

# Multiscale modeling of ion transport through nanopores: the case study of a rectifying bipolar nanofluidic diode

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## Hybrid Methods in Molecular Simulation

Cagliari, Italy

Supported by the National Research, Development and Innovation Office – NKFIH NN113527 in the framework of ERA Chemistry.

Cagliari, 2017.04.03-04.

## People on board: international multiscale modeling network

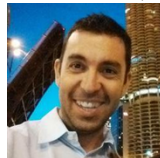
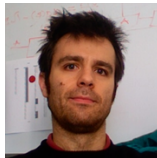
**The University of Pannonia / iASK team:** Dezső Boda, Tamás Kristóf, Mónika Valiskó, Zoltán Ható



**The Chicago wizard:** Dirk Gillespie



**The Italian connection:** Simone Furini, Claudio Berti



**The Mathematicians:**

Bart Matejczyk, M.-T. Wolfram, Jan Pietschmann



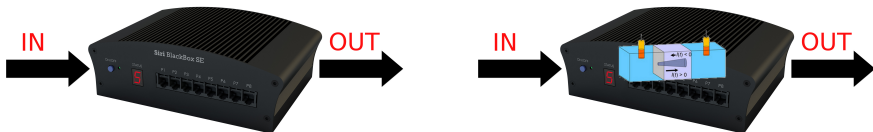
**The Carloni Group (Jülich):**

Paolo Carloni, Justin Finnerty



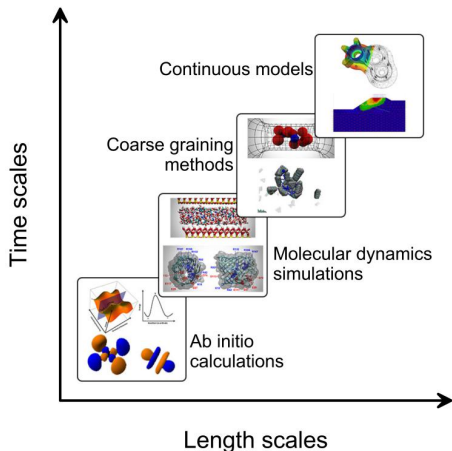
# Study nanodevices and peek into the black box

- Many devices are **black boxes**, in the sense that **input-output** relations (response functions) are known, but we know much less about their internal structures.
- Their inner mechanisms are usually studied with continuum theories (for example, PNP for semiconductor devices)
- Dimensions of the devices, however, continuously shrink (nanodevices)
- The **molecular behavior** of the *core unit* of the device (that can be very different from bulk behavior) determines **device behavior**
- We need to study the *core unit* on the molecular level with **modeling** and **computation**

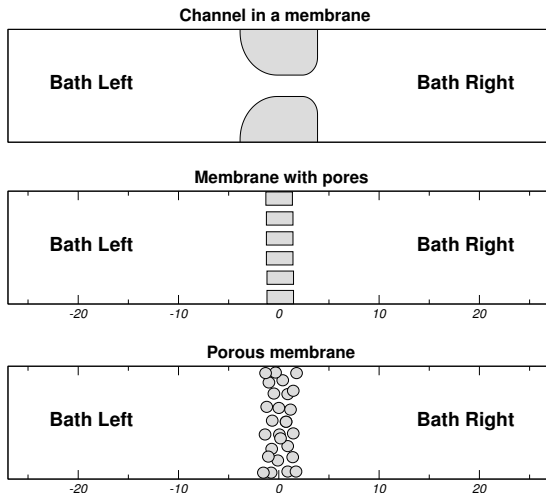


# Core units and the devices „around” them have different length/time scales

- Different length and time scales
- Different techniques to deal with them
- What is the relation of the different levels?



