

GMA 09  
Riunione del Gruppo Materiali  
dell'AIMETA  
Politecnico di Milano  
23-24 Gennaio 2009



# Approccio micromeccanico alla modellazione di processi fisiologici

Paolo Bisegna



Università di Roma Tor Vergata  
Dipartimento di Ingegneria Civile

# Towards predictive modeling of biological systems

- Need to cope with different space and time scales:
- **nanoscale**: macromolecules, biological membranes, cytoskeleton, sarcomere (biochemical reaction cascades, cell response and motility, adaptation, etc.)
- **microscale**: cells and tissues (growth and remodeling, electric conduction, interface with biomedical devices)
- **macroscale**: organs, systems, whole organisms (overall behavior, signs and symptoms)
- **all space scales**: highly-regulated time dependent behavior at various **time scales** (e.g., acute/chronic loadings, early/late response)

# Bridging between scales

- Attempts to elucidate **macroscopic** behaviors **based on nanoscopic and microscopic** data are valuable
- Fully realistic simulation is impracticable because of the **cost** entailed and huge **amount of data** required
- **Abstraction and modeling** are needed: methods of mechanics of materials turns out to be very useful
- Noteworthy examples in GMA09 presentations. Here:
  - ✓ **Phototransduction** (nanoscale)
  - ✓ **Bioimpedance measurements** (microscale)

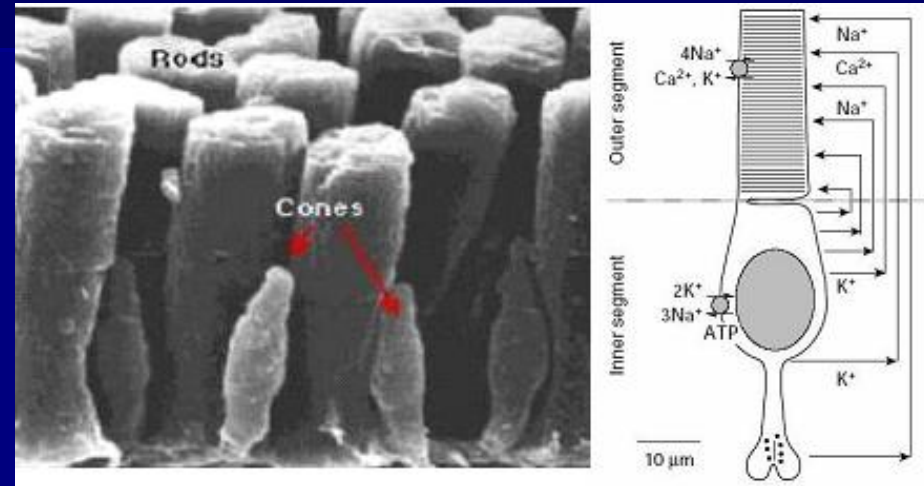
# Coauthors

M. Amar	University of Rome La Sapienza
D. Andreucci	University of Rome La Sapienza
G. Caruso	ITC – CNR
F. Caselli	University of Rome Tor Vergata
E. DiBenedetto	Vanderbilt University
R. Gianni	University of Rome La Sapienza
H. Hamm	Vanderbilt University



# Phototransduction

Transduction of **photons** into **electrical signals**

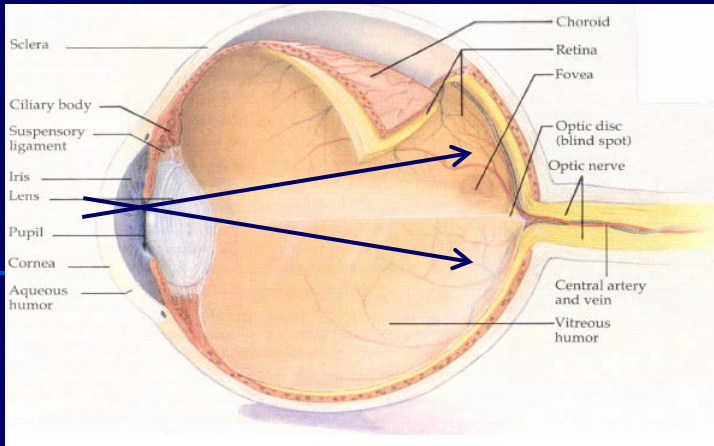


Biochemical process involving **diffusion** of second messengers into **highly structured** photoreceptors

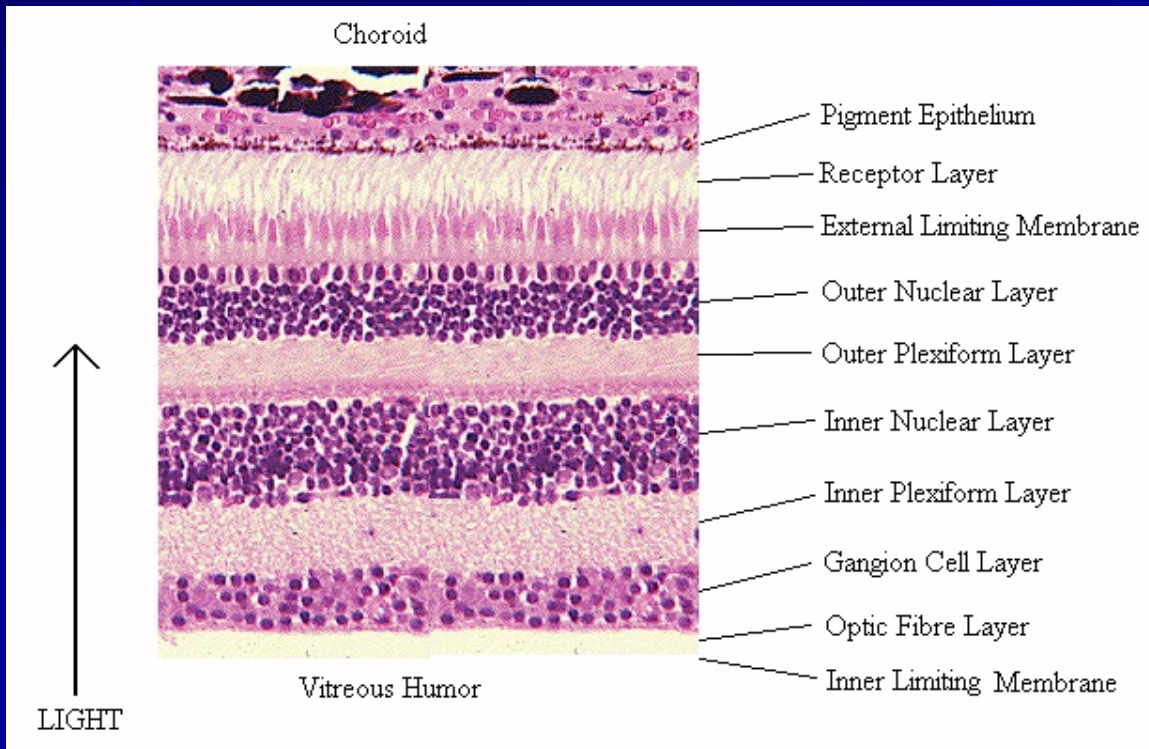
**Archetypal signaling**: similar mechanisms in response to odorant, tastant, some hormones

Modeling phototransduction may help elucidating **cell signaling mechanisms** and single out **drug targets**

