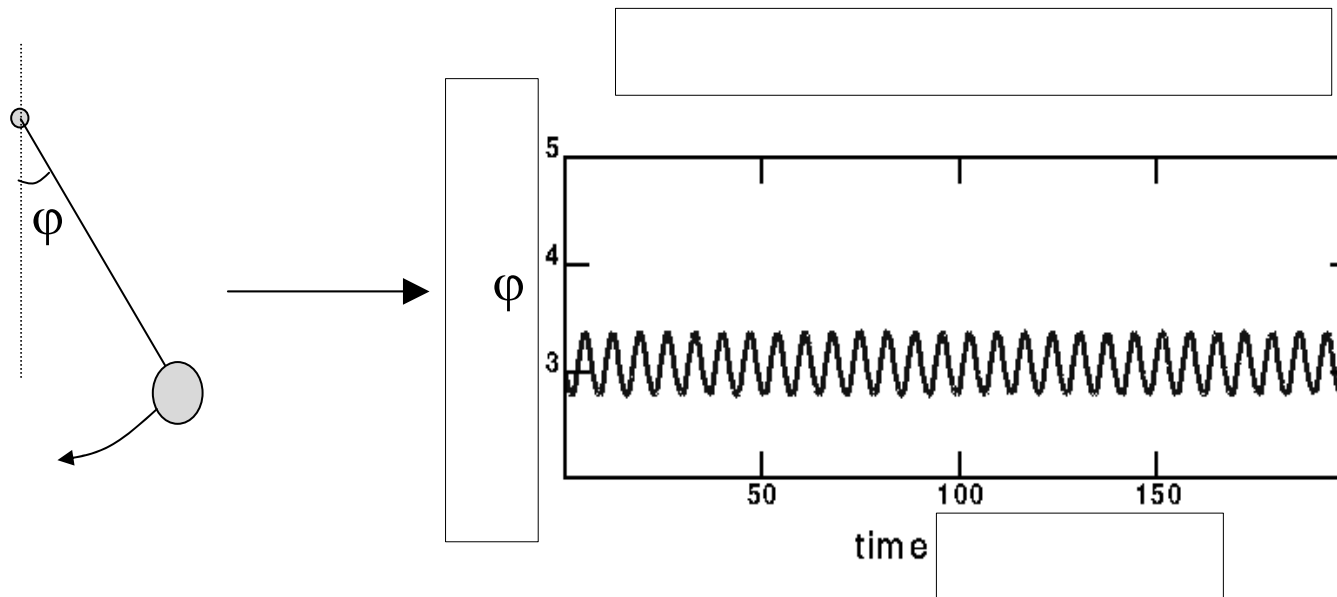
Hydrology

Oceanography

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## The concept of the Degree of Freedom (DOF)

Assume small angles, perfectly stretched, straight, inelastic and unbreakable string, planar oscillation, constant gravity etc., etc...



In terms of visualization:

One “variable”, one observable, one degree of freedom: Easy

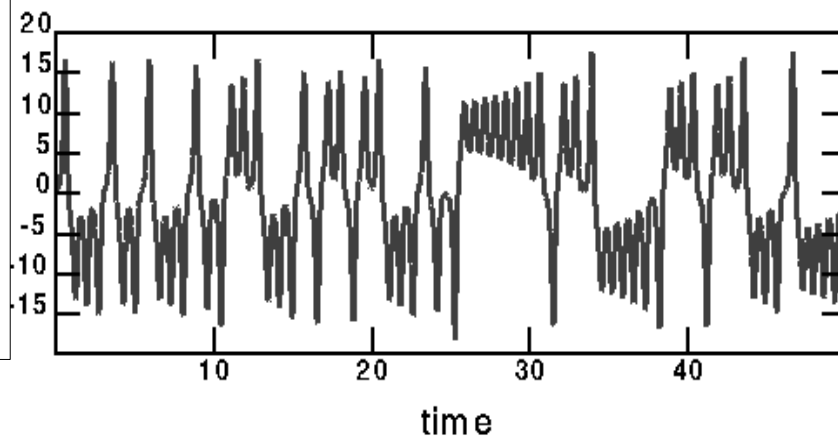
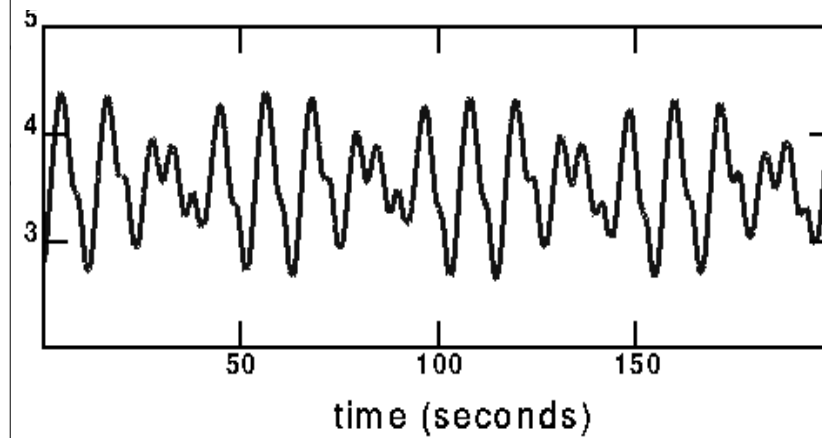
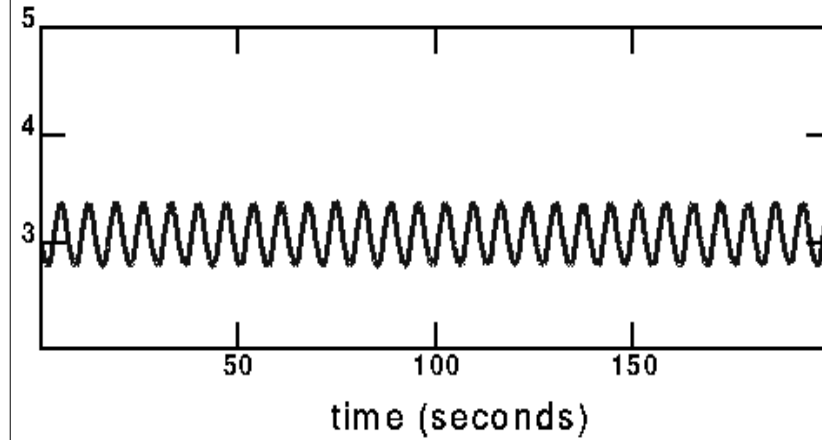
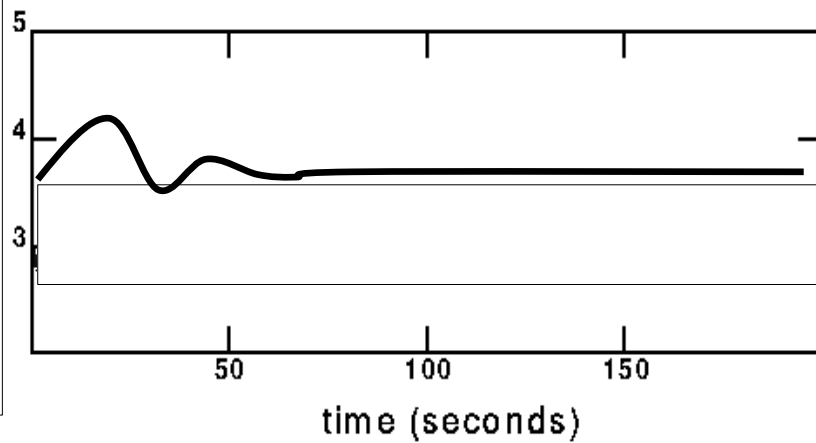
Two observables: Also easy

Three observables: Easy, with 3D graphics (Lorenz, Ion etc.)