# In our studies, the core units are porous materials



**Examples:** ion channels in biological membranes, synthetic nanopores, silicate membranes (zeolite, silicalite, kaolinite)

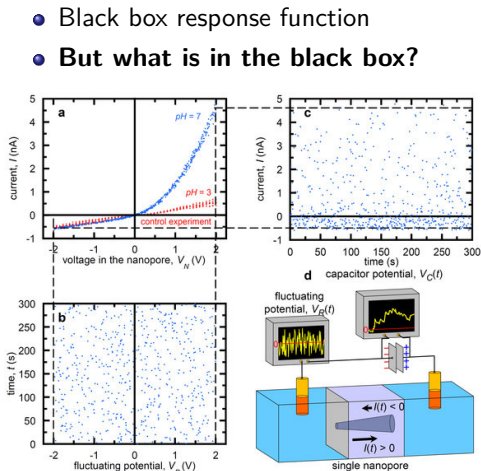
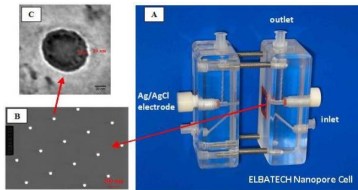
**Phenomena of interest:** selectivity, permeation, rectification

**Models:** from all-atom to coarse-grained (reduced)

**Motivation:** technology, biology

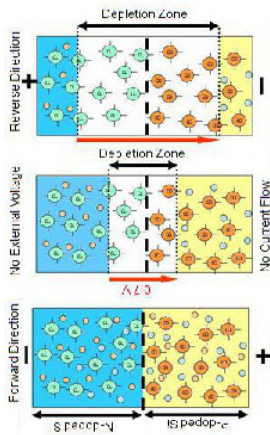
# Nanopore as a device – a rectifying diode

- Pore etched into plastic foil
- Dimensions:  $\mu\text{m}$  length, nm radius
- **Input:** voltage
- **Output:** current
- Engineering point of view: voltage-current relation

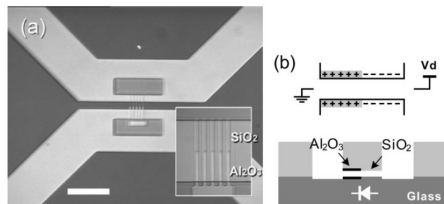


# Nanopore fabrication

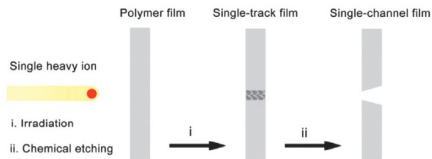
- Motivation: semiconductor p-n junctions



- PDMS or PET nanopores

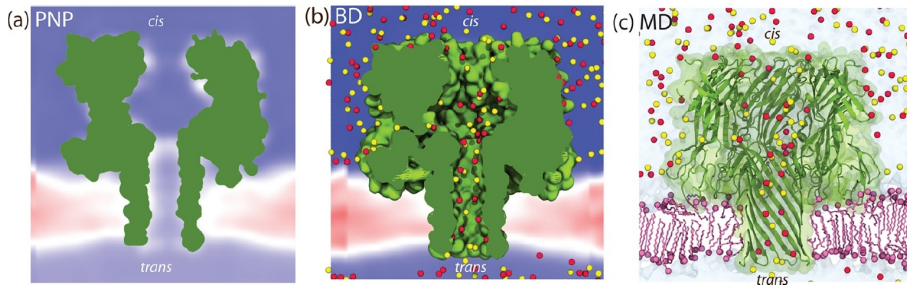


(a) Ion-track-etching technique



# Resolution of the microscopic model – multiscaling

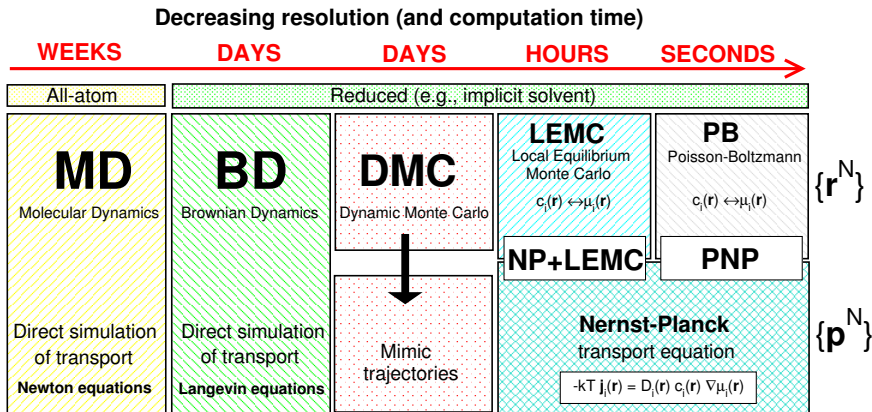
- Detailed model vs. reduced model to handle subsystems with different scales
- Advantages/disadvantages (too many details vs. too much approximation)
- Reduced models for large-scale device properties, all-atom models for molecular details
- The challenge is to link the various modeling levels



