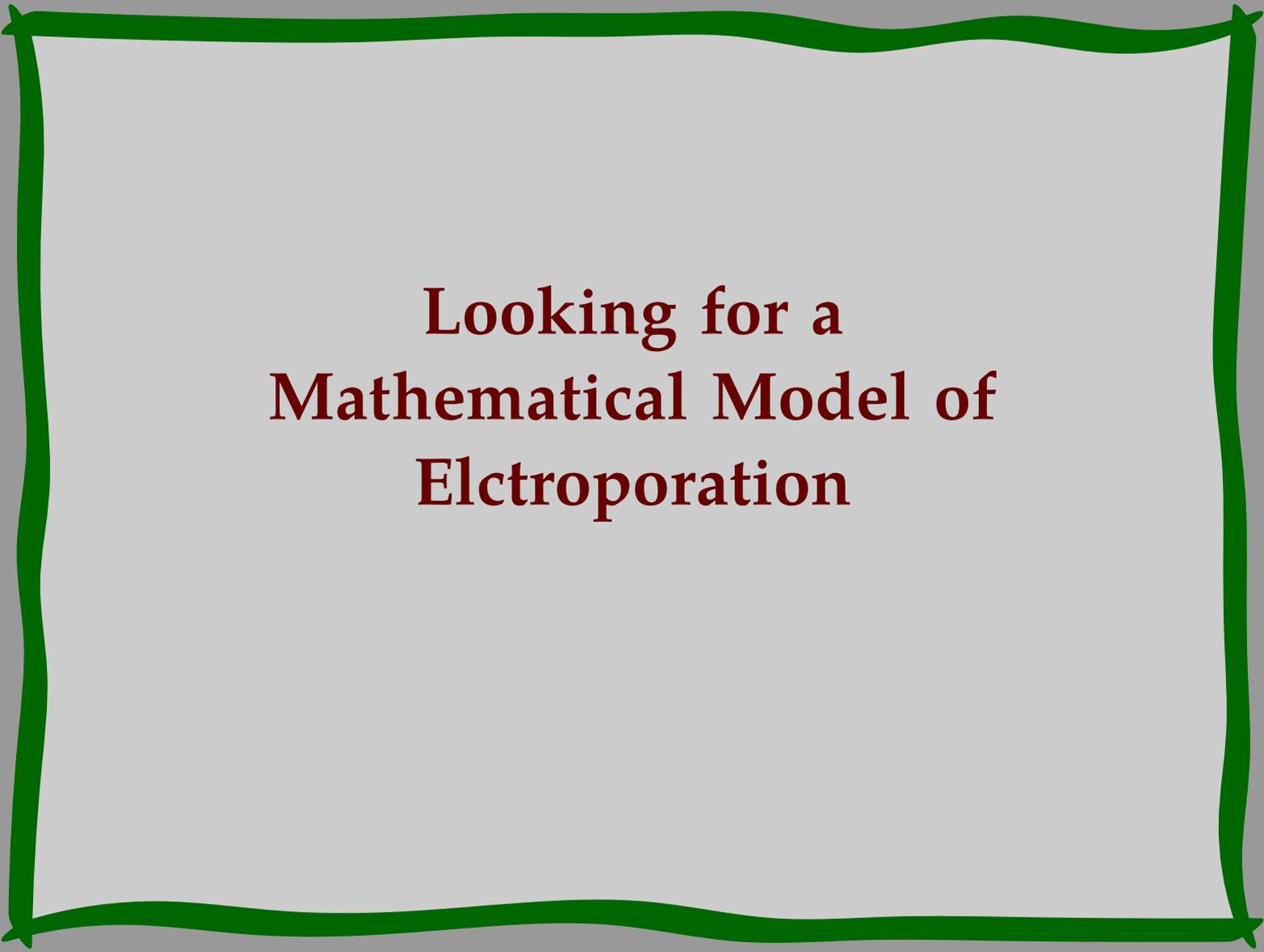




Centro de Ciencias Pedro Pascual
Benasque

24 August–4 September 2009



**Looking for a
Mathematical Model of
Electroporation**



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Joint work with:

- ▶ Frédéric de Gournay (Université de Versailles Saint-Quentin, France)
- ▶ Lluís Mir (CNRS, Institut Gustave Roussy, Villejuif, France)
- ▶ Clair Poignard (INRIA, Bordeaux, France)

Today's talk

On Cells and Membranes

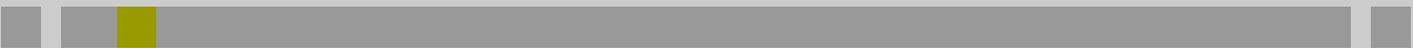
What is electroporation?