Similarly easy in terms of extracting quantitative information

## States of a system:

- Steady
- Periodic
  - Single Frequency
  - Many Frequencies
- Quasiperiodic
- Chaotic
  - Intermittent



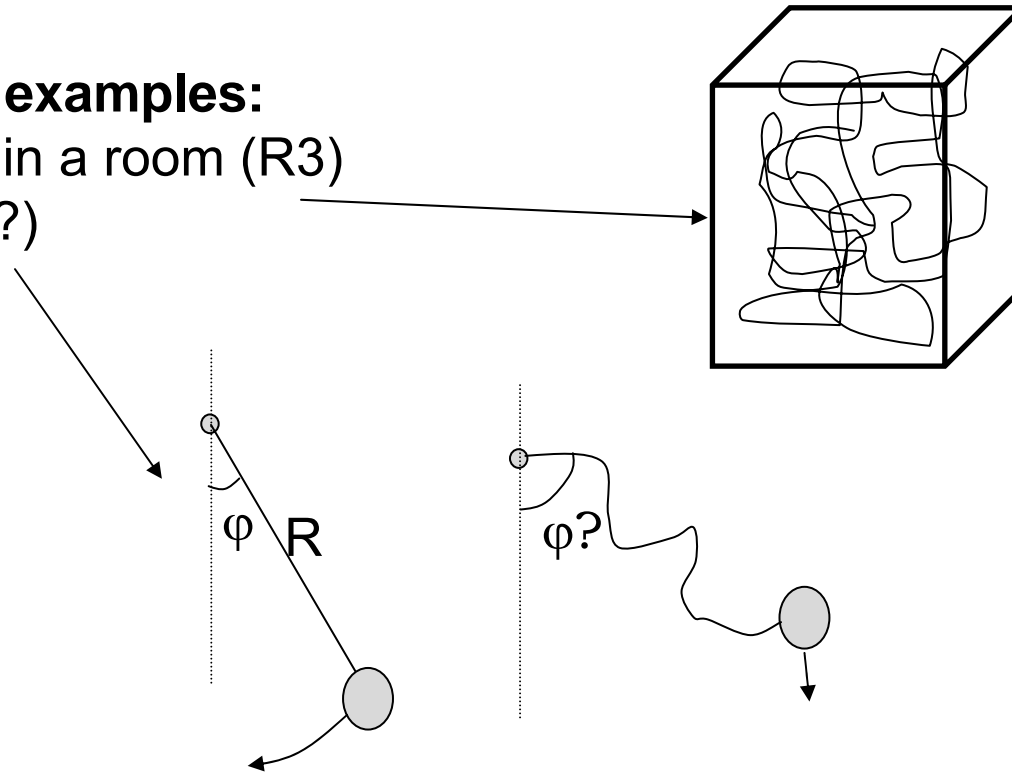
## Generalization of this concept:

### Phase space (or state space)

The space (physical or functional) that holds all the possible (and impossible) states or conditions of a system

#### Two simple examples:

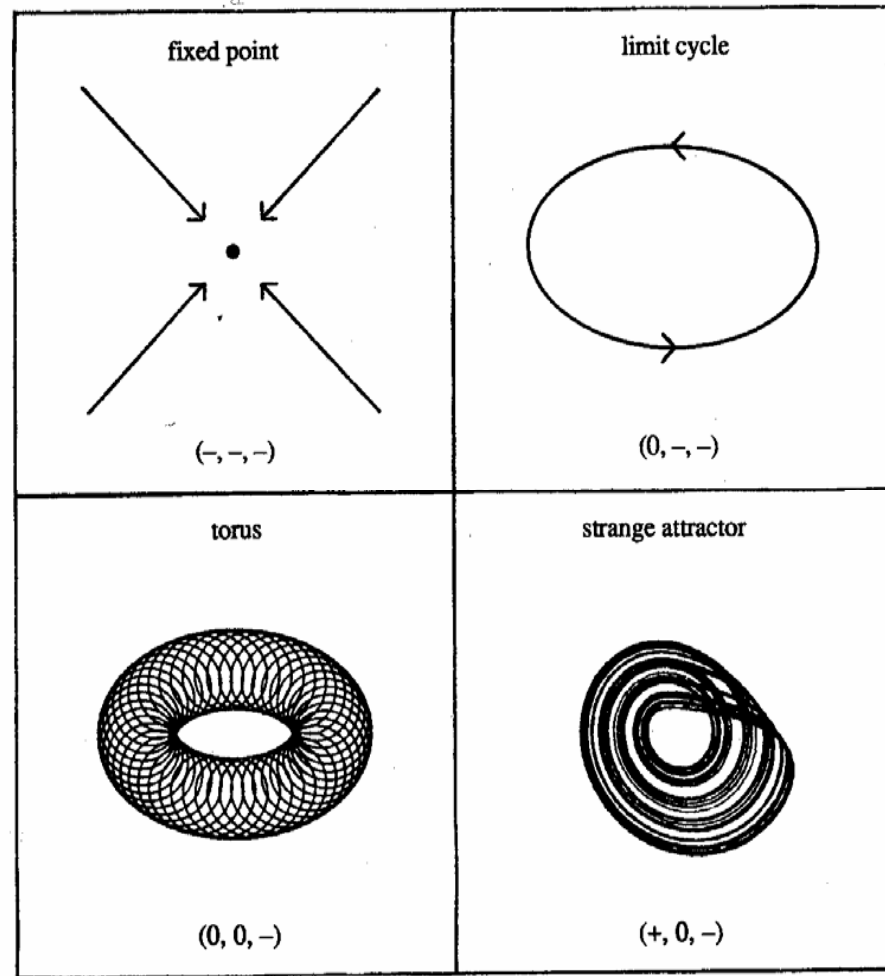
- Fly buzzing in a room (R3)
- Pendulum (?)



## Phase space, or state space:

The “domain” where the state of the system lives!

A set, with properties dependent on the nature of the system, that includes a subset corresponding to the loci of the attainable conditions of the system.





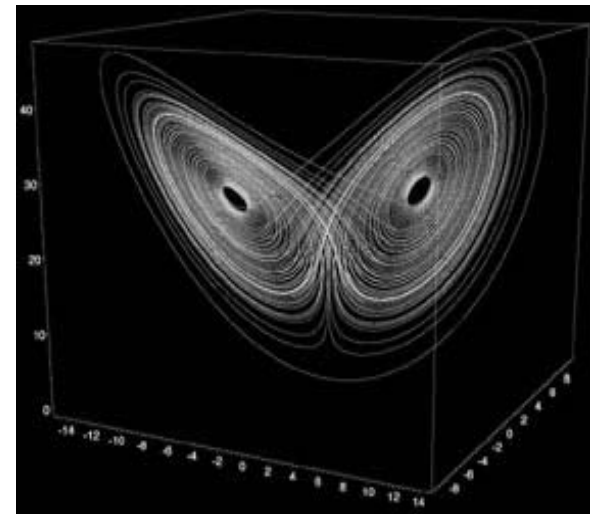
## A more complex (?) example:

Edward Lorenz, a meteorologist, modeled atmospheric conditions. Starting from the full equations and after serious truncation and simplification, he obtained a system of three differential equations:

$$\begin{aligned}dx/dt &= -10x + 10y \\ dy/dt &= 28x - y - xz \\ dz/dt &= -(8/3)z + xy\end{aligned}$$

The butterfly shaped “attractor” known as the Lorenz attractor is generated by plotting x-y-z for these equations, which exhibit chaotic behavior. Lorenz saw that slight differences in one variable had profound effects on the outcome of the whole system, a result of “sensitive dependence on initial conditions”.