- 1 Z. Ható, D. Boda, D. Gillepie, J. Vrabec, G. Rutkai, and T. Kristóf. Simulation study of a rectifying bipolar ion channel: detailed model versus reduced model. *Cond. Matt. Phys.*, **19**(1):13802, 2016.

# Hierarchy of models and methods

- Explicit water (MD)  $\rightarrow$  implicit water (BD, LEMC, PNP)
- Direct simulation of transport (BD)  $\rightarrow$  transport equation (NP)
- Particle simulation (LEMC)  $\rightarrow$  continuum method (PNP)



# Electrodifusion: the Nernst-Planck equation

$$\mathbf{j}^{\alpha}(\mathbf{r}) = -\frac{1}{kT} D^{\alpha}(\mathbf{r}) c^{\alpha}(\mathbf{r}) \nabla \mu^{\alpha}(\mathbf{r})$$

- **Flux:** output of the calculation –  $\mathbf{j}^{\alpha}(\mathbf{r})$
- **Concentration:** availability of the transported particles –  $c^{\alpha}(\mathbf{r})$
- **Diffusion coefficient:** mobility of the transported particles –  $D^{\alpha}(\mathbf{r})$
- **Driving force:** difference/gradient of the electrochemical potential –  $\mu^{\alpha}(\mathbf{r})$
- What is the relation of  $c^{\alpha}(\mathbf{r})$  and  $\mu^{\alpha}(\mathbf{r})$  in the transport (non-equilibrium) region?
- Non-equilibrium statistical mechanics is needed. Not well-established.
- General solution: divide the system into volume elements and assume **local equilibrium** (LE) in them.
- **Use the procedures of equilibrium statistical mechanics in the volume elements.**

2 D. Boda, D. Gillespie. Steady state electrodifusion from the Nernst-Planck equation coupled to Local Equilibrium Monte Carlo simulations. *J. Chem. Theory Comp.*, 8(3):824-829, 2012.

# Statistical mechanical methods that can be used

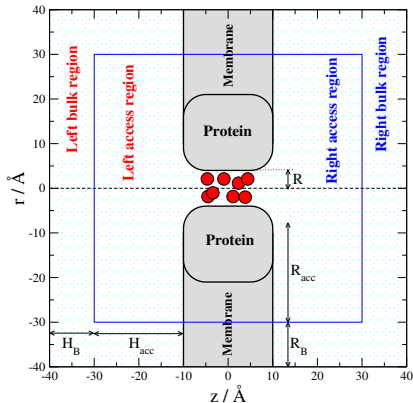
The electrochemical potential:

$$\mu^\alpha(\mathbf{r}) = \mu_0^\alpha + kT \ln c^\alpha(\mathbf{r}) + \mu_{\text{EX}}^\alpha + z^\alpha e\Phi(\mathbf{r})$$

- **Poisson-Boltzmann**: used for the ideal solution ( $\mu_{\text{EX}}^\alpha(\mathbf{r}) = 0$ ) – NP+PB (traditionally called Poisson-Nernst-Planck (PNP) theory)
- **Density Functional Theory** (Tarazona, Gillespie) – NP+DFT (1D)
- **Simulation (our suggestion)**: perform GCMC simulation using different electrochemical potentials in the volume elements (each element is an open system in the GC ensemble) – **Local Equilibrium Monte Carlo (LEMC)**

- 2 D. Boda, D. Gillespie. Steady state electrodiffusion from the Nernst-Planck equation coupled to Local Equilibrium Monte Carlo simulations. *J. Chem. Theory Comp.*, **8**(3):824-829, 2012.
- 3 D. Boda, R. Kovács, D. Gillespie, T. Kristóf. Selective transport through a model calcium channel studied by Local Equilibrium Monte Carlo simulations coupled to the Nernst-Planck equation *J. Mol. Liq.*, **189**:100, 2014.
- 4 D. Boda. Monte Carlo simulation of electrolyte solutions in biology: In and out of equilibrium. *Annual Reports in Computational Chemistry*, **10**, Chapter 5, Pages 127–163, Elsevier, 2014.