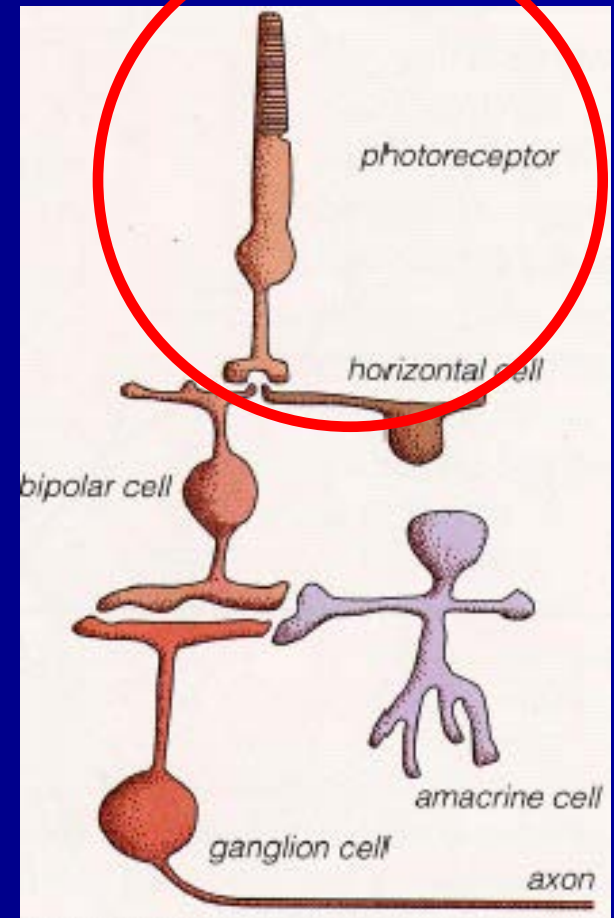
# Retinal organization



## Retinal layers



## Retinal cell types



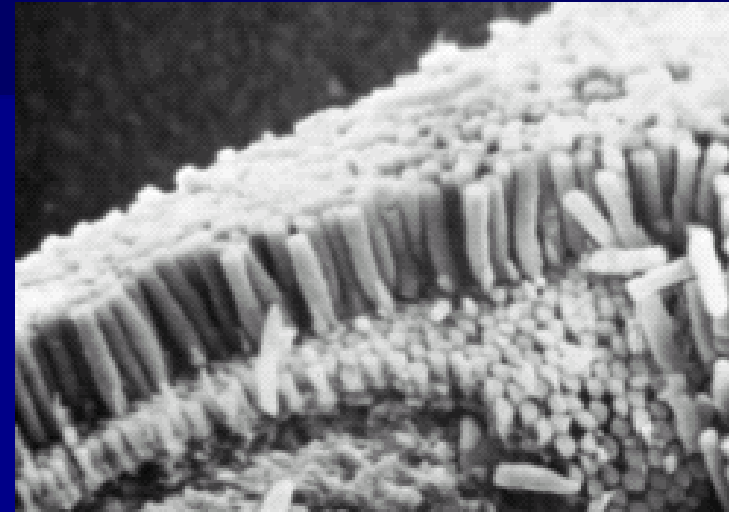
# Photoreceptors

## Cones:

Photopic vision

Virtually no saturation

Dynamic range : 5 decades



## Rods:

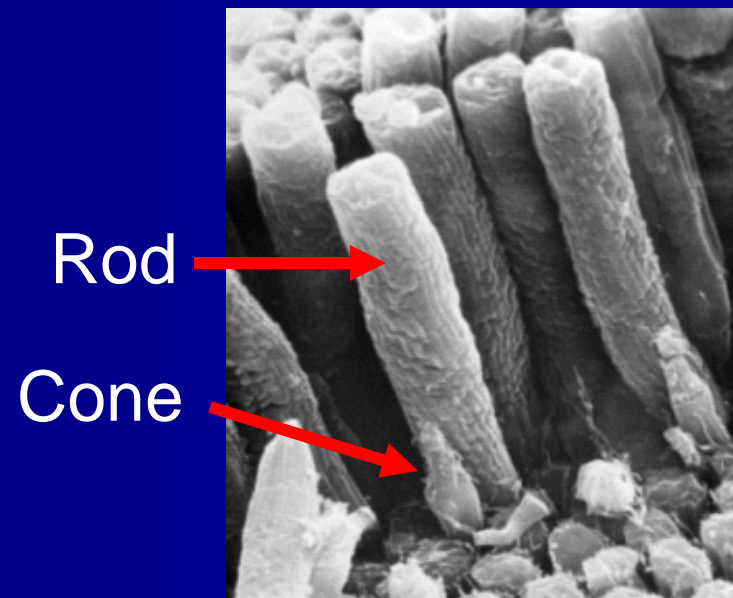
Scotopic vision

Single photon sensitivity

Response saturation

at 100 photon flash

Limited dynamic range, 2 decades



# Visible spectrum

Higher Frequency

Lower Frequency

UV

IR

400

500

600

700

Wavelength (nm)

Rods:

Cones:

blue

green

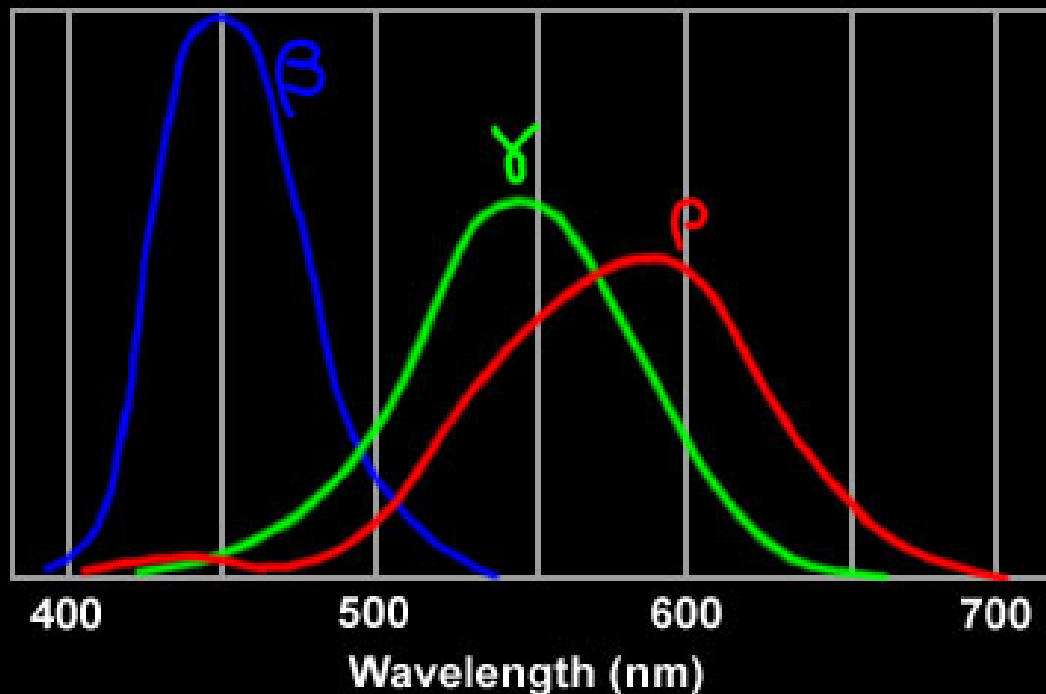
red

500 nm max



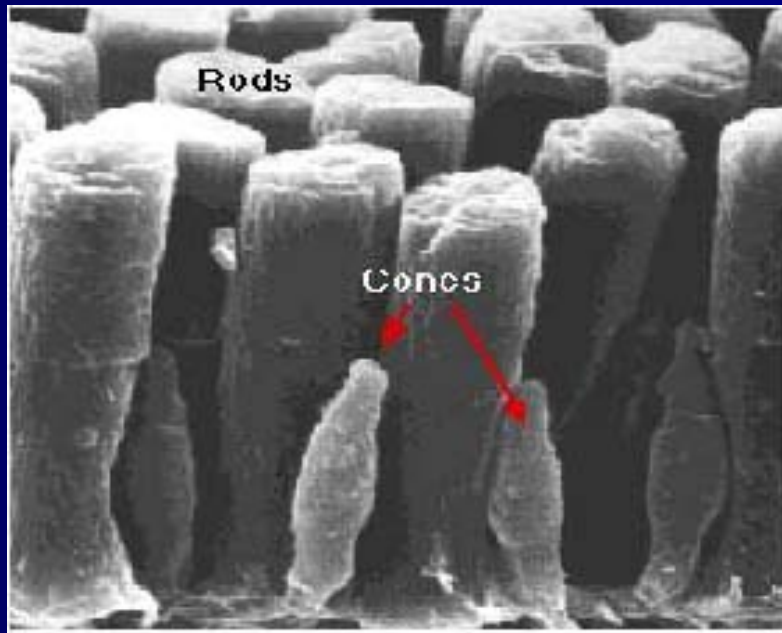
Rods do not see red:

- red rose at twilight;
- red instrument light of the ship captain





# Geometry of rods

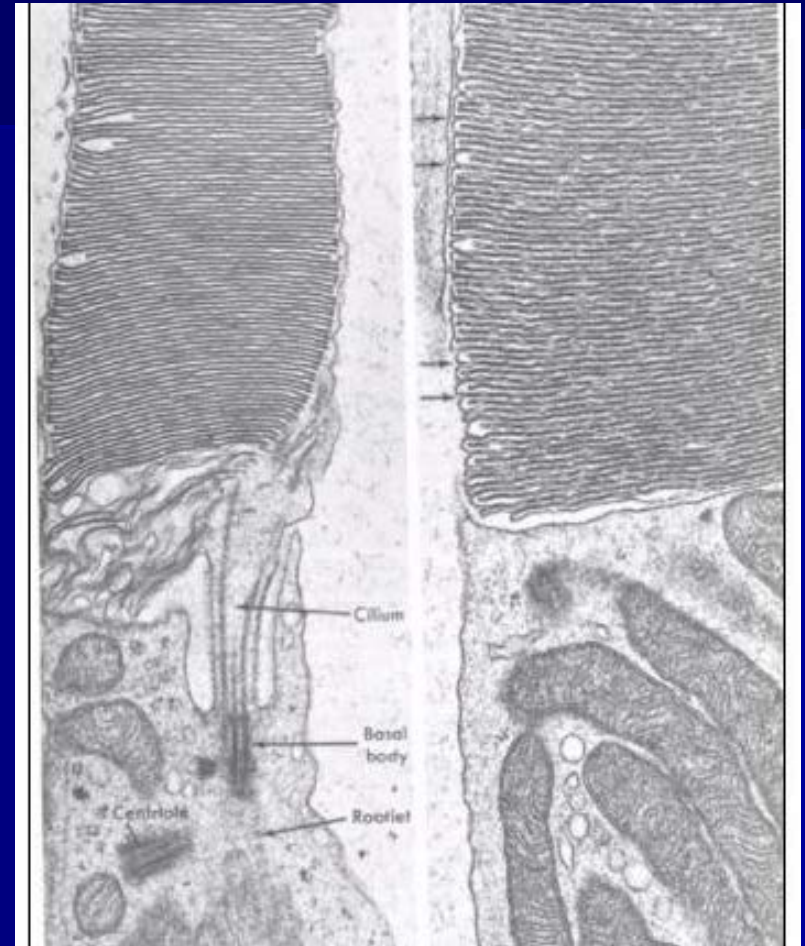
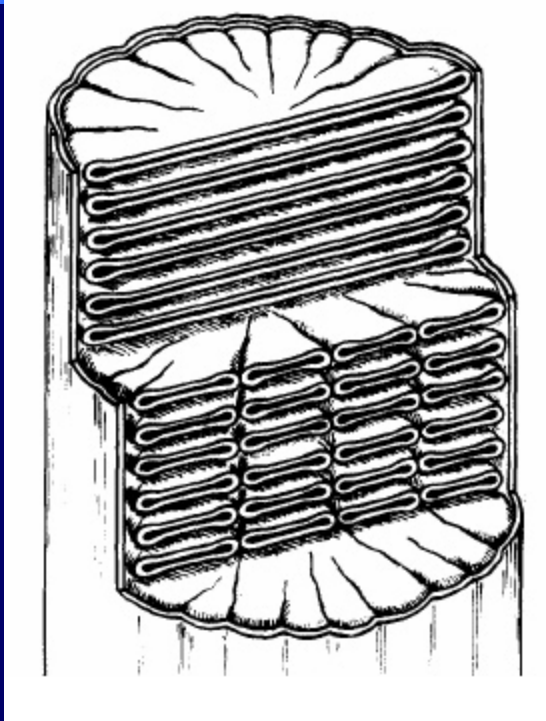


ROD (salamander):  
height  $\approx 20 \mu\text{m}$   
radius  $\approx 3 \mu\text{m}$