To illustrate what this means, Lorenz is reputed to have said that a butterfly flapping its wings in the Amazon could cause a hurricane in the Caribbean. This sensitivity is now called the “butterfly effect”.



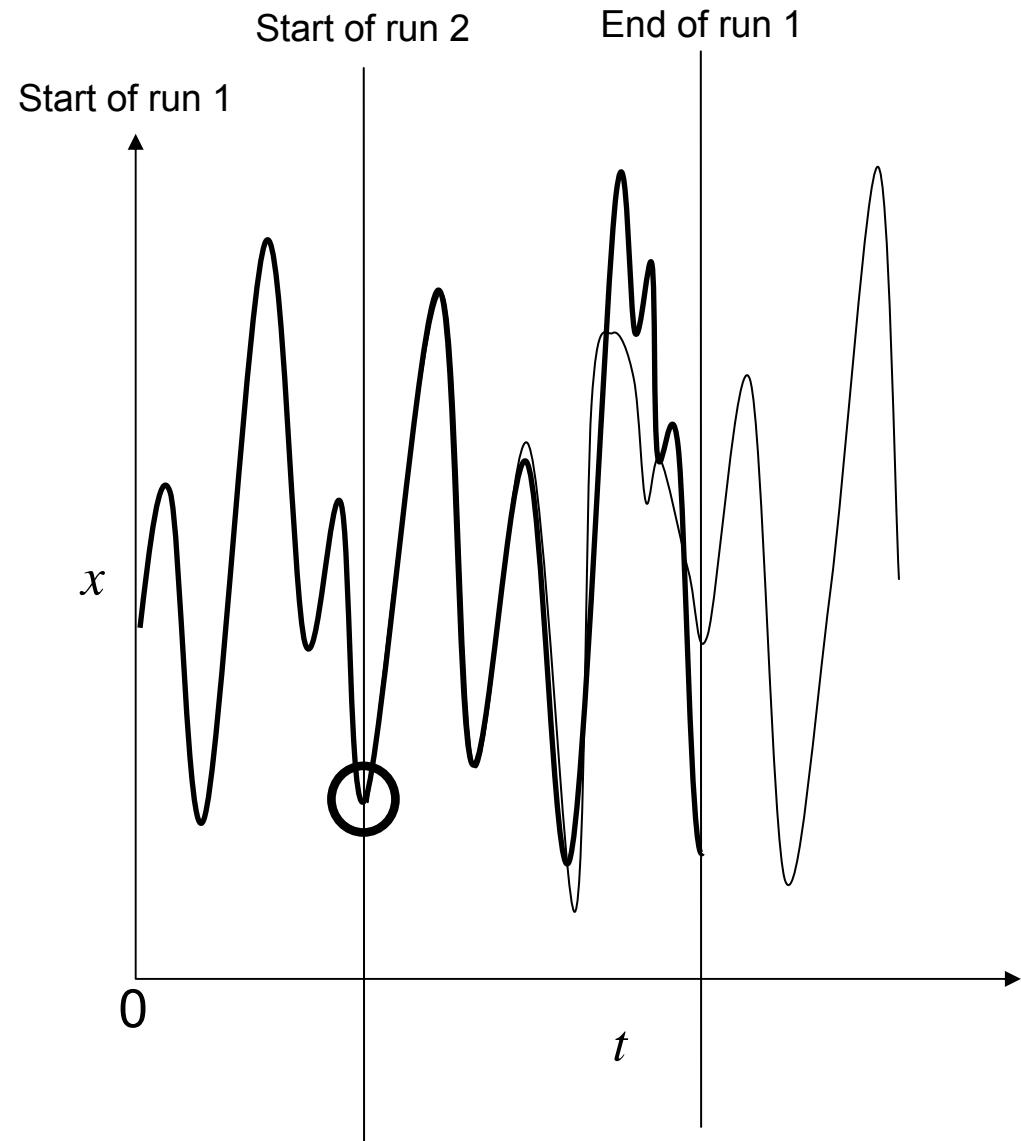
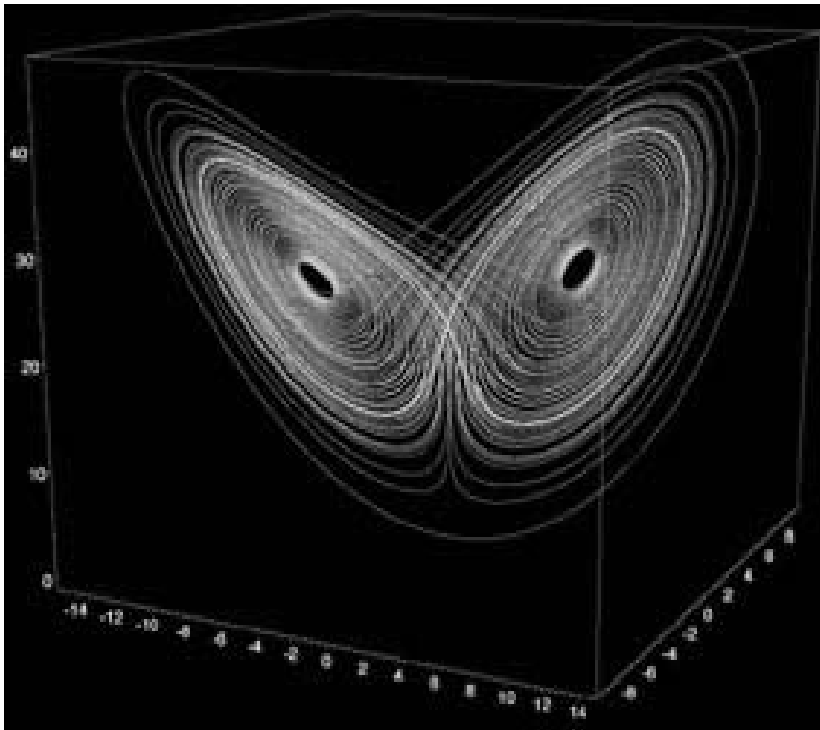
# Sensitive dependence from initial conditions: The (re)discovery of E. Lorenz