# Local Equilibrium Monte Carlo (LEMC)

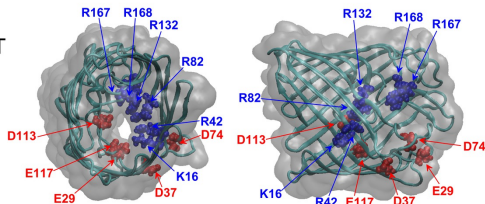


- Solution domain (pore + access regions) is divided into volume elements ( $V_i$ )
- **Input:**  $\mu^\alpha(\mathbf{r}_i)$ , **Output:**  $c^\alpha(\mathbf{r}_i)$
- **Acceptance probability** for inserting ( $\chi = 1$ ) or deleting ( $\chi = -1$ ) an ion in a volume element (below).
- $N_i^\alpha$  is the number of ions in  $V_i$  **before** insertion/deletion
- The energy contains the interactions with **everything** in the whole simulation cell including the applied field ( $\mathbf{r} \in V_i$ ).

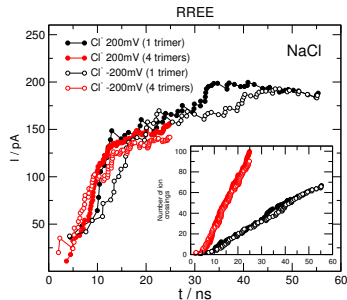
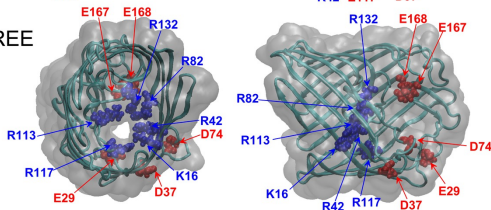
$$p_{i,\chi}^\alpha(\mathbf{r}) = \frac{N_i^\alpha! V_i^\chi}{(N_i^\alpha + \chi)!} \exp\left(-\frac{\Delta U(\mathbf{r}) - \chi \mu_i^\alpha}{kT}\right)$$

# Failure for a mutant rectifying ion channel with MD simulations

WT



RREE

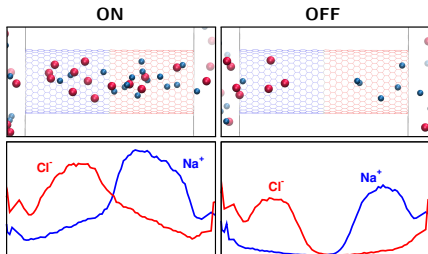


- Experiments (Miedema et al. *Nano Lett.*, **7**, 2886, 2007.) showed rectification for the RREE mutant
- Our large-scale all-atom MD simulations did not

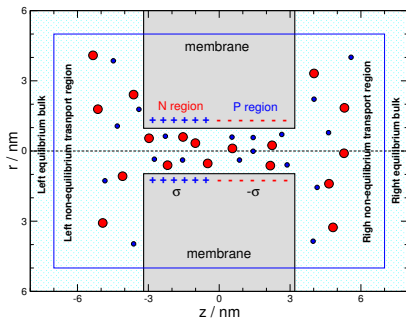
1 Z. Ható, D. Boda, D. Gillepie, J. Vrabec, G. Rutkai, and T. Kristóf. Simulation study of a rectifying bipolar ion channel: detailed model versus reduced model. *Cond. Matt. Phys.*, **19**(1):13802, 2016.