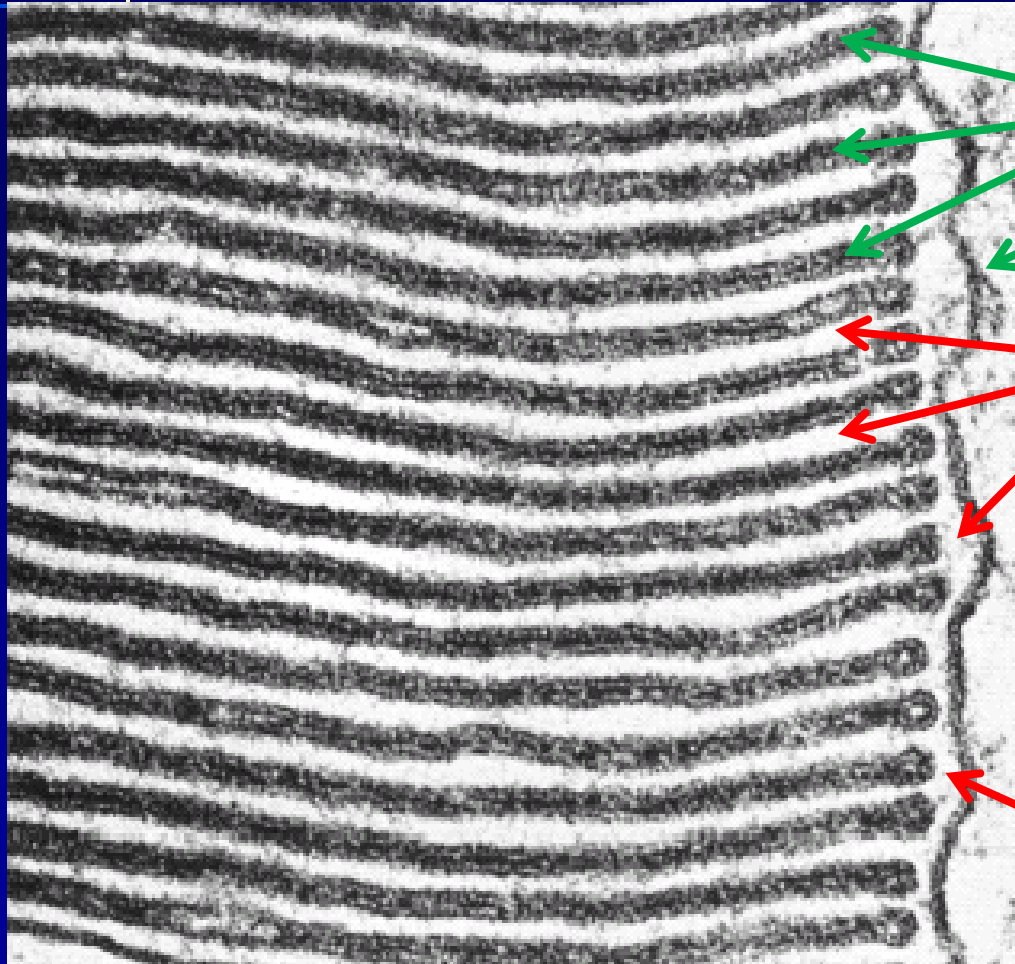
ROD (humans):  
height  $\approx 20 \mu\text{m}$   
radius  $\approx 0.5 \mu\text{m}$

# Structure of rods



A thousand flattened sacs (“disks”) fill rod outer segment

# Structure of rods



2D structures:

- Disc membranes
- Plasma membrane

3D structure: cytosol

discs  $\approx 800$

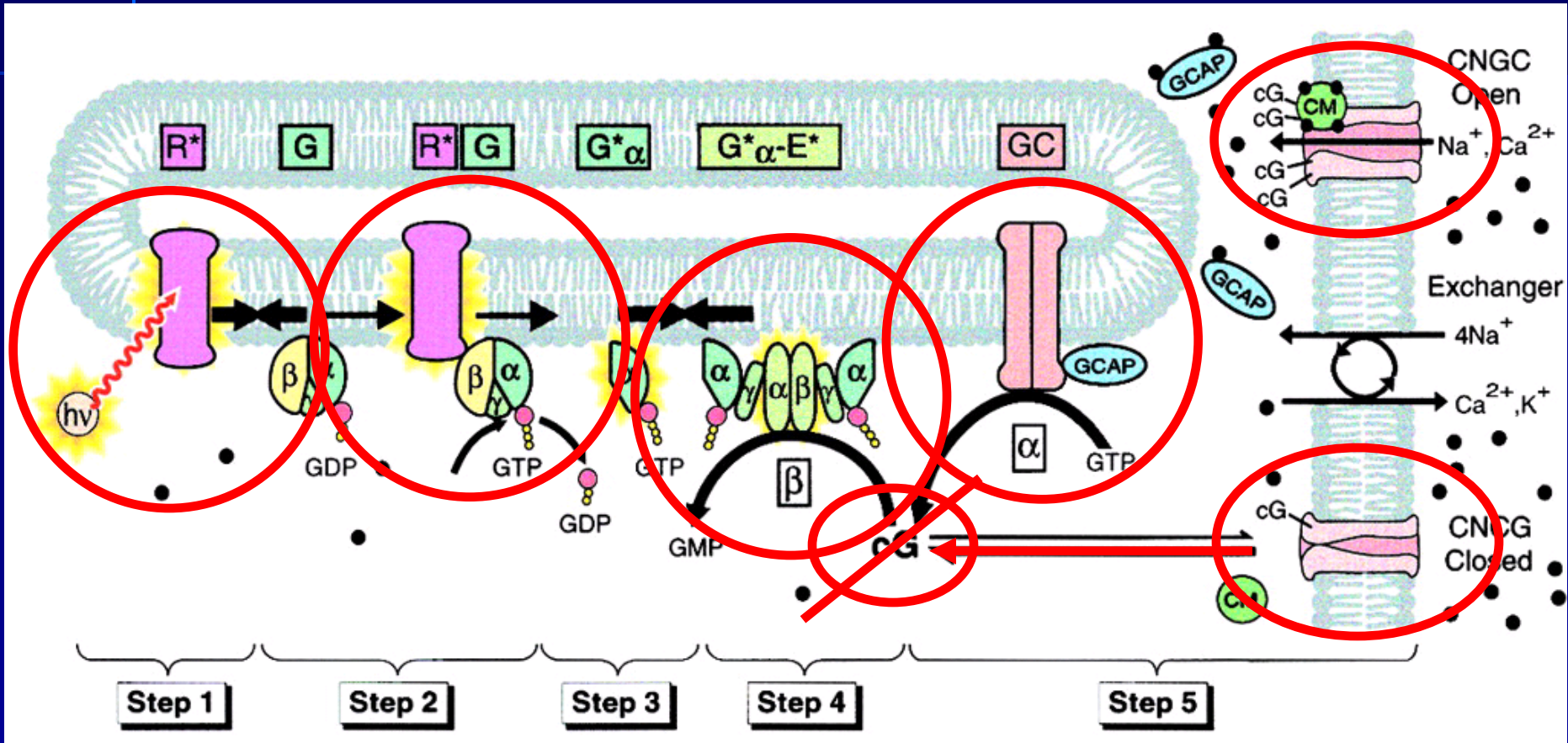
- width  $\approx 15$  nm

- distance  $\approx 15$  nm

outer shell

thickness  $\approx 15$  nm

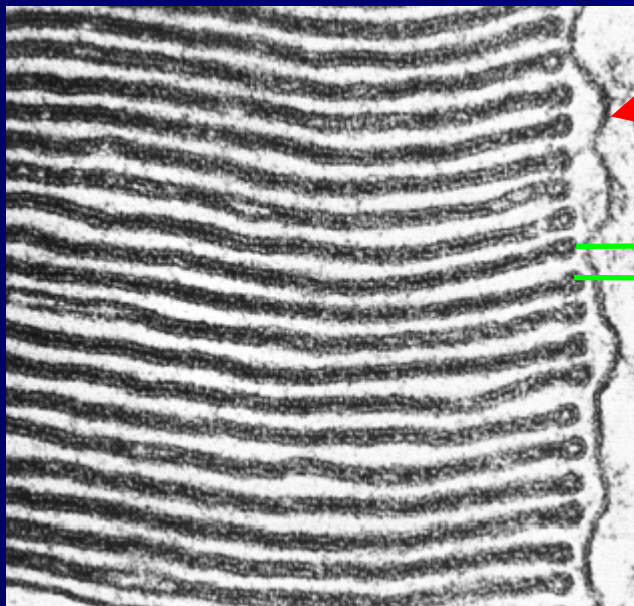
# Phototransduction cascade



- Initial steps occur on the disk surface  $\rightarrow$  cG depletion
- cG diffusion  $\rightarrow$  CNGC close  $\rightarrow$   $Ca^{2+}$  depletion, elect. resp.

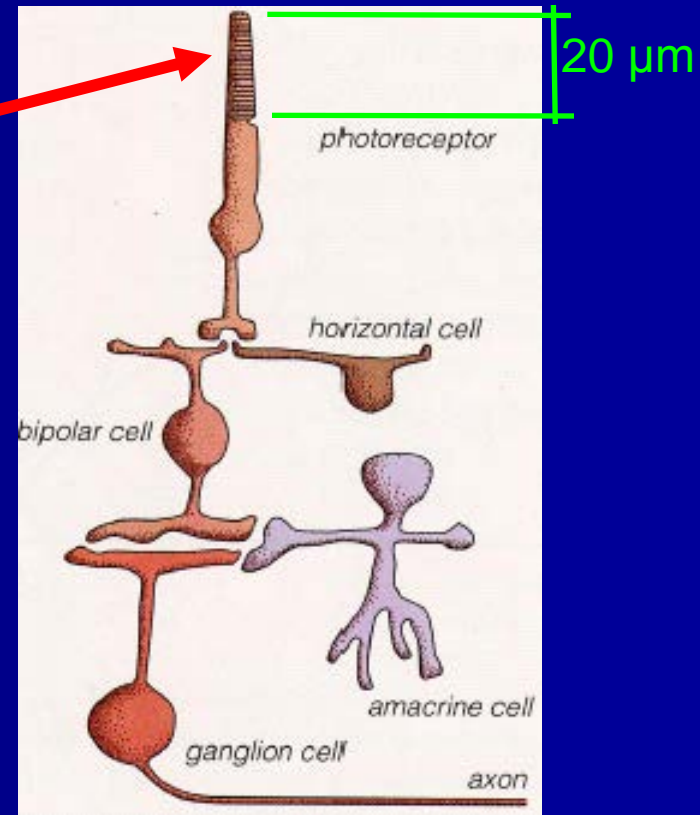
# Bridging between scales: Nano to Micro