Mathematical questions

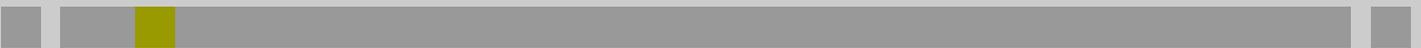
The Schwan model

A molecular dynamics approach

A model for the membrane



On Cells and Membranes

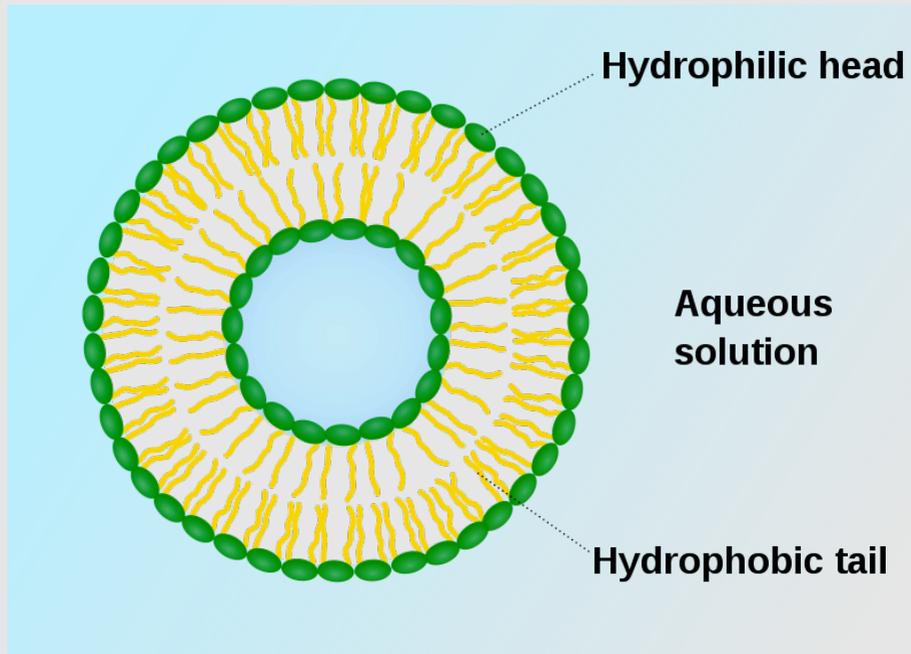


On Cells and Membranes

- ▶ A cell consists of a **membrane** surrounding the **cytoplasm** . A typical, and maybe the simplest, example is a vesicle:

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here the green head + the yellow tail represent a **phospholipid**



On Cells and Membranes

- ▶ The membrane is a barrier protecting the cytoplasm against intrusions,

On Cells and Membranes

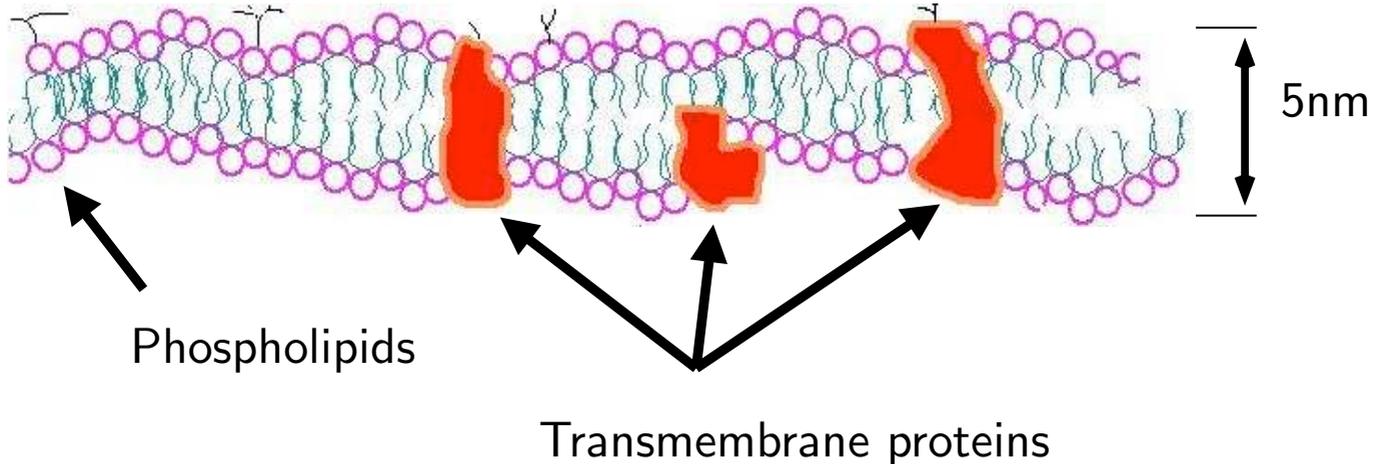
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On Cells and Membranes