# Bipolar nanopore models

- Nanopore is CNT, membrane is CNS
- MD: GROMACS, CHARMM27
- **Explicit water**: SPC



- Nanopore and membrane walls are hard walls
- Ions: charged hard spheres
- **Implicit water**:  $\epsilon = 78.5$

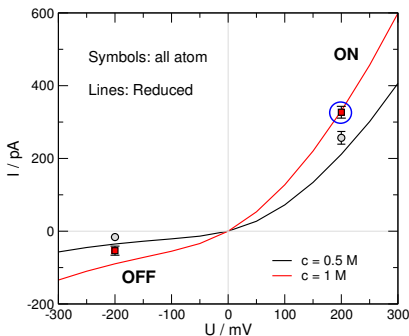


5 Z. Ható, M. Valiskó, T. Kristóf, D. Gillespie, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: explicit-water versus implicit-water simulations. *PCCP* submitted, 2017.

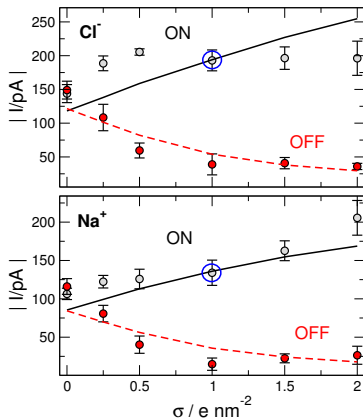
# Explicit vs. implicit water comparison (MD vs. NP+LEMC)

## Results for device function - qualitative agreement

### Current vs. voltage



### Current vs. pore charge

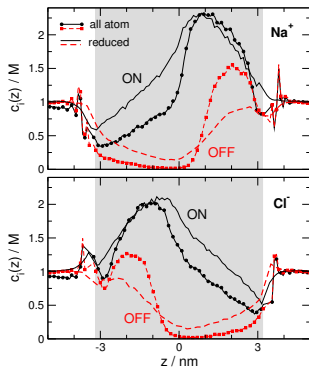


- 5 Z. Ható, M. Valiskó, T. Kristóf, D. Gillespie, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: explicit-water versus implicit-water simulations. *PCCP* submitted, 2017.

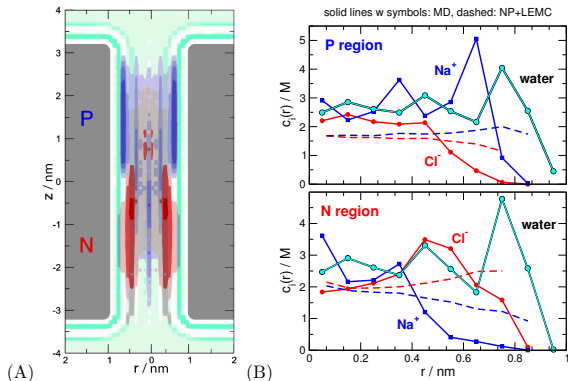
# Explicit vs. implicit water comparison (MD vs. NP+LEMC)

## Concentration profiles - different agreement in $z$ and $r$ dimensions

- Axial profiles – agree
- Relevant for device function



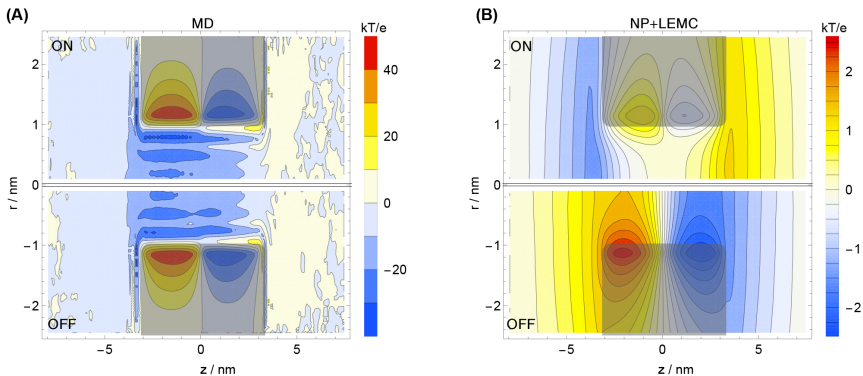
- Radial profiles – disagree
- Irrelevant for device function



5 Z. Ható, M. Valiskó, T. Kristóf, D. Gillespie, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: explicit-water versus implicit-water simulations. *PCCP* submitted, 2017.