Biophysical phenomenon  
strongly depends on cell  
nanostructure



Homogenization

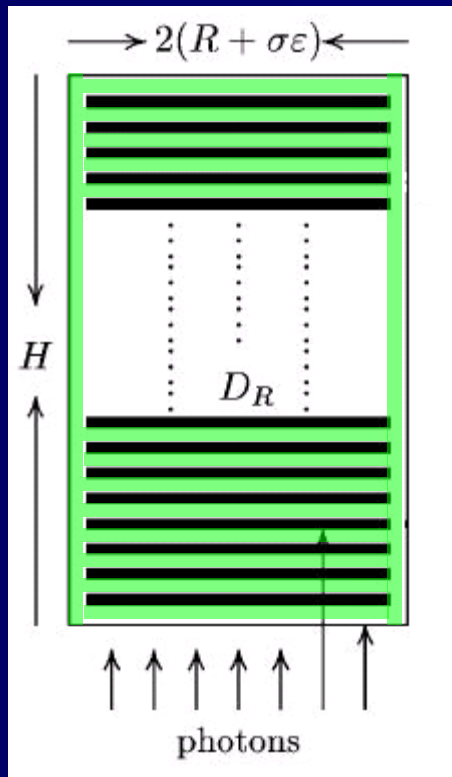
Biological output  
operates at cellular level



# Nanoscale: diffusion equations

diffusion of cG (cyclic guanosine monophosphate)

$$\frac{\partial [cG]}{\partial t} - D_{cG} \nabla^2 [cG] = 0$$



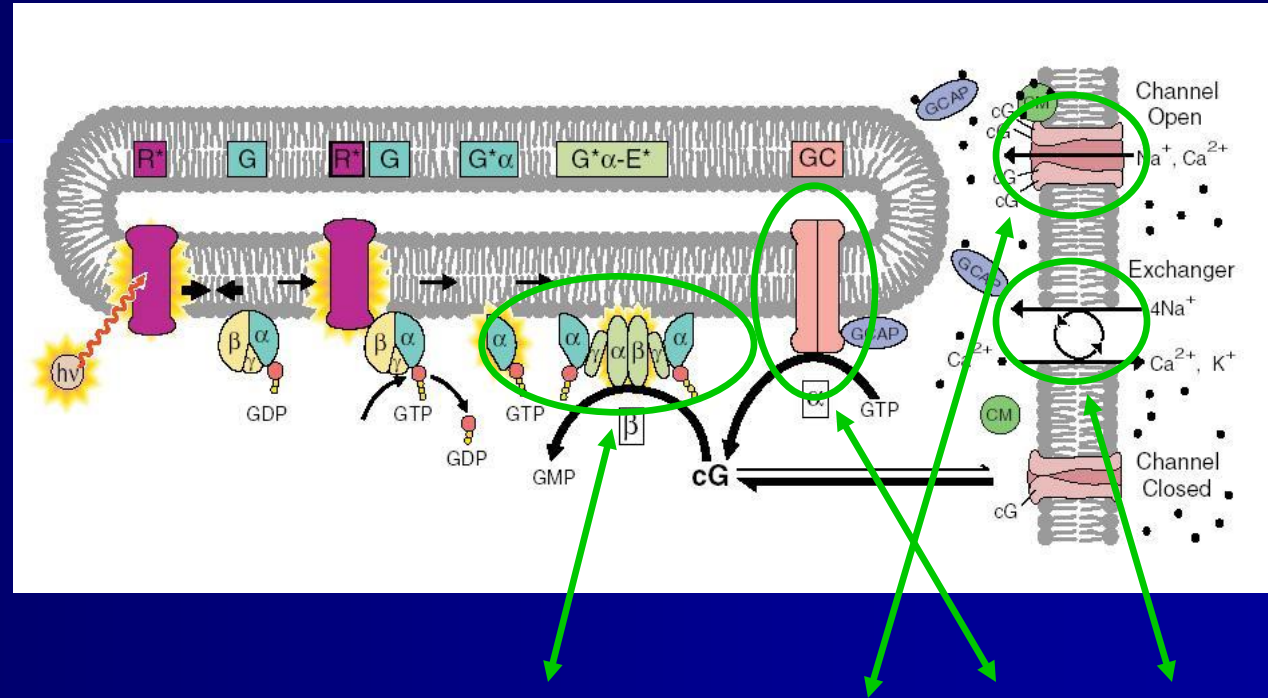
diffusion of  $Ca^{2+}$  (calcium ion)

$$\frac{\partial [Ca^{2+}]}{\partial t} - D_{Ca} \nabla^2 [Ca^{2+}] = 0$$

in the cytosol:  
a **perforated** domain

# Nonlinear boundary-flux terms

Membrane-bound enzymes acting on cytosolic substrates



$$-D_{cG} \nabla [cG] \cdot n = E_{\sigma}^* [cG] - \frac{\alpha}{1 + ([Ca^{2+}]/\beta)^m}$$

Boundary flux terms  
on specific surfaces

# Alleviating geometric complexity

Inner cylinder:

Periodic structure

Homogenization (period  $\varepsilon \rightarrow 0$ )

Perforated domain

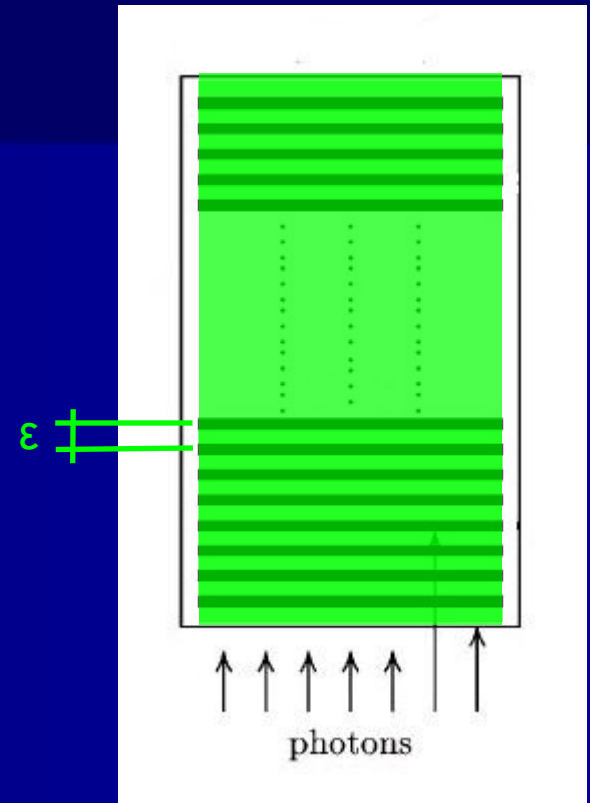


Effective  
anisotropic  
medium

3D diffusion in  
interdiscal  
spaces



Family of 2D diffusion  
parametrized by the  
longitudinal variable  $z$





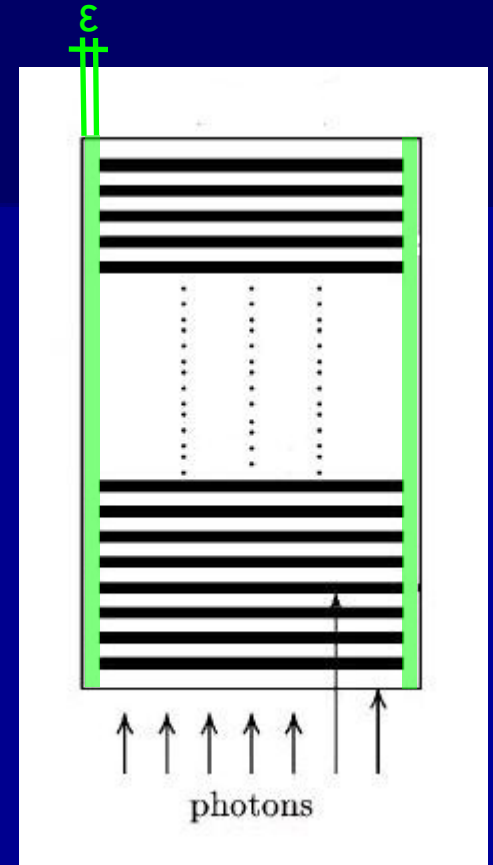
# Alleviating geometric complexity

Outer shell:

Thin layer

Concentrating capacity (thickness  $\varepsilon \rightarrow 0$ )

Mass conservation: **rescale** capacity  
and diffusion coefficients by  $a_\varepsilon \approx 1/\varepsilon$



Outer shell  
diffusion (3D)



Surface diffusion (2D)

# Limit as $\varepsilon \rightarrow 0$

A-priori estimates (uniform w. r. to  $\varepsilon$ )

- Energy estimate ( $u_\varepsilon$  stands for [cG] or [Ca<sup>2+</sup>]):

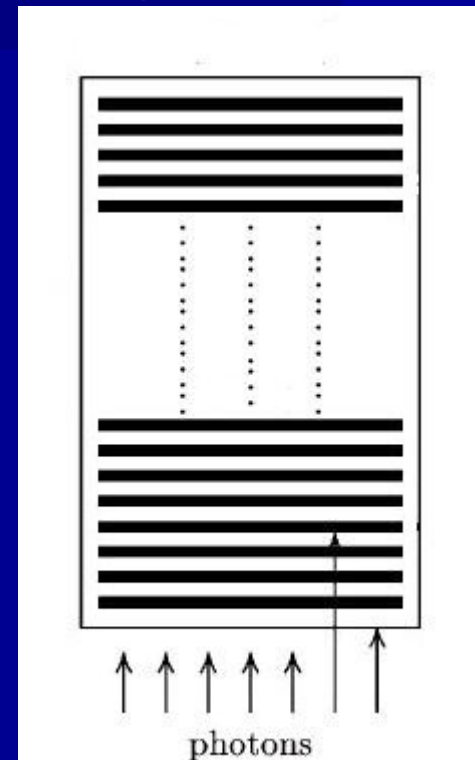
$$\sup_{0 \leq t \leq T} \left\| \sqrt{a_\varepsilon} u_\varepsilon(\cdot, t) \right\|_{2, \tilde{\Omega}_\varepsilon} + \left\| \sqrt{a_\varepsilon} \nabla u_\varepsilon \right\|_{2, \tilde{\Omega}_{\varepsilon, T}} \leq \gamma$$