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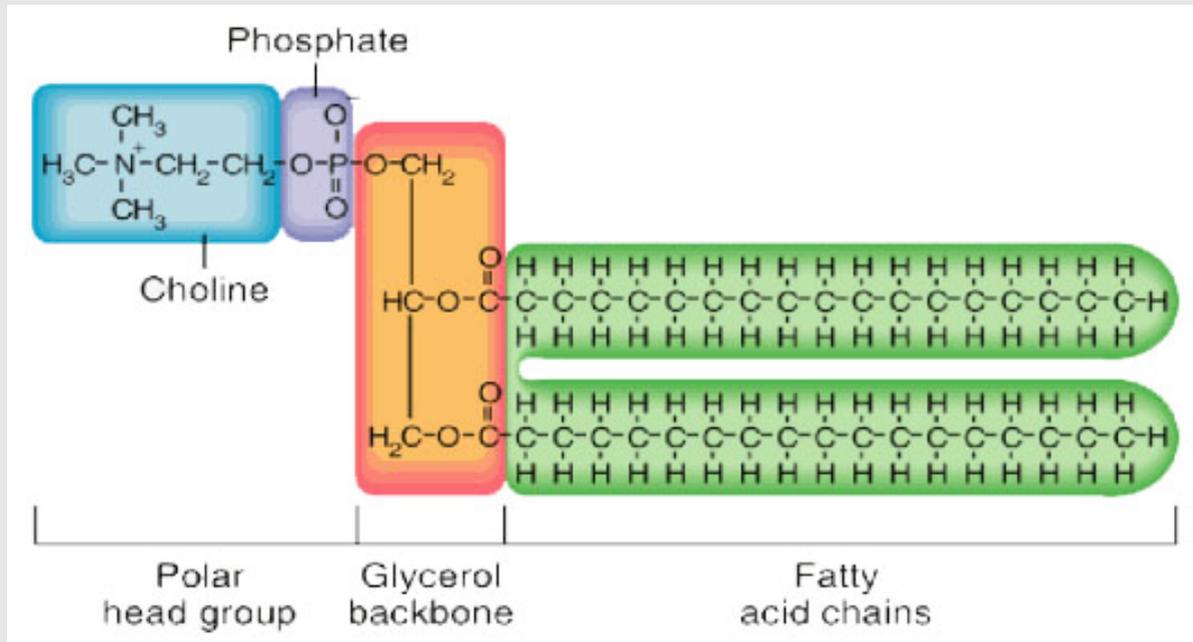
On Cells and Membranes

- ▶ A phospholipid has a « fatty » tail, which is hydrophobic, and a hydrophilic head which is an electric dipole.
- ▶ This dipole may rotate around the axis of the tail, to some extent.
- ▶ Relative sizes are as follows:
 - ▶ Cell's diameter $\sim 5\,000\text{ nm}$
 - ▶ Membrane thickness $\sim 5\text{ nm}$
 - ▶ Distance between two cells $\sim 100\text{ nm}$
 - ▶ Distance between two phospholipids $\sim 1\text{ nm}$
 - ▶ A molecule of water $\sim 0.1\text{ nm}$

On Cells and Membranes

A typical example of a phospholipid is
image from

<http://www.uic.edu/classes/bios/bios100/lecturesf04am/lect08.htm>

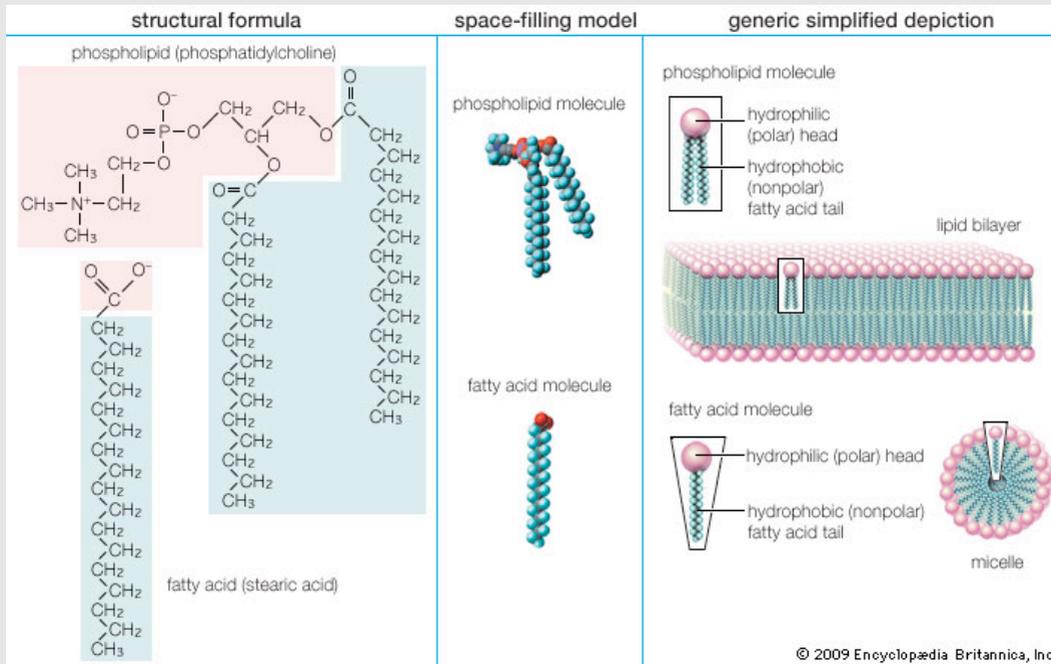


On Cells and Membranes

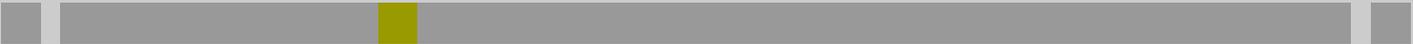
The abstract of all this is depicted here:

image from

<http://www.britannica.com/EBchecked/topic/457489/phospholipid>



What is electroporation?