# Explicit vs. implicit water comparison (MD vs. NP+LEMC)

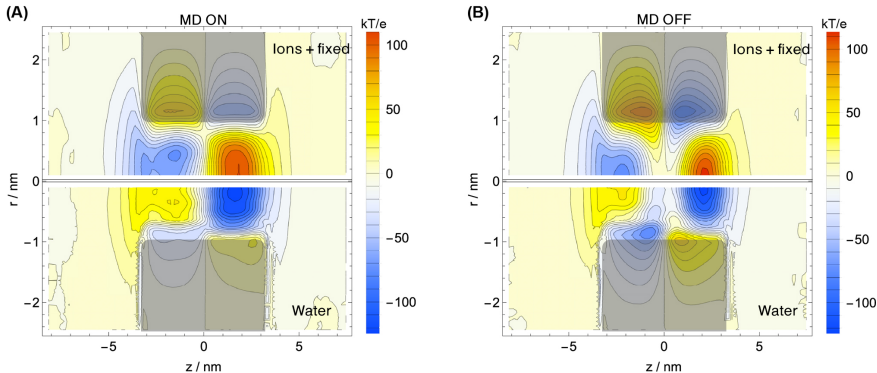
## Potential profiles - not even close



- 5 Z. Ható, M. Valiskó, T. Kristóf, D. Gillespie, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: explicit-water versus implicit-water simulations. *PCCP* submitted, 2017.

# Screening in the explicit solvent model

## Potential profiles of ions and water are opposite

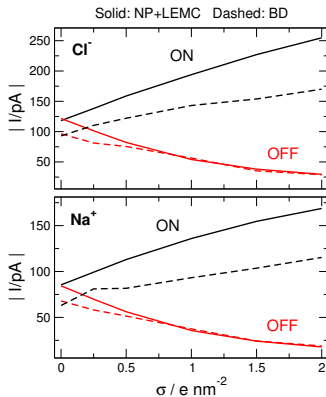


- 5 Z. Ható, M. Valiskó, T. Kristóf, D. Gillespie, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: explicit-water versus implicit-water simulations. *PCCP* submitted, 2017.

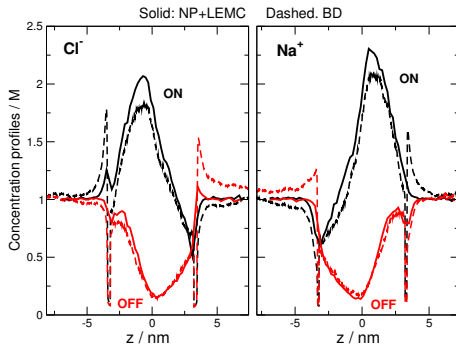
# Direct dynamics vs. transport equation (BD vs. NP+LEMC)

Both are for implicit water

## • Current vs. pore charge



## • Axial concentration profiles

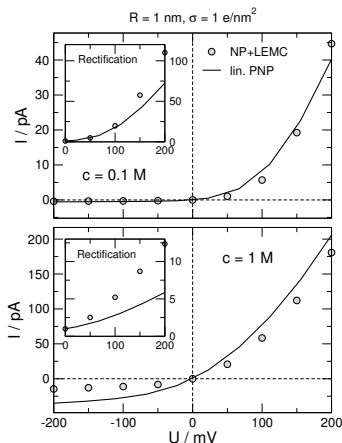


- Using the same diffusion coefficient in the pore in the two cases
- Currents are different:  $D_i$  has different meanings in BD and NP

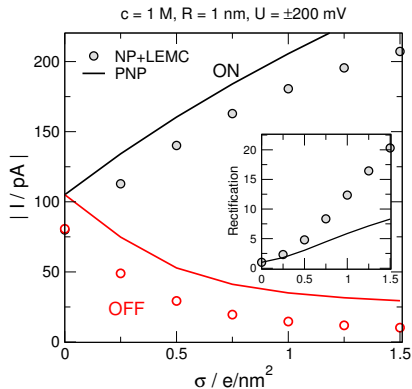
# Molecular simulation vs. continuum theory (LEMC vs. PNP)