- Equiboundedness:  $0 \leq u_\varepsilon(x, t) \leq \gamma$

Perforated domain **depends on  $\varepsilon$**

Need to **extend  $u_\varepsilon$  inside the holes**

(in Cioranescu, Saint Jean Paulin, 1998, homogeneous Neumann boundary conditions)



# $H^1$ extension of $u_\varepsilon$

$\bar{u}_\varepsilon(P)$  inside a hole:

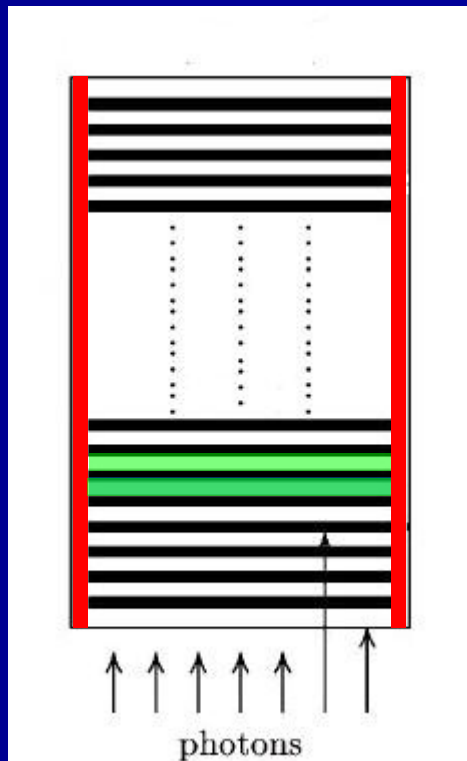
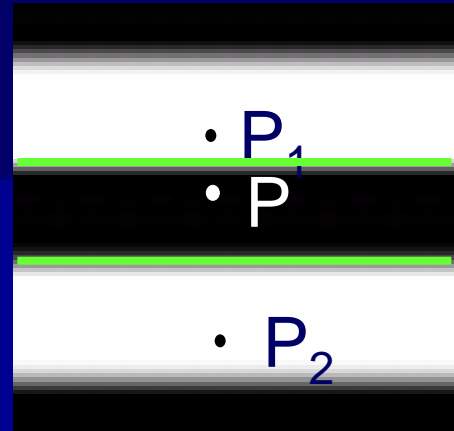
weighted mean of  $u_\varepsilon(P_1)$  and  $u_\varepsilon(P_2)$  at reflected points  $P_1$  and  $P_2$  inside adjacent interdiscal spaces

But  $u_\varepsilon(P_1)$  and  $u_\varepsilon(P_2)$  seem to be not related to each other:

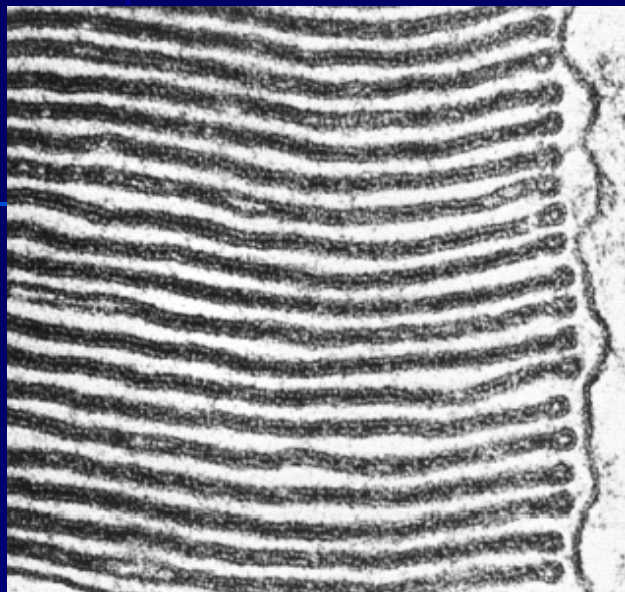
Why should the extension  $\bar{u}_\varepsilon$  have any **uniform regularity in  $z$** ?

$$\left\| \bar{u}_\varepsilon(z+h) - \bar{u}_\varepsilon(z) \right\|_{2, \Omega_{o,T}} \leq \gamma h$$

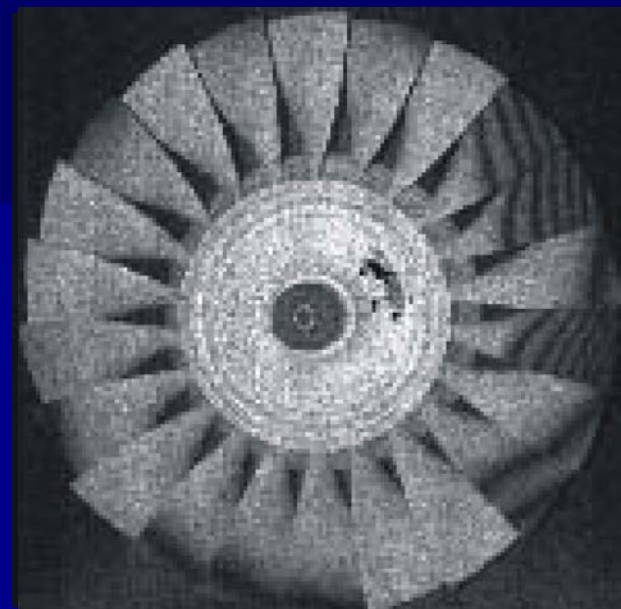
$$\left\| \bar{u}_\varepsilon \right\|_{L^2(0,T;W^{1,2}(\Omega_o))} \leq \gamma$$



# Almost disconnected structures

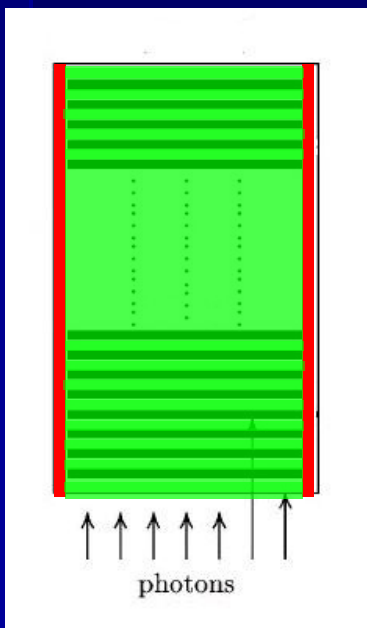


Bladed rotors

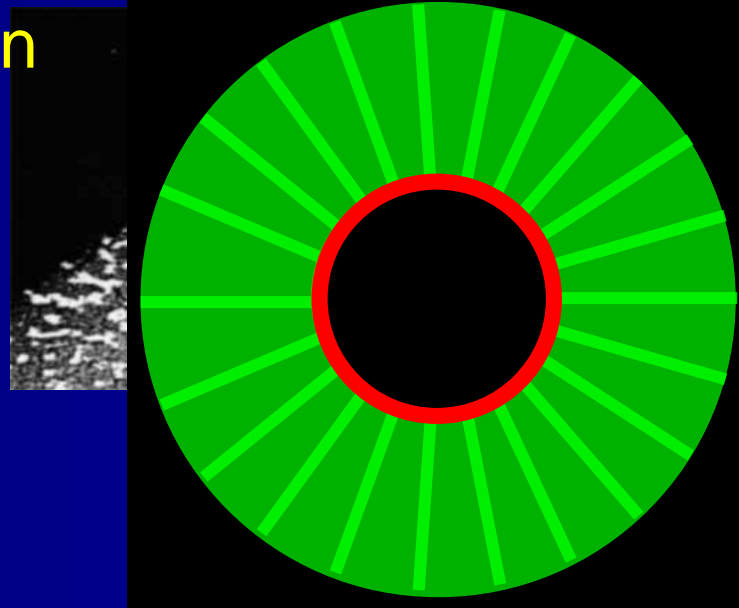


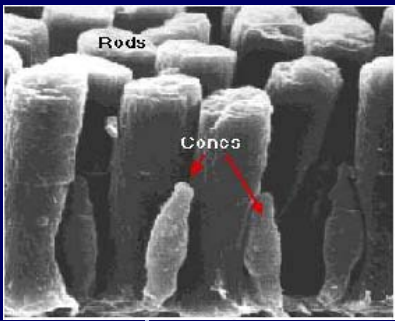
Vibration  
localization

Homogenization



Phototransduction





# Model at microscale

- Interior limit ( $u$ ): family of 2D diffusions driven by volumic source  $f$  accounting for flux on discs

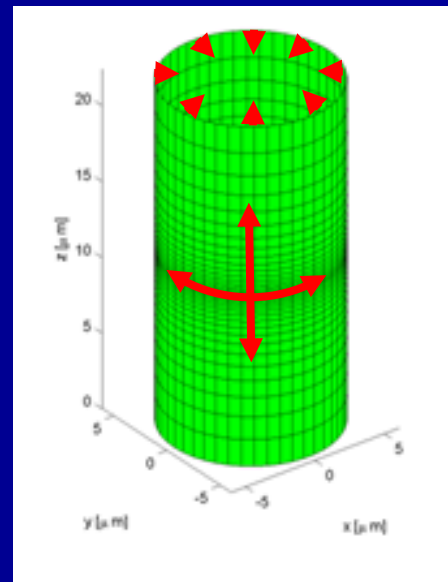
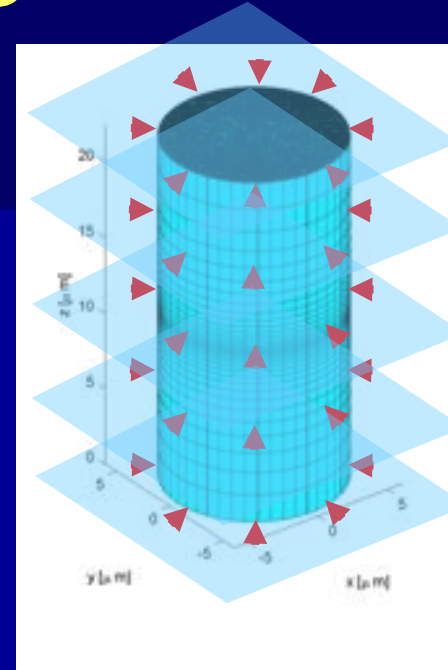
$$u_t - \Delta_{\bar{x}} u = -(u - f)$$