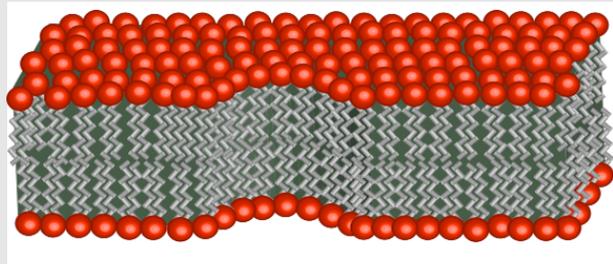
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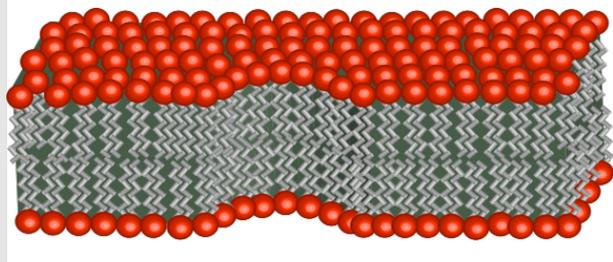
Before any electric field



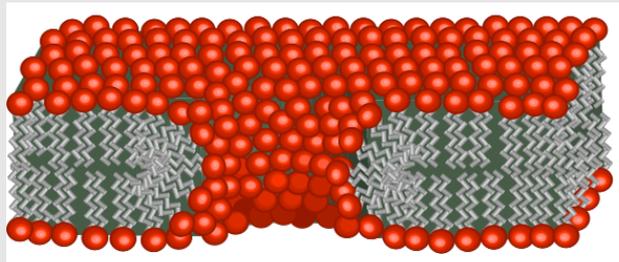
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Before any electric field

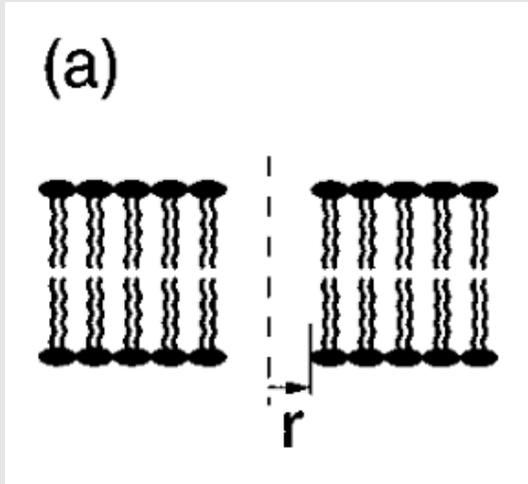


After an electric field (here parallel to the tails) is imposed a **pore** appears

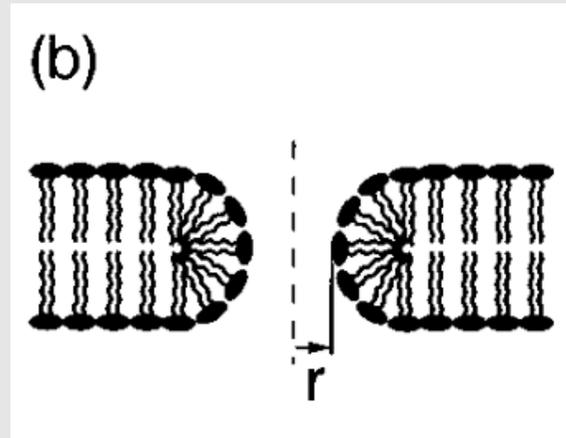


What is electroporation?

As a matter of fact, one may have two kinds of « pores »



Hydrophobic pore



Hydrophilic pore

But in fact it is not known whether there is a « permeabilization » process or creation of pores...

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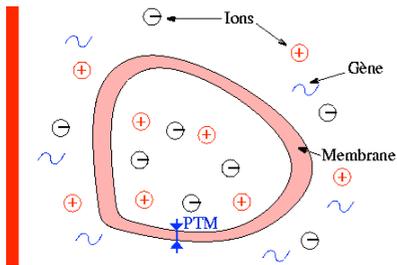
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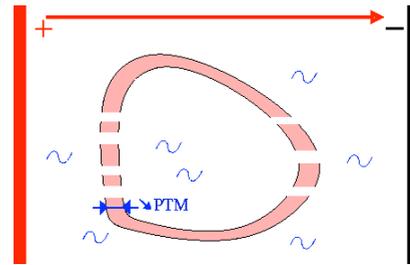
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- ▶ Based on this, a new treatment of cancer tumors has been set up by Lluís Mir, Damjan Miklavčič and their colleagues: the **electrochemotherapy**
- ▶ A drug, such as **bleomycin**, is injected to the patient, locally or intravenously, while around the tumor a highly intense electric field is imposed

What is electroporation?

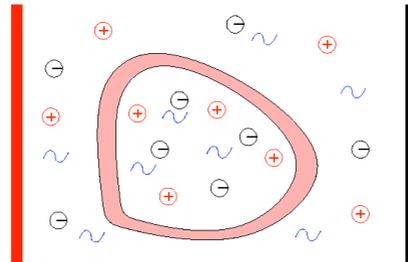
The process of electroporation is assumed to be as follows