Atmospheric science

$$dx/dt = -10x + 10y$$

$$dy/dt = 28x - y - xz$$

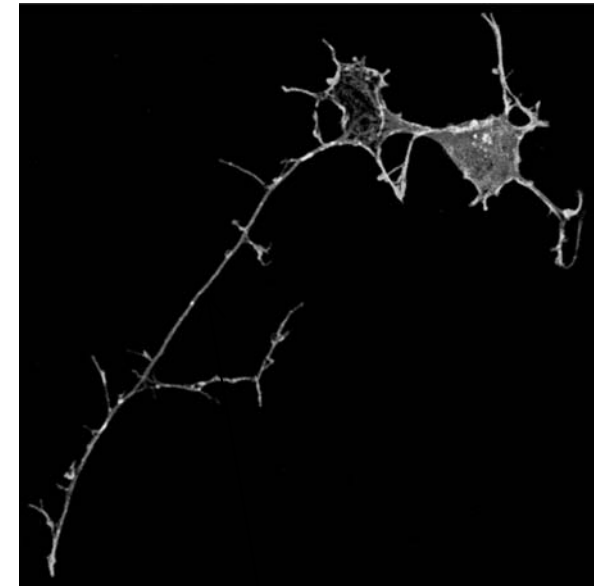
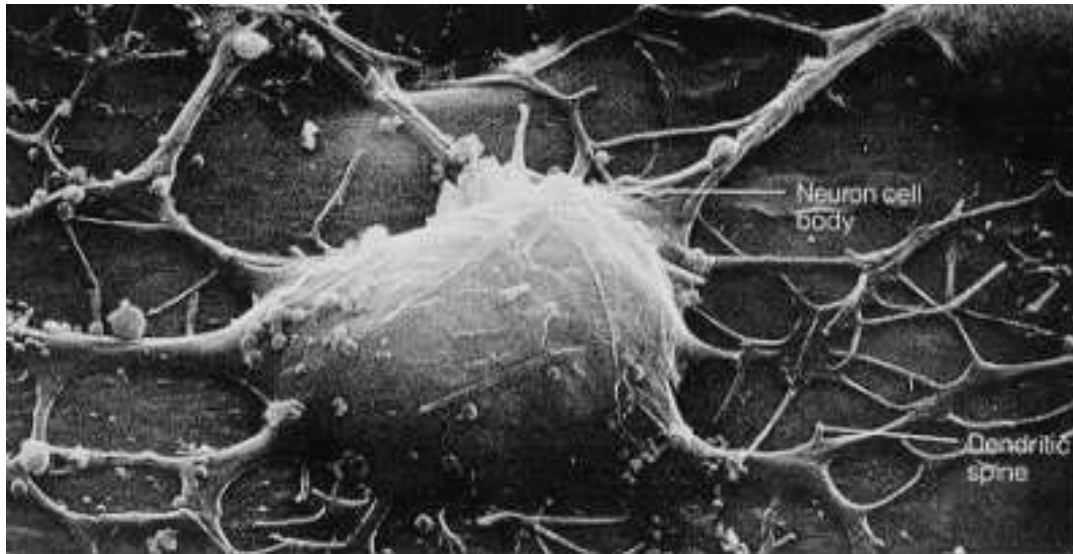
$$dz/dt = -(8/3)z + xy$$



## **An even more “complex” example !**

...Pancreatic  $\beta$ -cells have membranes with voltage-sensitive channels that allow  $\text{Na}^+$  and  $\text{Ca}^{2+}$  ions to enter the cell and voltage-sensitive channels that allow  $\text{K}^+$  ions to leave the cell, among others. The membrane potential of such a system seems to obey very complicated dynamics...

# Ion Channel Research Started in Nerve Cells



Axon

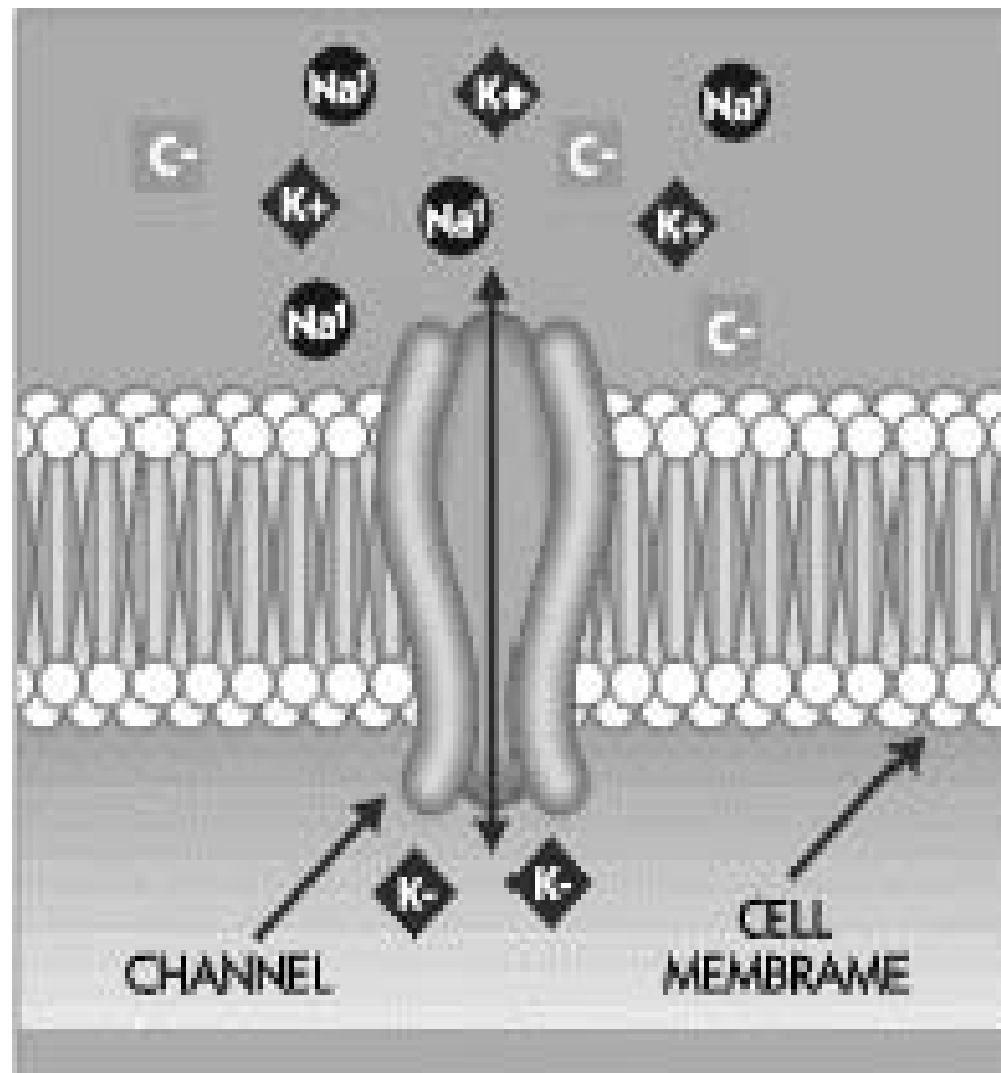
Nerve axons present with great variability:

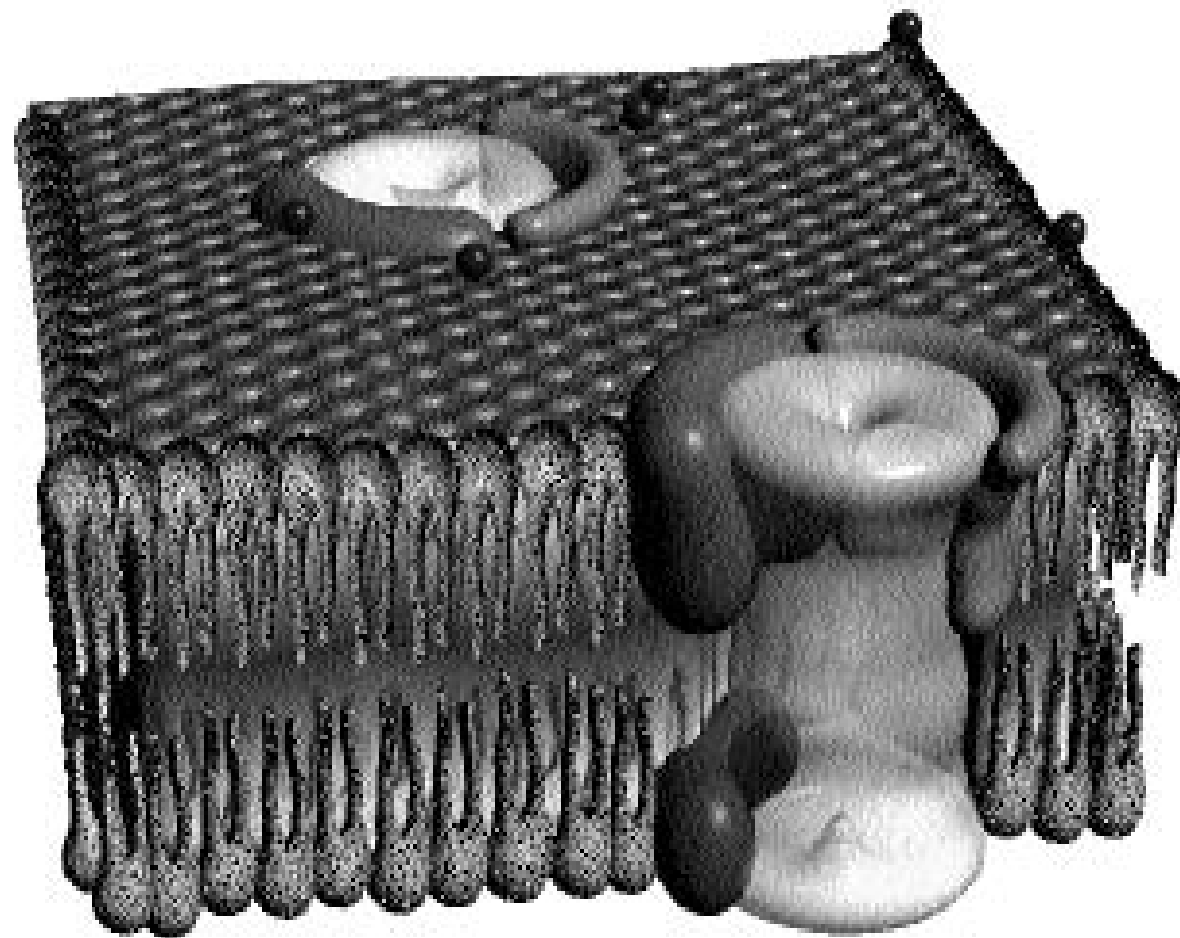
The axon for a giraffe sciatic nerve can be several meters long!

The axon for a squid can be 1 mm in diameter!

Good for manipulation

How does an ion channel “look”?





## **The cell membrane and ion channels**

The cell membrane is a lipid bi-layer. One of its principle functions is to separate the outside of the cell (top) from the inside of the cell (bottom portion).

The red balls represent calcium ions ( $\text{Ca}^{2+}$ ).  $\text{Ca}^{2+}$  is highly regulated in all cell types and therefore is not allowed to easily diffuse into a cell through the membrane. Instead,  $\text{Ca}^{2+}$  movement across the lipid membrane is "gated" by a channel called the voltage-gated  $\text{Ca}^{2+}$  channel (the two bluish units that span across the membrane). Most channels are composed of different protein subunits (green, purple, royal blue and light blue in the drawing) which when embedded together form a pore or gate.

In the example, the  $\text{Ca}^{2+}$  channel is sensitive to voltage and must open to let  $\text{Ca}^{2+}$  into the cell. The channel is closed most of the time until a depolarization (change in voltage represented here by a lighting strike inside the membrane) causes a conformational change in the channel structure to let  $\text{Ca}^{2+}$  through.

$\text{Ca}^{2+}$  ion channel dysregulation may be crucial in several disease states, from myocardial dysfunction to brain aging and Alzheimer's disease. Thus, the importance for tightly regulating the calcium ion.

## **What are ion channels?**

Ion channels are membrane-bound cellular proteins that permit the flow of ions, including calcium, potassium, sodium and chloride into and out of cells:

Cells are usually in contact with “moderately salty” solutions (such as water, body fluids like extracellular fluid, blood plasma etc.). These fluids usually contain a relatively high concentration of ions (lots of sodium Na and chloride Cl, less Calcium Ca and potassium K). Due to the existence of the membrane, a difference in concentrations exist inside and outside of the cell, and thus a chemical gradient is maintained.

Similarly, an electrical potential difference between the cytoplasm and the extracellular medium is sustained.

In effect, an electrochemical gradient, for each ion species, is continuously present, for all cells. Cells make good use of this potential for control and signaling, and this is achieved via the ion channels.

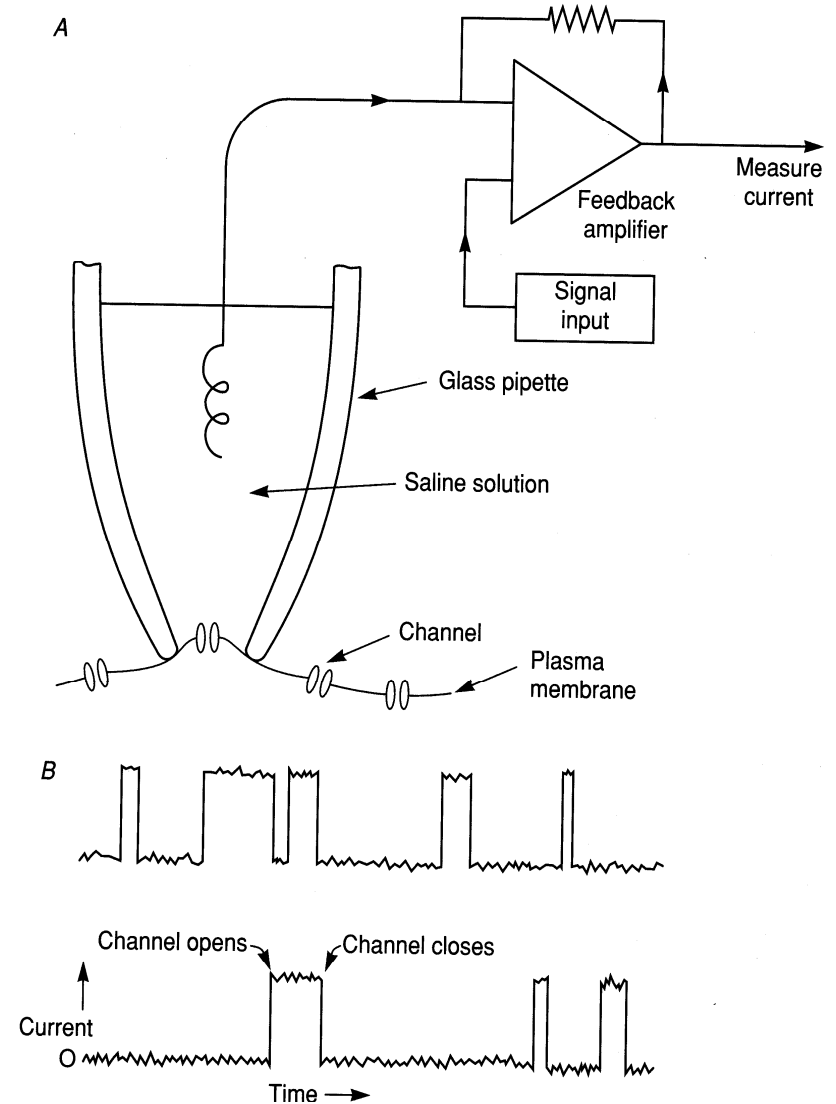
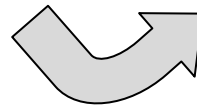


Ion channels are only a few (often only 1!) protein molecule ensembles.