- Limit on the outer shell ( $\hat{u}$ ):

$$\hat{u}(\theta, z, t) = u(\bar{x}, z, t) \Big|_{|\bar{x}|=R}$$

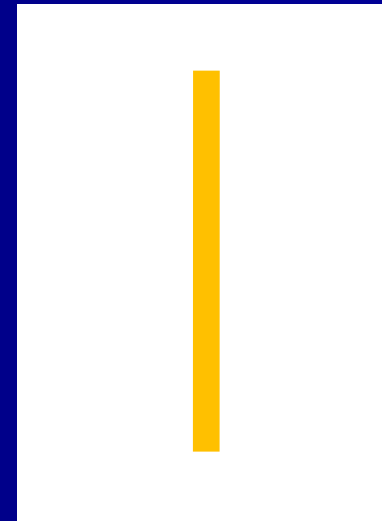
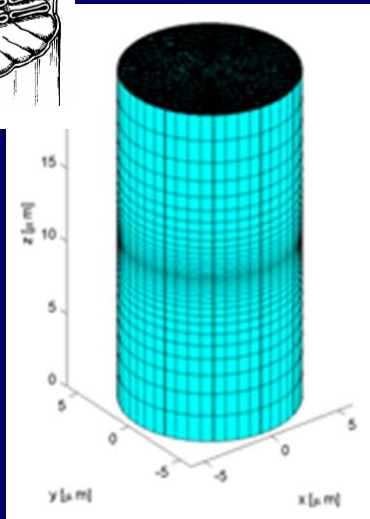
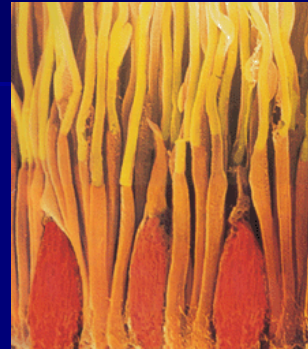
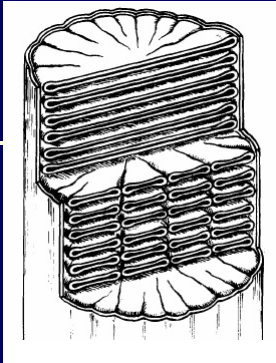
2D diffusion driven by outflux from interior

$$\hat{u}_t - \Delta_S \hat{u} = -\frac{(1 - \theta_o)}{\sigma \epsilon_o} u_\rho \Big|_{|\bar{x}|=R} + g$$



# Reduced model

ROD (humans)



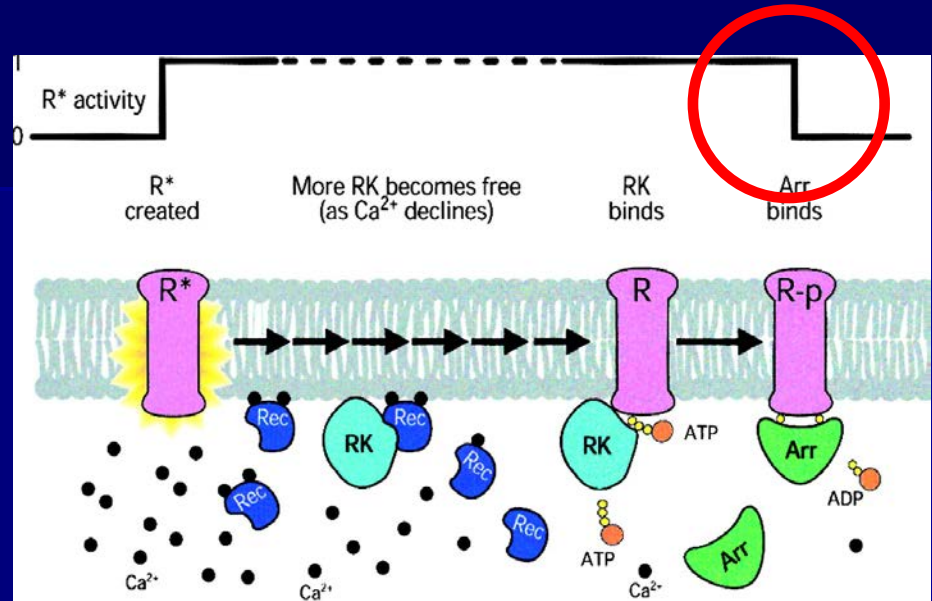
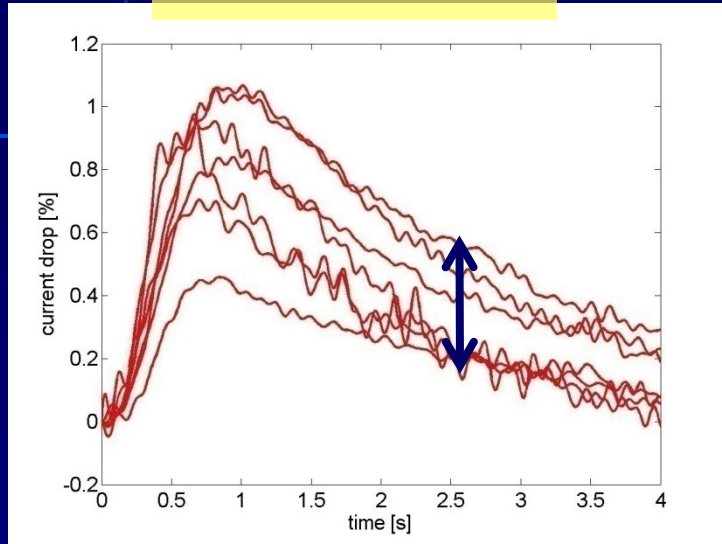
Family of 2D diffusions  
+ diffusion on outer shell

1D diffusion:

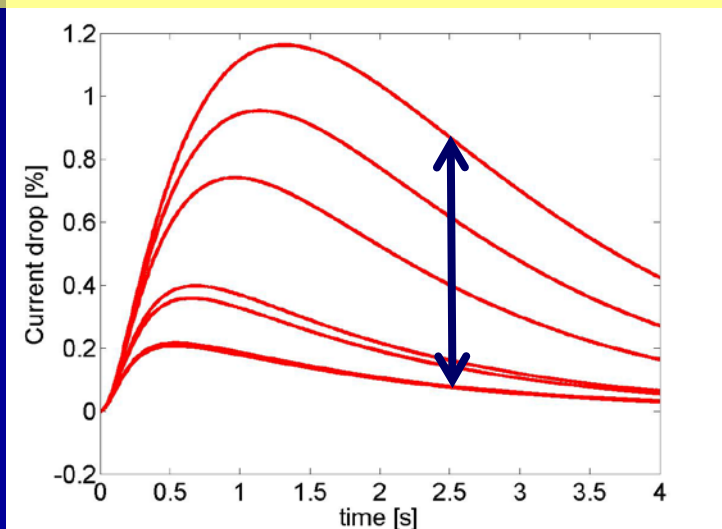
$$\frac{\partial [cG]}{\partial t} - D_{\text{eff}} \frac{\partial [cG]}{\partial z^2} = -\beta [cG] + f([Ca^{2+}])$$

# Example: variability of the response

Observed



Expected, based on  $R^*$  decay time



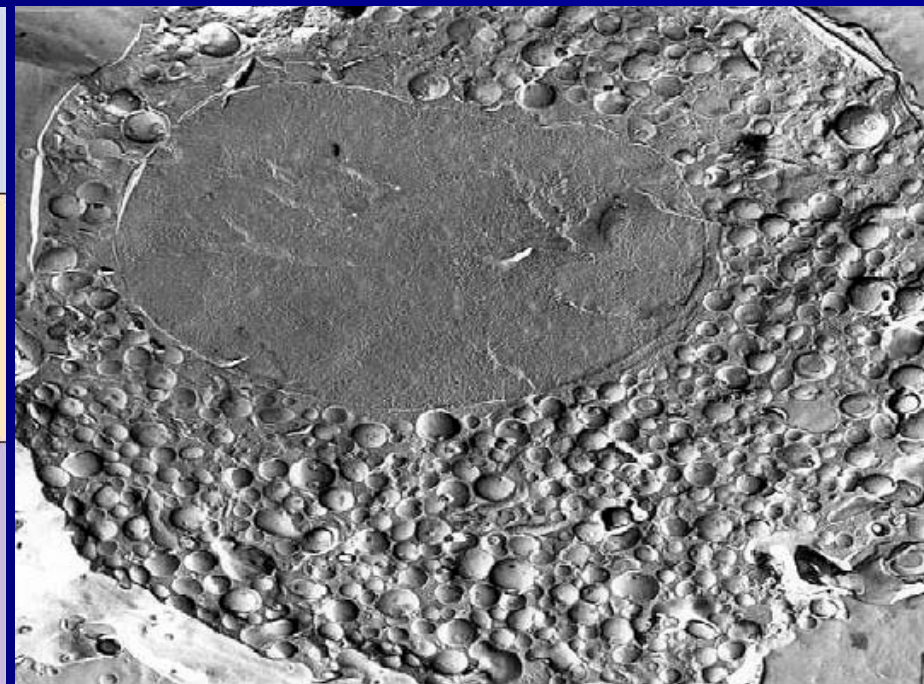
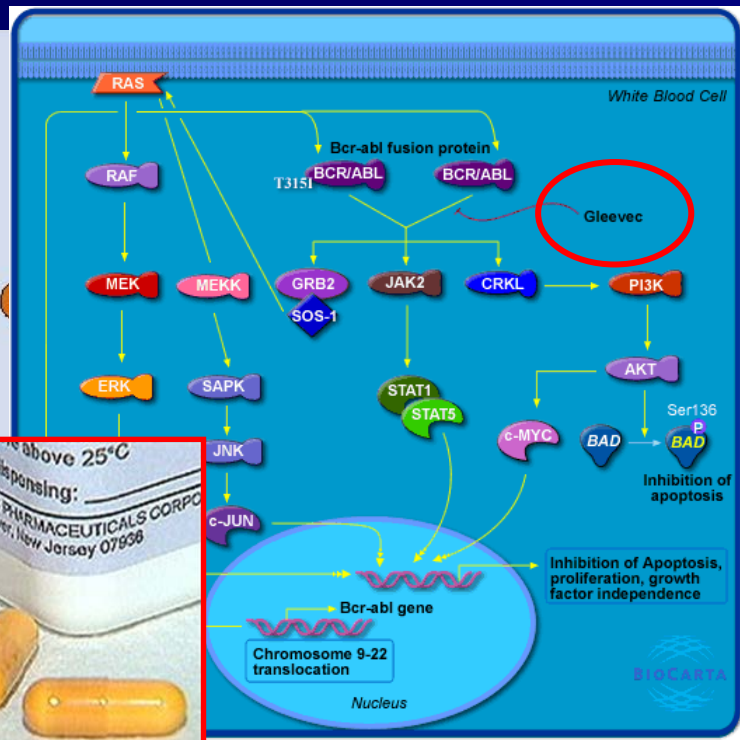
Variability is mainly due to randomness of  $R^*$  shutoff