(a) Initial configuration



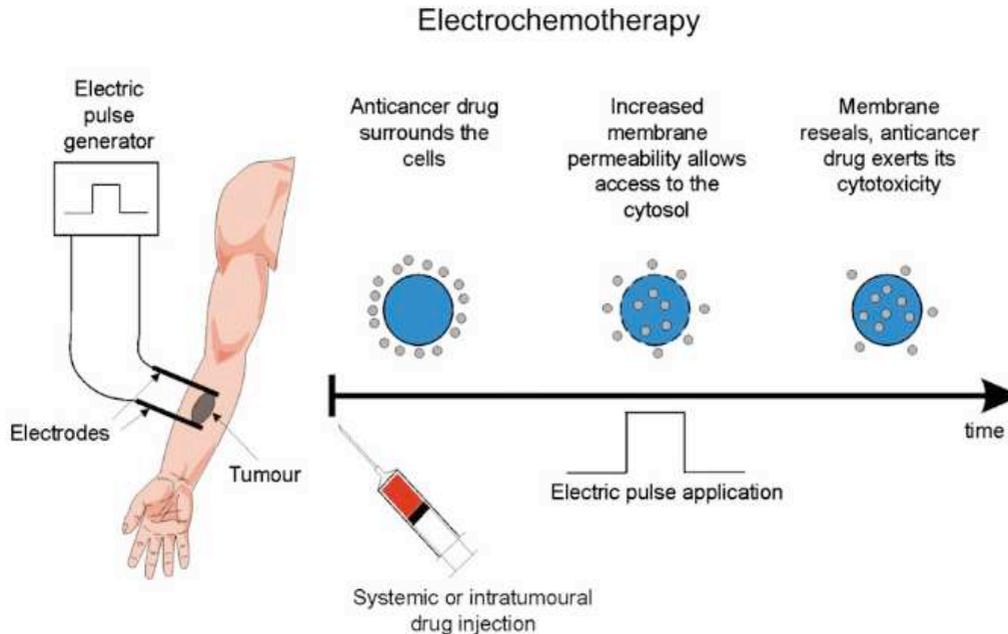
(b) High short pulses



(c) Interruption of the pulses

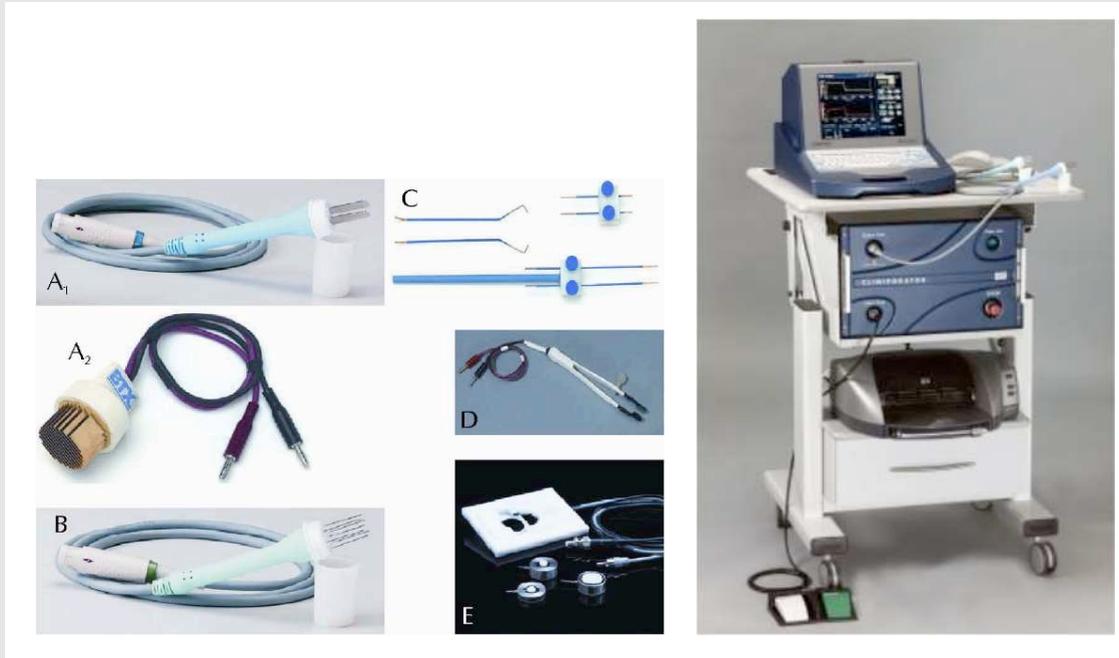
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Principle of **electrochemotherapy** (according to D. Miklavčič)



What is electroporation?

The typical apparatus used, according to Lluís Mir, is as follows



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- ▶ The treatment of a tumor is local and thus has much less side effects
- ▶ The patient has to undergo a lesser number of treatment

What is electroporation?

An example of dramatic results may be seen on the chest of this patient



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Before treatment



After 5 days



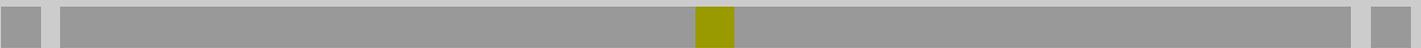
After 2 weeks



After 8 weeks

What is electroporation?