## Device properties

### Current vs. voltage



### Current vs. pore charge

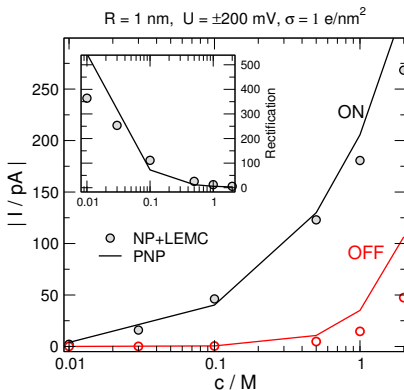


6 B. Matejczyk, M. Valiskó, M.-T. Wolfram, J.-F. Pietschmann, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: Comparing Poisson-Nernst-Planck to Monte Carlo. *J. Chem. Phys.* 146, 124125, 2017.

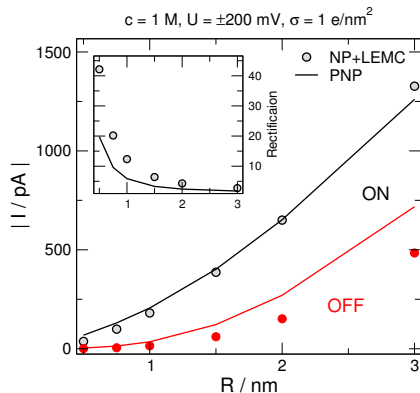
# Molecular simulation vs. continuum theory (LEMC vs. PNP)

## Device properties

### • Current vs. concentration

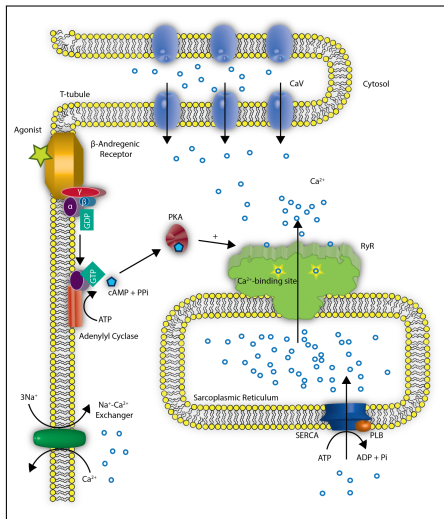


### • Current vs. pore radius

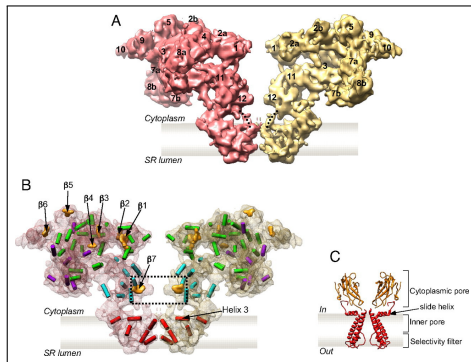


- 6 B. Matejczyk, M. Valiskó, M.-T. Wolfram, J.-F. Pietschmann, D. Boda. Multiscale modeling of a rectifying bipolar nanopore: Comparing Poisson-Nernst-Planck to Monte Carlo. *J. Chem. Phys.* 146, 124125, 2017.

# RyR calcium-release ion channel



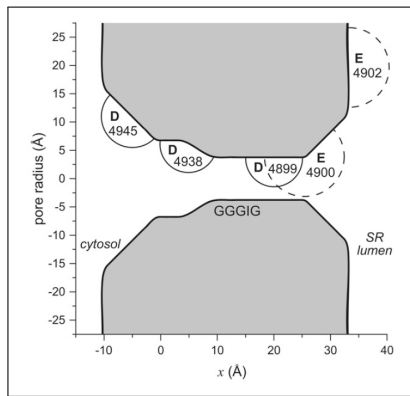
- $\text{Ca}^{2+}$ -release Ryanodine Receptor (RyR) calcium channel
- The released  $\text{Ca}^{2+}$  initiates muscle contraction