They are very fast, 100,000,000 ions per second, and very selective (a K channel may be 10,000 times more permeable to  $K^+$  than to  $Na^+$ ).

Ion channels are present in all human cells and effect such vital functions as nerve transmission, muscle contraction, and cellular secretion, to name a few.

The patch clamp technique was instrumental in their discovery and in understanding their functionality.



## Modeling of Ion Channels: Easier than Experiments ☺

Took twenty+ years before Armstrong and  
Bezánilla measured currents connected with  
the conformational change in the protein  
connected with the passage of  $\text{Na}^+$

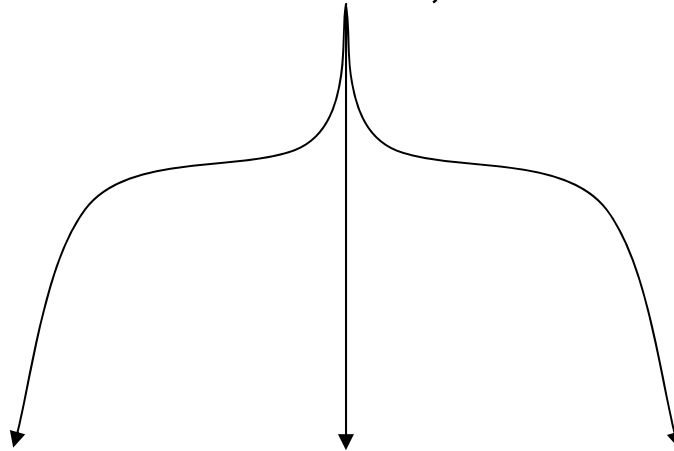
**But if you combine the two, you might win a cookie:**

Hodgkin, A. and Huxley, A.

A quantitative description of membrane current and its application to  
conduction and excitation in nerve,

J. Physiol. 117: 500-544,.1952

Nobel Prize, 1971



1...

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- Chay TR Who do pancreatic beta-cells in the islet of Langerhans exhibit complex oscillations? Hypothesis on glucagon oscillation. BIOPHYS J 72 (2): WP248-WP248 Part 2 FEB 1997
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- Chay TR Modeling slowly bursting neurons via calcium store and voltage-independent calcium current NEURAL COMPUT 8 (5): 951-978 JUL 1 1996
- Chay TR Bifurcations in heart rhythms INT J BIFURCAT CHAOS 5 (6): 1439-1486 DEC 1995
- Chay TR, Fan YS, Lee YS Bursting, spiking, chaos, fractals, and universality in biological rhythms INT J BIFURCAT CHAOS 5 (3): 595-635 JUN 1995
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BIOPHYS J 66 (2): A214-A214 Part 2 FEB 1994
- Chay TR The Hodgkin-Huxley  $Na^+$  channel model versus the 5-state Markovian model  
BIOPOLYMERS 31 (13): 1483-1502 NOV 1991
- Chay TR Bursting excitable cell models by a slow  $Ca^{2+}$  current J THEOR BIOL 142 (3): 305-315 FEB 9 1990
- Chay TR The effect of compartmentalized  $Ca^{2+}$  IONS on bursting pancreatic beta-cells  
BIOPHYS J 57 (2): A304-A304 Part 2 FEB 1990
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- Chay TR The effect of inactivation of calcium channels by intracellular  $Ca^{2+}$  ions in the bursting  
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- Chay TR Chaos in a 3-variable model of an excitable cell PHYSICA D 16 (2): 233-242 1985
- Chay TR, Keizer J Theory of the effect of extracellular potassium on oscillations in the  
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- Chay TR, Keizer J A minimal model for membrane oscillations in the pancreatic  
beta-cell BIOPHYS J 41 (2): A58-A58 1983
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## **The Nobel Prize in Chemistry 2003**

"for discoveries concerning channels in cell membranes"

"for the discovery of water channels"

"for structural and mechanistic studies of ion channels"



**Peter Agre**



**Roderick MacKinnon**

### **Should we care?**

Compounds that increase or decrease the flow of ions by selectively blocking or opening specific channels aid in the treatment of many diseases.

(check Xylocaine™ (lidocaine), Diabeta™ (glyburide), and Procardia™ (nifedipine)).

Ion channel modulators can target specific tissues or cells within a tissue. The specificity of these modulators is such that they will differentiate among physiological states (open, closed or inactivated) of the target channels.

## **Influence of Alcohol:**

Although the relaxing effect of alcohol is well known, nobody could explain the mechanism exactly, until recently. Research from Niigata (Japan) & Texas (USA) sheds light:

Alcohol acts upon ion channels in the neuron membrane!

In particular, it was demonstrated that **alcohol opens** a specific type of **ion channel**, called **GIRK**. When open, this channel allows brain cells to **eject potassium**. The **concentration of potassium** in brain cells is known to be connected with the **level of activity of the cells**. Thus, ethanol forces the cells to **reduce their activity**. The result is a slow-down in brain function, perceived as a relaxing sensation by the “drinker”.

Normally, ionic channels in neurons are opened or closed by the action of neurotransmitters or by variations in the electric potential gradient between the interior and exterior of the neurons.

We shall study:

Mixed  $\text{Na}^+$   $\text{Ca}^{2+}$   
 $\text{K}^+$   
“Leakage” } 3 potentials driving the membrane potential  $V$

Exact formulation to follow, but we end up with:  
3 ordinary **non-linear** differential equations of the form:

$$\frac{dV}{dt} = f(\text{everything} \ \& \ n^4, C)$$

$$\frac{dn}{dt} = g(\text{simple}) \quad n \text{ is a probability}$$

$$\frac{dC}{dt} = h(\text{also\_simple}) \quad C \text{ is a concentration}$$



$$dx/dt = 1 \longrightarrow x=t+c$$

**Discretization**

$$\frac{x_{t+\Delta T} - x_t}{\Delta T} = 1, \Delta T \rightarrow 0$$

Taylor Series:

$$x(t) = x(t_0) + \left(\frac{dx}{dt}\right)_{t=t_0} (t-t_0) + \frac{1}{2!} \left(\frac{d^2x}{dt^2}\right)_{t=t_0} (t-t_0)^2 + \dots$$

$$\left(\frac{dx}{dt}\right)_{t=t_0} = \frac{x(t) - x(t_0)}{(t-t_0)} + \frac{1}{2!} \left(\frac{d^2x}{dt^2}\right)_{t=t_0} (t-t_0)^2 + \dots$$

$$\left(\frac{dx}{dt}\right)_{t=t_0} = \frac{\Delta x}{\Delta T} + \frac{1}{2!} \left(\frac{d^2x}{dt^2}\right)_{t=t_0} (t-t_0)^2 + \dots$$