However there are a few drawbacks



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However there are a few drawbacks

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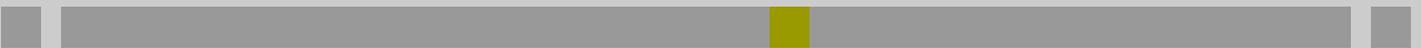
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However there are a few drawbacks

- ▶ Deep tumors cannot yet be treated
- ▶ Due to the high intensity of the electric field (in the range of 5–25 kV/cm) some patients cannot undergo the treatment (pacemakers, anticoagulant therapy)
- ▶ The process of the electroporation is not well understood, thus the dosage may not be well calibrated

Mathematical questions



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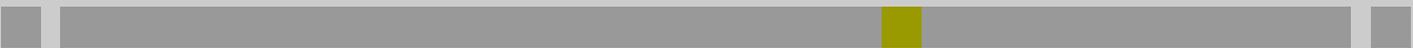
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- ▶ Set up a model for electroporation so that the electrochemotherapy can be coupled with models in which the growth of tumors can be predicted
- ▶ Once an affordable model is set up, and the « direct » problem is solved, study the « inverse » problem

The Schwan model



The Schwann model

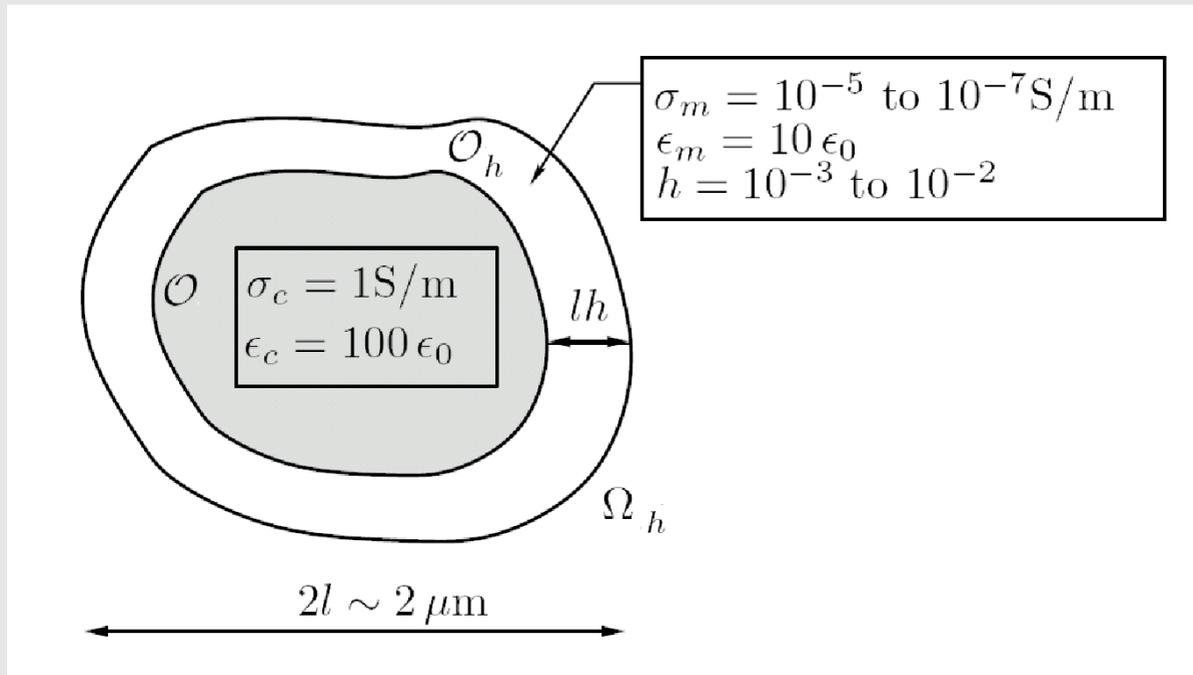
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The Schwan model

- ▶ the electric potential v satisfies a time dependent quasistatic equation

$$(1) \quad \begin{cases} \frac{\partial}{\partial t} \operatorname{div}(\varepsilon \nabla v) + \operatorname{div}(\sigma \nabla v) = 0 & \text{in } (0, \infty) \times \Omega \\ v(0, x) = 0 & \text{in } \Omega. \\ v(t, x) = v_{\text{imp}} & \text{on } (0, \infty) \times \partial\Omega \end{cases}$$

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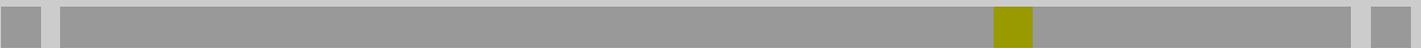
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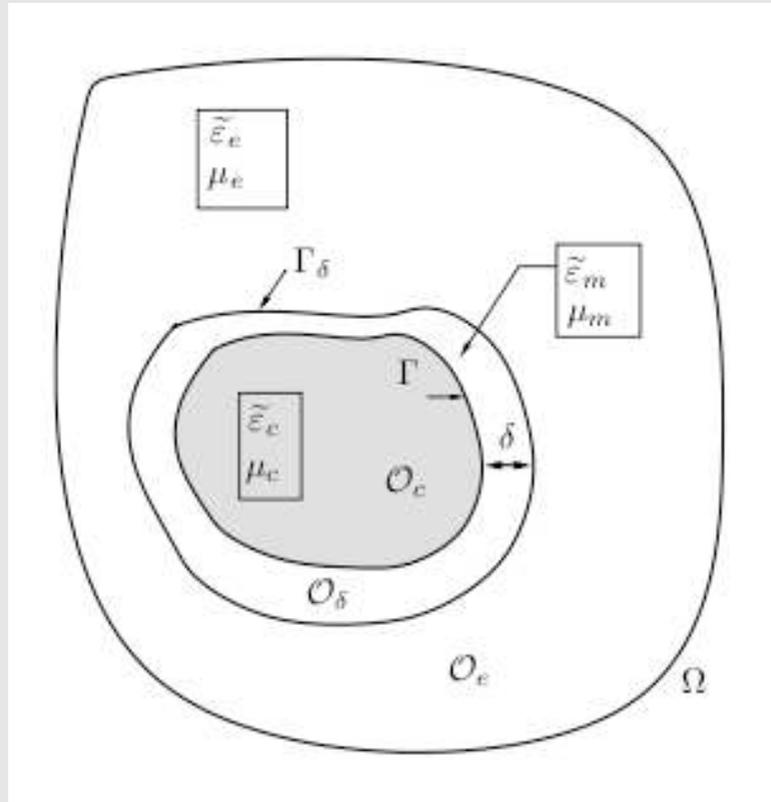
- ▶ or a quasi-static equation in time harmonic regime: setting $\tilde{\varepsilon} := \varepsilon + i\sigma/\omega$, v satisfies