Observed variability is lower than expected

Model quantitatively accounts for variability reduction:  
Diffusion / "Cellar effect"

# Perspectives

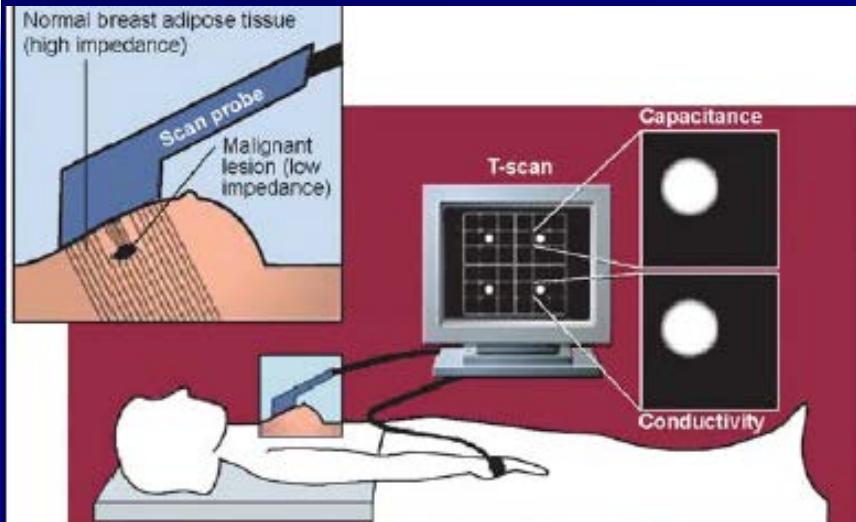
- Spatio-temporal model: useful to tackle open biophysical problems (e.g., light adaptation, cones)
- Similar approach to model other signaling networks



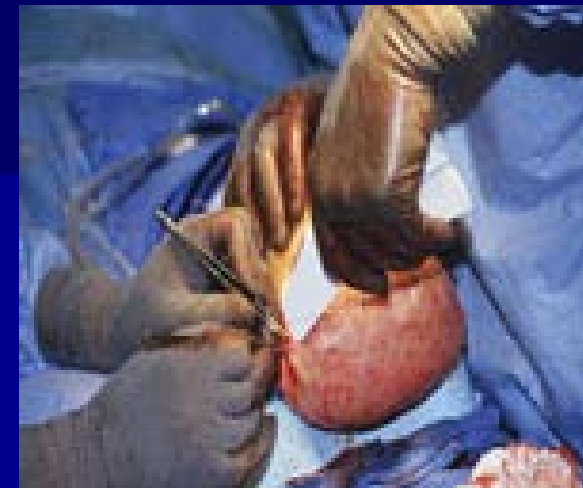


# Bioimpedance measurements

Non-invasive diagnosis and treatment



Electrical Impedance Tomography



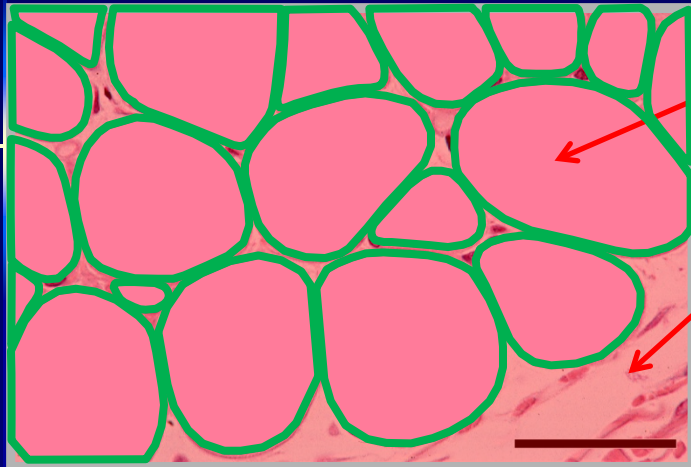
Monitoring of transplant organs

Virtual biopsy,  
RF-ablation, dialysis

Measurements currently fitted by **phenomenological** models: ambiguities arise

Aim: to determine the relationships between **effective** dielectric properties and properties of the **constituents**

# Electric conduction



Intra-/extra- cellular space

$$\text{div}(\sigma \nabla w_\varepsilon) = 0$$

$w_\varepsilon$ : electric potential

$\sigma$ : conductivity

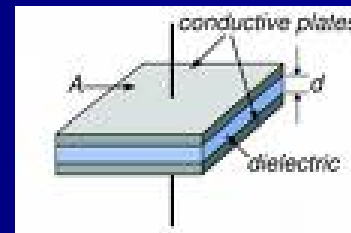
$\varepsilon$ : microstructural scale

Capacitive-conductive behavior:

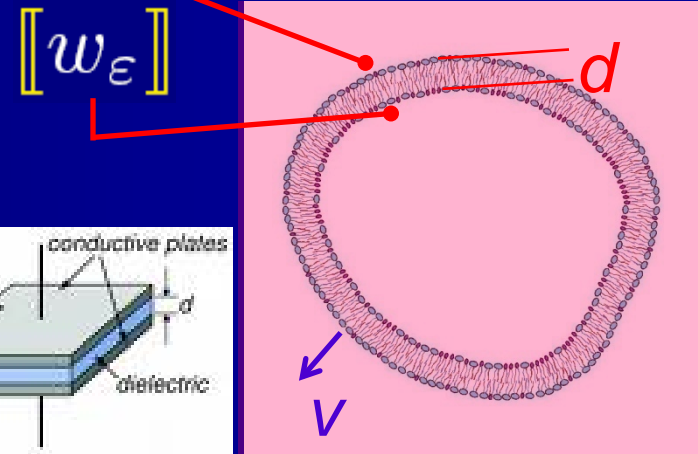
**Imperfect** interface

$$[[\sigma \nabla w_\varepsilon \cdot \nu]] = 0$$

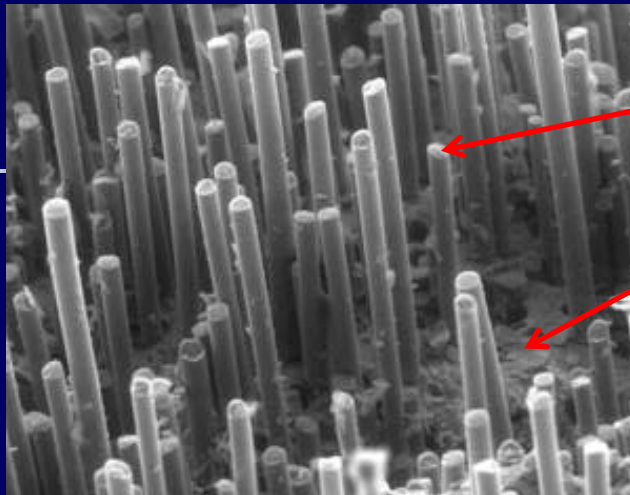
$$\frac{\epsilon_0 \epsilon_r}{\epsilon d} \frac{\partial [[w_\varepsilon]]}{\partial t} + \frac{\sigma}{\epsilon d} [[w_\varepsilon]] = \sigma \nabla w_\varepsilon \cdot \nu$$



Cell



# Anti-plane problem



Fibre / matrix

$$\operatorname{div}(G \nabla w_\varepsilon) = 0$$

$w_\varepsilon$ : longitudinal displacement

$G$ : shear modulus

$\varepsilon$ : microstructural scale

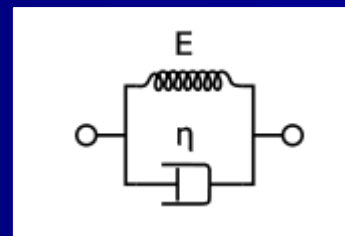
## Imperfect interface

Lene & Leguillon, 1981; Hashin, 1991; Bigoni et al., 1998

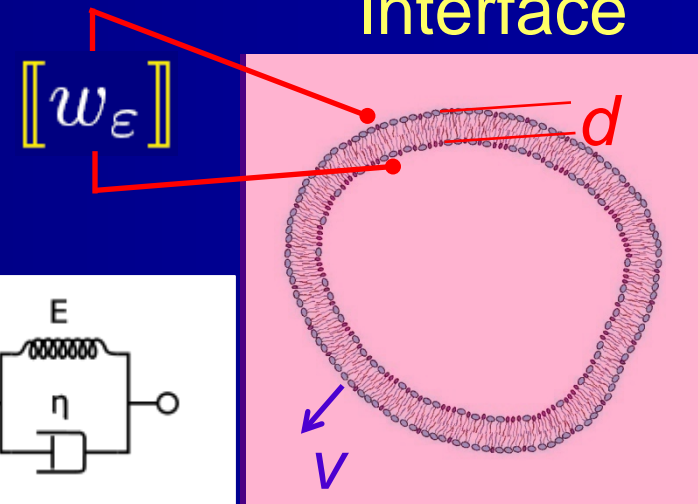
## Kelvin-Voigt model

$$[[G \nabla w_\varepsilon \cdot \nu]] = 0$$

$$\frac{\eta}{\varepsilon d} \frac{\partial [[w_\varepsilon]]}{\partial t} + \frac{E}{\varepsilon d} [[w_\varepsilon]] = G \nabla w_\varepsilon \cdot \nu$$