An ordinary differential equation:

$$\frac{dx}{dt} = f(x, t, \dots)$$

Or a system of ordinary differential equations:

$$\frac{dx_1}{dt} = f(x_i, t, \dots)$$

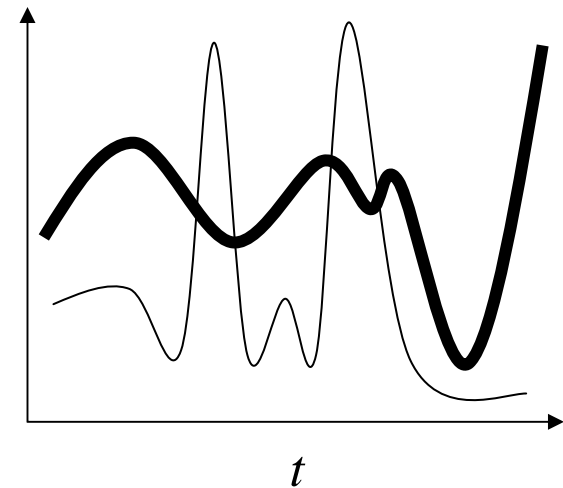
$$\frac{dx_2}{dt} = f(x_i, t, \dots)$$

...

$$\frac{dx_n}{dt} = f(x_i, t, \dots)$$

**Numerical Solution**

Time Series



## **Solution techniques for ODEs:**

Forward marching Euler (First, second, third, ... order)

Higher-order Taylor-based methods

Runge-Kutta (various classes)

Predictor-corrector schemes

## **Time-stepping:**

Constant (intuitive, easy-postprocessing, easy to program)

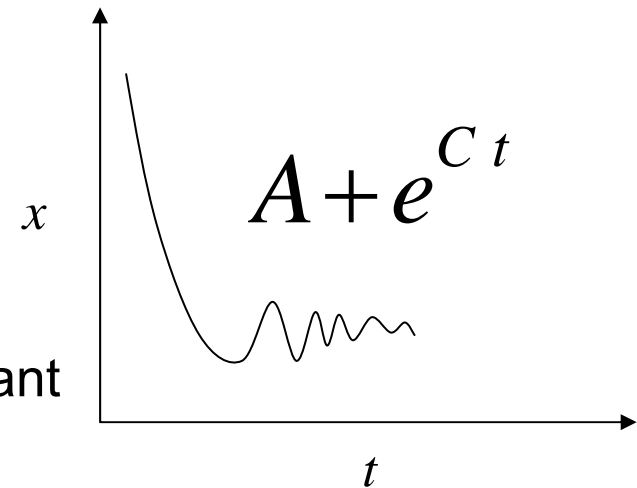
Variable (computer-time savings, accuracy)

## **Stability & Stiffness:**

Not all schemes converge

The results are not always realistic

“Grid” independence and validation are important



**The equation to solve:**

$$\frac{dV}{dt} = g_I^* m_\infty^3 h_\infty (V_I - V) + g_{K,V}^* n^4 (V_K - V) + g_{K,C}^* \frac{C}{1+C} (V_K - V) + g_L^* (V_L - V)$$

Where:

- **C** is a quantity related with the concentration of intracellular  $\text{Ca}^{2+}$  ions
- **$g^*$**  are the maximal conductances normalized with the membrane capacitance
- **$V_L$**  is the leakage reversal potential
- **$V_I$**  is the combined inward  $\text{Na}^+$  - $\text{Ca}^{2+}$  reversal potential
- **$V_K$**  is the combined outward  $\text{K}^+$  reversal potential
- **$m_\infty$**  is the probability of activation of the mixed inwards channel
- **$h_\infty$**  is the probability of inactivation of the mixed inwards channel

} Steady-state values, in original HH we solve additional DE for these. Here, we have simple algebraic eqs.

**Additionally:**

$$\frac{dn}{dt} = \frac{[n_{\infty} - n]}{\tau_n}$$

$$\frac{dC}{dt} = \rho \{ m_{\infty}^3 h_{\infty} (V_C - V) - k_C C \}$$

Where:

- $n$  is the probability of opening the  $K^+$  channel
- $n_{\infty}$  is the steady state value of  $n$
- $\tau_n$  is a characteristic relaxation time
- $k_C$  is a rate constant for efflux of intracellular  $Ca^{2+}$  ions
- $\rho$  is a normalization/proportionality constant
- $V_C$  is the  $Ca^{2+}$  reversal potential

**The system closes with:**

$$y = \frac{a_y}{a_y + \beta_y},$$

where  $y$  is  $m_\infty$ ,  $h_\infty$  and  $n_\infty$

Suitable initial conditions:

$V = -40\text{mV}$

$C = 0.55$

$n = 0.5$

$$a_m = \frac{0.1(25 + V)}{(1 - e^{-0.1V - 2.5})}$$

$$\beta_m = 4e^{\frac{-(V+50)}{18}}$$

$$a_h = 0.07e^{-0.05V - 2.5}$$

$$\beta_h = \frac{1}{1 + e^{-0.1V - 2}}$$

$$a_n = \frac{0.01(20 + V)}{(1 - e^{-0.1V - 2})}$$

$$\beta_n = 0.125e^{\frac{-(V+30)}{80}}$$

$$\tau_n = [230(a_n + \beta_n)]^{-1}$$

## Constant Values for the Model

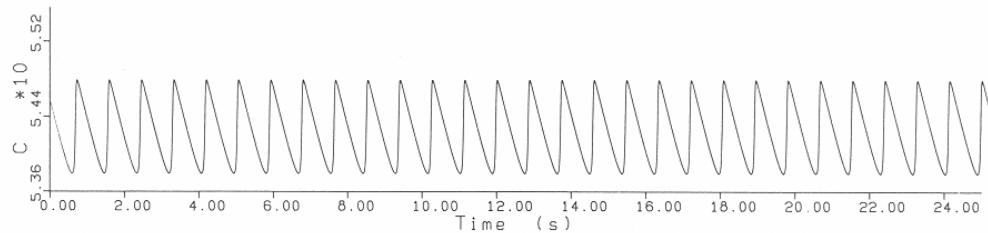
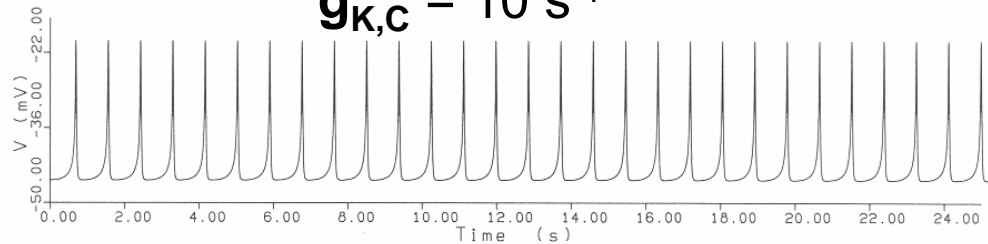
- $V_I$  100 mV
- $V_K$  -75 mV
- $V_L$  -40 mV
- $V_C$  100 mV
- $g_{K,V} = 1700 \text{ s}^{-1}$
- $g_I = 1800 \text{ s}^{-1}$
- $g_L = 7 \text{ s}^{-1}$
- $k_C = 3.3/18 \text{ mV}$
- $\rho = 0.27 \text{ mV}^{-1} \text{ s}^{-1}$

The forcing:

Vary systematically  $g_{K,C}$  from  $10 \text{ s}^{-1}$  to  $12 \text{ s}^{-1}$