$$(2) \quad \begin{cases} \operatorname{div}(\tilde{\varepsilon} \nabla v) = 0 & \text{in } \Omega \\ v(t, x) = v_{\text{imp}} & \text{on } \partial\Omega \end{cases}$$

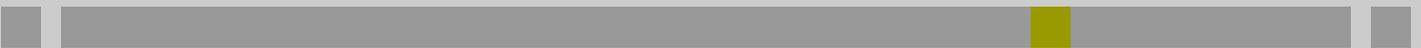
The Schwan model



- ▶ The different subdomains involved are as follows:



A molecular dynamics approach



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$$m_i \frac{d^2 x_i}{dt^2} = \sum_{j \neq i} \frac{q_i q_j}{|x_i - x_j|^3} (x_i - x_j) + q_i \mathbf{E}$$

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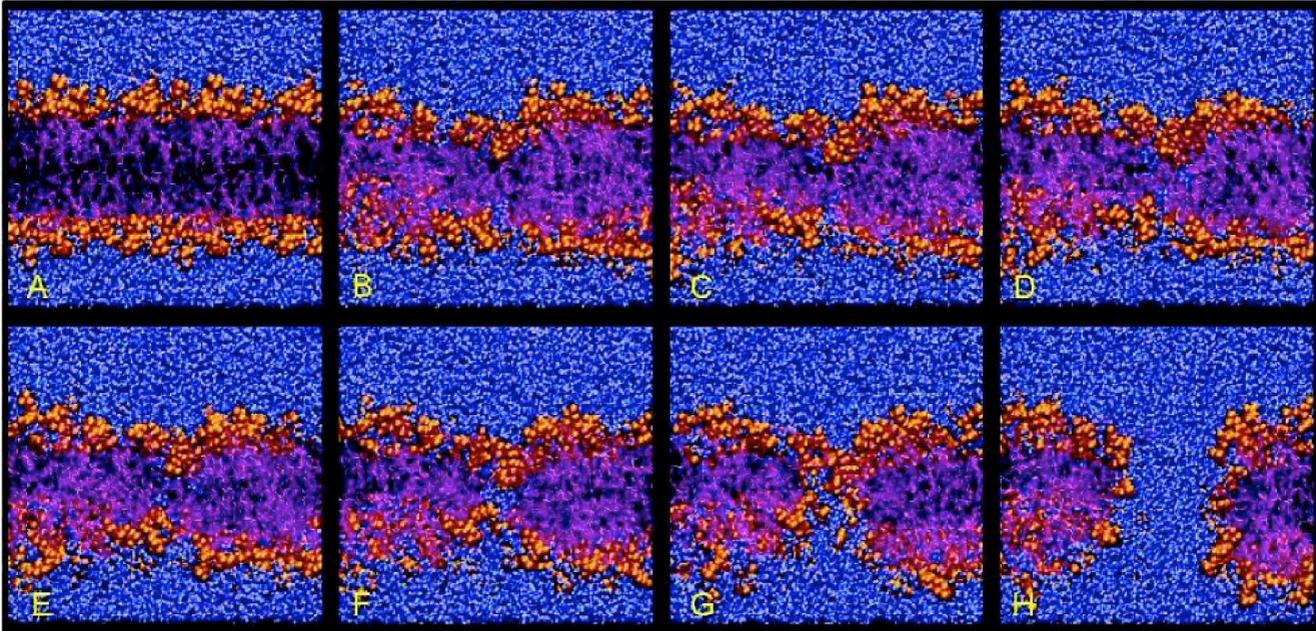
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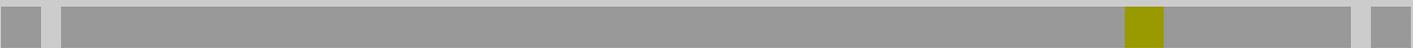
- ▶ ...and one solves numerically these equations...