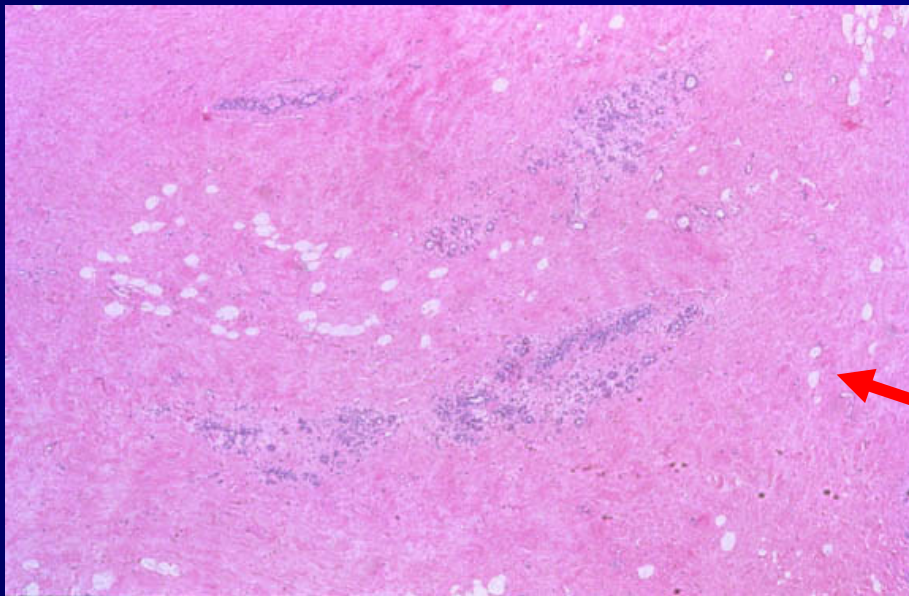


## Interface

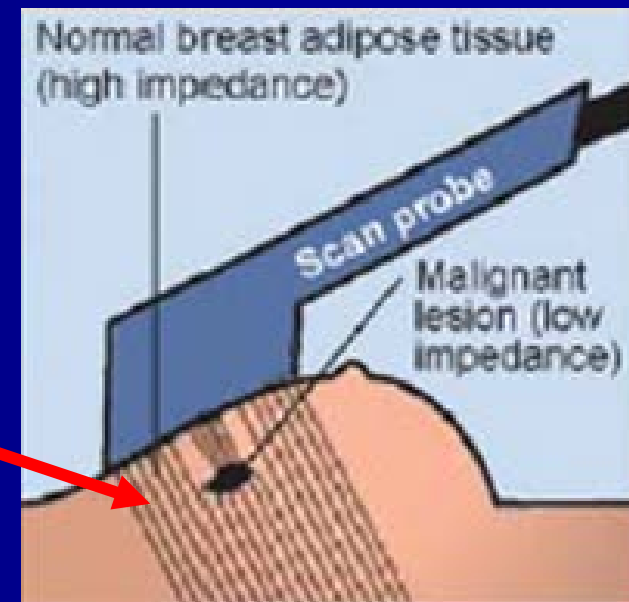


# Bridging between scales: Micro to Macro

Biophysical phenomenon strongly depends on tissue microstructure

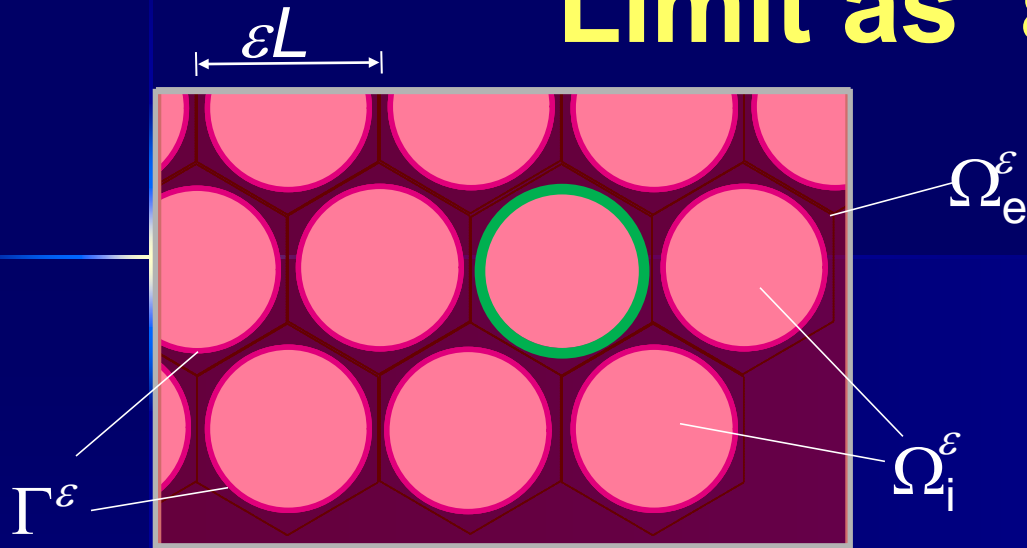


Measurements are taken at organ level



Homogenization

# Limit as $\varepsilon \rightarrow 0$



Periodic microstructure

$$w_\varepsilon \in H^1(\Omega_i^\varepsilon) \cap H^1(\Omega_e^\varepsilon)$$

$$w_\varepsilon \notin H^1(\Omega)$$

Energy estimate:

$$\int_0^t \int_\Omega \sigma |\nabla w_\varepsilon|^2 dx dt + \frac{1}{\varepsilon} \int_{\Gamma^\varepsilon} [[w_\varepsilon]]^2(x, t) d\sigma \leq \gamma$$

Poincare's inequality (Hom. Dirichlet b.c. on  $\partial\Omega$ ):

$$\int_\Omega v^2 dx \leq C \left\{ \int_\Omega |\nabla v|^2 dx + \frac{1}{\varepsilon} \int_{\Gamma^\varepsilon} [[v]]^2 d\sigma \right\}$$

Equiboundedness in  $H^s(\Omega)$ ,  $0 < s < 1/2 \rightarrow$  strong  $L^2$  conv.

(Hummel, 1999)

# Limiting equation

$$w_\varepsilon \rightarrow w_0$$

$$\sigma \nabla w_\varepsilon \rightarrow \xi$$

$$\operatorname{div} \xi = 0$$

How are  $w_0$  and  $\xi$  related to each other ?

What is the effective constitutive equation ?

Oscillating test function method (Tartar, 1977)

( $\rightarrow$  imperfect interfaces & time-dependent behavior)

$$\xi = \sigma^\# \nabla w_0 + \int_0^t F(t - \tau) \nabla w_0(x, \tau) d\tau + \mathcal{S}$$

**Memory effects appear**

Barbero et al, 1995

Yeong-Moo et al., 1998

Giorgi et al., 2001

Friebe et al., 2006

Appleby et al., 2006

# Effective behavior

Fourier transform in time & asymptotic expansion:

$$w_\varepsilon = w_0(x) - \varepsilon \chi(y) \cdot \nabla w_0(x) + \dots$$

## Cell-problem

$$\begin{aligned}
 -\sigma \Delta_y \chi_h &= 0 && \text{in } Q_i \cup Q_e \\
 \llbracket \sigma (\nabla_y \chi_h - \mathbf{e}_h) \cdot \nu \rrbracket &= 0 && \text{on } \Gamma \\
 Y[\chi_h] &= \sigma (\nabla_y \chi_h - \mathbf{e}_h) \cdot \nu && \text{on } \Gamma
 \end{aligned}$$

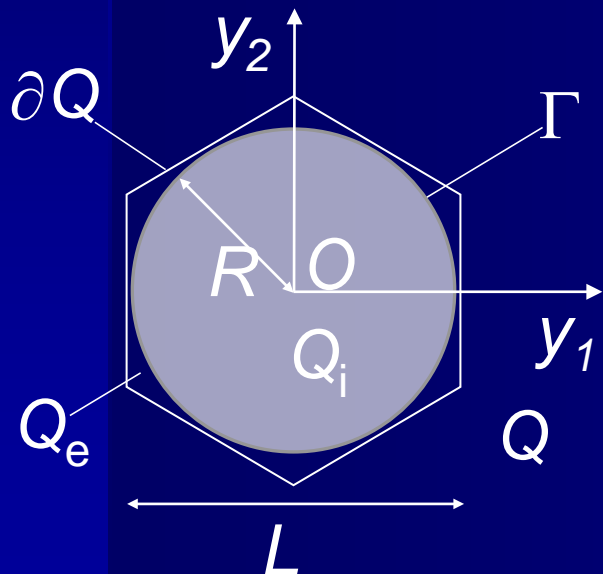
Lord Rayleigh, 1892  
 Gu et al, 1992  
 Nicorovici et al, 1993  
 Sangani et al, 1997  
 Cheng et al, 1997  
 Rodríguez-Ramos, 2001  
 Jiang et al, 2004

## Solution (Fourier series in space)

$$\chi_i = \sum_{m=1}^{+\infty} a_m \left(\frac{r}{R}\right)^m \cos m\theta$$

$$\chi_e = \sum_{m=1}^{+\infty} \left[ b_m \left(\frac{r}{R}\right)^m + b_{-m} \left(\frac{r}{R}\right)^{-m} \right] \cos m\theta$$

$$\chi_e = -c_1 \Re \left( \frac{\eta_1}{\omega_1} z \right) + \sum_{s=1}^{+\infty} c_s \Re \left( \frac{\zeta^{(s-1)}(z)}{(s-1)!} \right)_n$$



# Effective behavior

Closed-form effective conductivity (Fourier domain)

$$\frac{\sigma^{\#}}{\sigma_e} = \frac{\gamma_1^- \sum_{n=0}^N \sum_{I \in \mathcal{N} \mathcal{C}_n} (\det M_{I,I}) \prod_{k \in I} (\gamma_k^-)^{-1} \left( \frac{\omega_1}{\eta_1} f \right)^{|I|}}{\gamma_1^+ \sum_{n=0}^N \sum_{I \in \mathcal{N} \mathcal{C}_n} (\det M_{I,I}) \prod_{k \in I} (\gamma_k^+)^{-1} \left( \frac{\omega_1}{\eta_1} f \right)^{|I|}}$$

$f$  : volume fraction;  $\gamma$ 's : material parameters;  
others : geometry

Truncation order  $N=3$

$$\frac{\sigma^{\#}}{\sigma_e} = 1 - \frac{2f}{\gamma_1} \left[ 1 + \frac{f}{\gamma_1} - \frac{\frac{p_{1,5} f^6}{\gamma_1 \gamma_5}}{1 - \frac{p_{5,7} f^{12}}{\gamma_5 \gamma_7}} \right]^{-1}$$



# Perspectives

Extension to nonperiodic structures

Applications: Virtual biopsy, RF-ablation, monitoring cell growth and adhesion, device optimization

**Modeling electroporation:** gene therapy, bioavailability of drugs (electrochemotherapy)