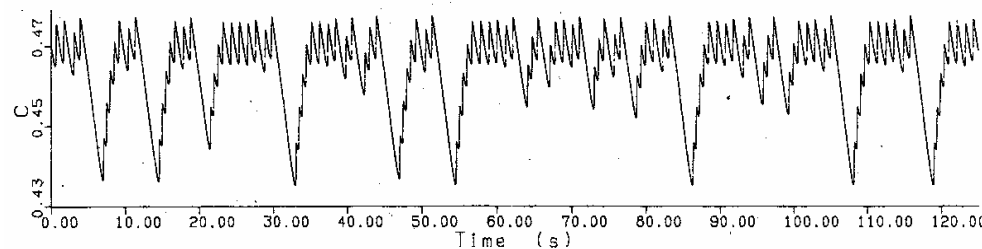
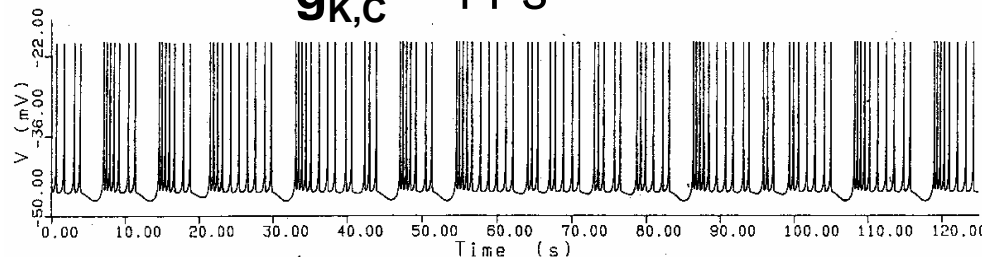
## The physics of ion transfer

$$g_{K,C} = 10 \text{ s}^{-1}$$



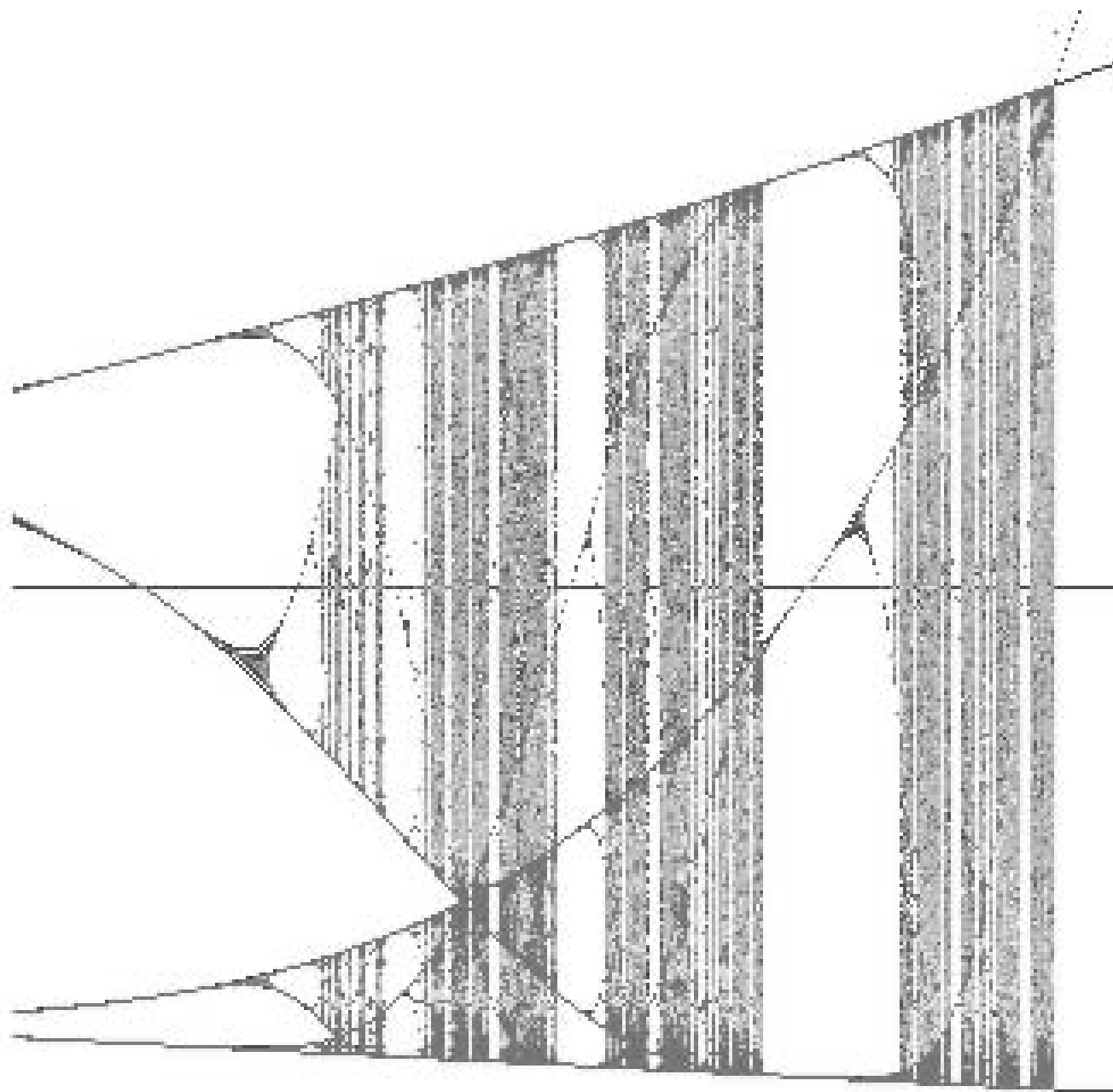
- Cell fires action potentials at regular intervals.
- Calcium concentration increases with each activation, and then drops to the minimum value.

$$g_{K,C} = 11 \text{ s}^{-1}$$



- Cell fires action potentials at bursts, followed by periods or quiescence.
- Calcium concentration increases with each burst, only to drop to the minimum value at the quiescence intervals, if they are long enough.





## From Order to Deterministic Randomness: Routes to Chaos

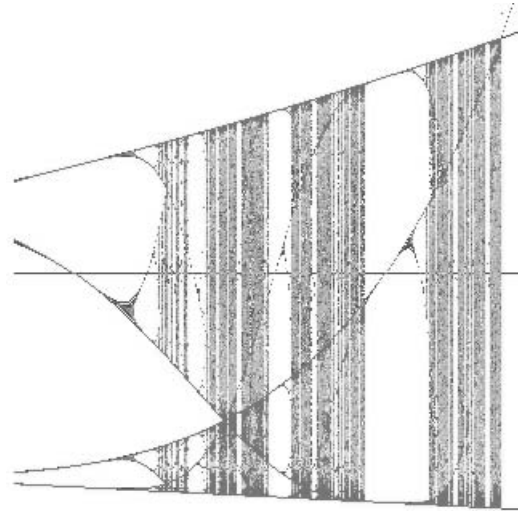
### Period Doubling:

$$2T \text{ @ } g_{K,C} = 10.7$$

$$4T \text{ @ } g_{K,C} = 10.75$$

$$8T \text{ @ } g_{K,C} = 10.77$$

$$12T \text{ @ } g_{K,C} = 10.8$$



Theory and many examples from Science and Technology show that there exists an accumulation point for the successive bifurcations, beyond which the system can be characterized as chaotic. Moreover the intervals at which the bifurcations appear, in many systems, obey a “universal” constant ratio (4.669201609104574), known as the Feigenbaum constant

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