A molecular dynamics approach

For instance here is what one may see, according to D.P. Tieleman

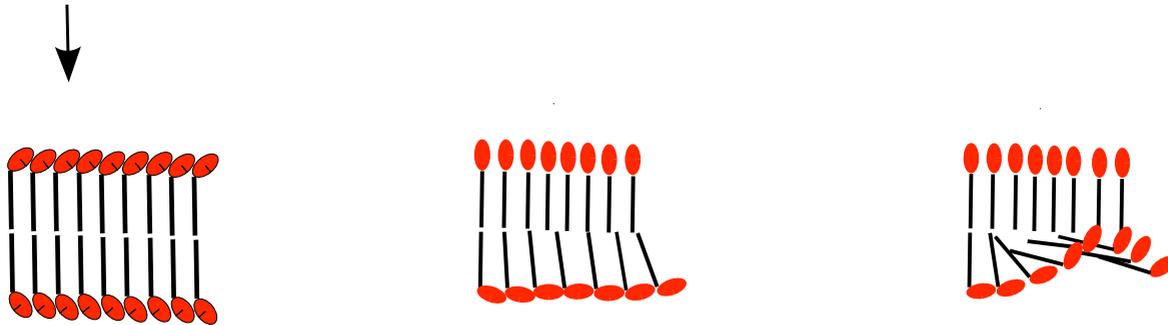


A model for the membrane



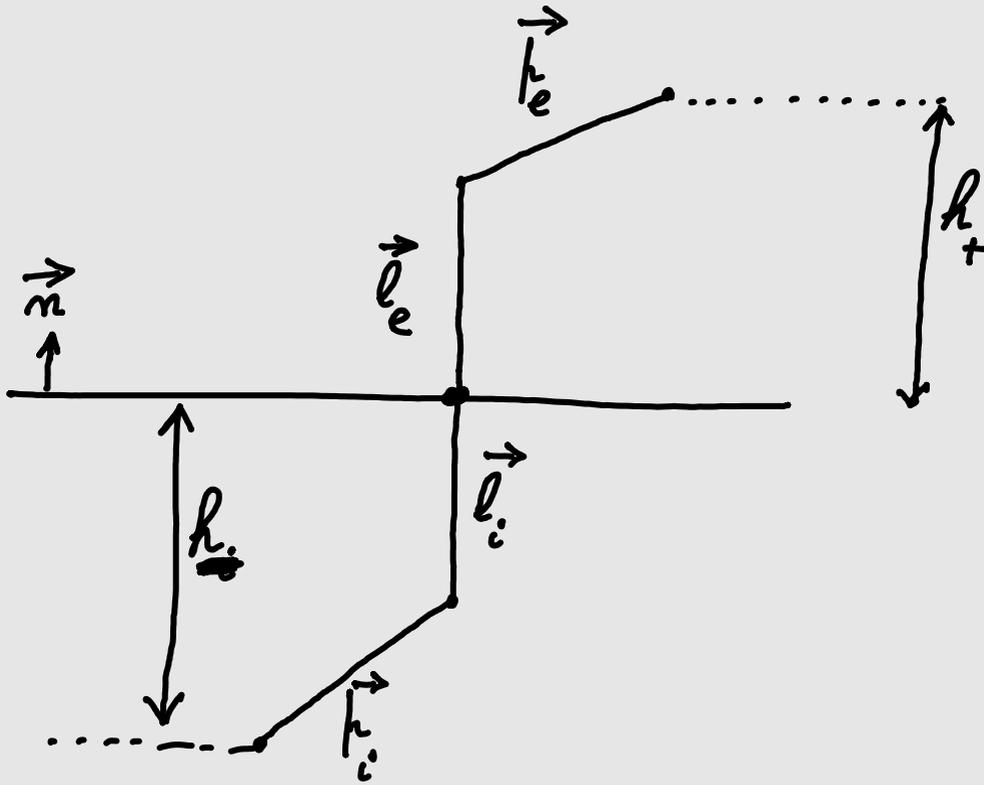
A model for the membrane

However one may conjecture that as a matter of fact, what happens is something like



That is first the dipoles (heads) get oriented and then there is a partial collapse of the phospholipids. There is no « pore », but rather a sharp decrease of the thickness, which is enough for the passage of molecules.

A model for the membrane



A model for the membrane

- ▶ We denote by \mathbf{n} the normal to the mean surface of the membrane, and by h_{\pm} the height of the dipole above or below this surface

$$h_{\pm} = \pm \mathbf{n} \cdot \ell_{\pm} + \max(0, p_{\pm} \cdot \mathbf{n})$$

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- ▶ Then $h := h_+ + h_-$ is the thickness of the membrane.
- ▶ The dipoles p_{\pm} tend to rotate when submitted to an electric field.
- ▶ We assume that they satisfy a Landau-Lifschitz-Gilbert equation, namely:

$$\begin{cases} \frac{\partial p_{\pm}}{\partial t} = \alpha_1 p_{\pm} \times (\nabla v_{\Gamma_{\pm}} + G_{\pm}) - \alpha_2 p_{\pm} \times \frac{\partial p_{\pm}}{\partial t} \\ p_{\pm}(0) = c_{\pm} G_{\pm} \end{cases}$$

A model for the membrane

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- ▶ The boundary conditions are

$$\begin{cases} \sigma_c \frac{\partial v_c}{\partial \mathbf{n}} = \sigma_e \frac{\partial v_e}{\partial \mathbf{n}} & \text{on } \Gamma \\ \frac{\partial v_e}{\partial t} - \frac{\partial v_c}{\partial t} = \alpha_3 h(t, x) \frac{\partial v_c^0}{\partial \mathbf{n}} & \text{on } \Gamma \end{cases}$$

where v_c^0 is a potential obtained by an asymptotic analysis, making the thickness δ tend to zero. See the **domain**.

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- ▶ Existence and uniqueness of the solution is established by reducing the system to a new system written on Γ (using Steklov-Poincaré operators).
- ▶ Numerical simulations made by Frédéric de Gournay show that there is « permeabilization » in some spots, this behavior is not symmetric, and the membrane returns to its initial position once the electric field is turned off.