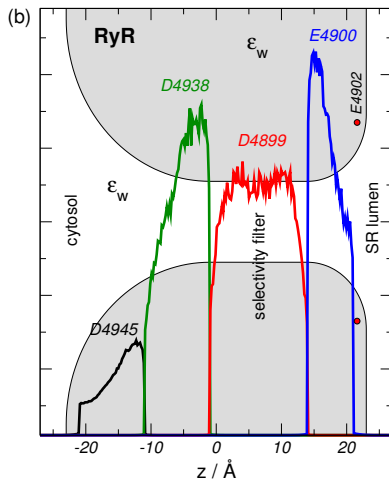
# Models of the RyR $\text{Ca}^{2+}$ -release channel

## 1-D model of Dirk Gillespie for NP+DFT

*JPCB* **109**, 15598, *BJ*, **94**, 1169, 2008; *BJ*, **97**, 2212, 2009.

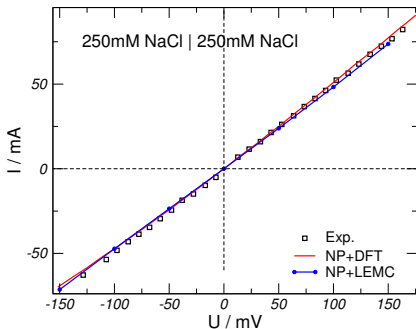


## Our 3-D model for NP+LEMC based on Dirk's model

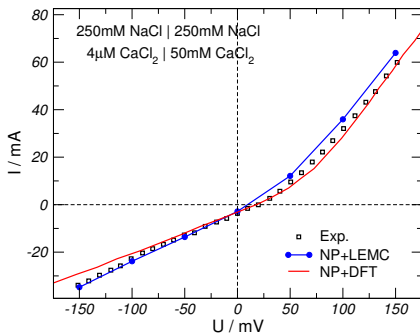


# I-V curves for NaCl and NaCl-CaCl<sub>2</sub>

Symmetric 250 mM NaCl (basis of fit of  $D^\alpha$  in the channel).



NaCl-CaCl<sub>2</sub> mixture - non-symmetric I-V curve.



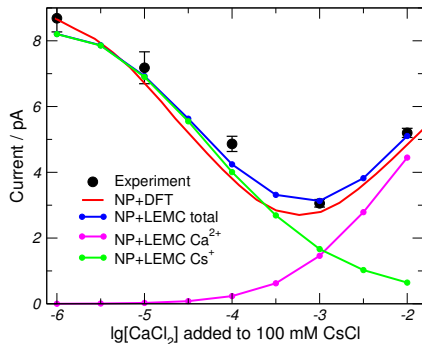
DFT: Gillespie et al. *JPCB* **109**, 15598, *BJ*, **94**, 1169, 2008; *BJ*, **97**, 2212, 2009.



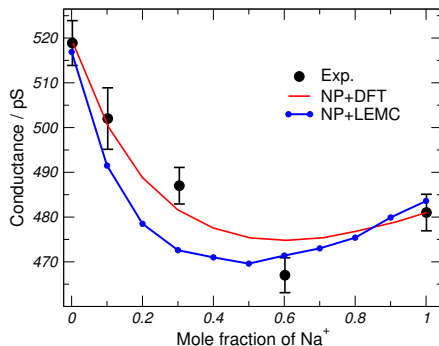
D. Boda. Monte Carlo simulation of electrolyte solutions in biology: In and out of equilibrium. *Annual Reports in Computational Chemistry*, Volume **10**, Chapter 5, Pages 127–163, Elsevier, 2014.

# Anomalous mole fraction effects for the RyR channel

## CaCl<sub>2</sub> is added to 100 mM CsCl



## NaCl-CsCl mole fraction experiment



DFT: Gillespie et al. *JPCB* **109**, 15598, *BJ*, **94**, 1169, 2008; *BJ*, **97**, 2212, 2009.

4 D. Boda. Monte Carlo simulation of electrolyte solutions in biology: In and out of equilibrium. *Annual Reports in Computational Chemistry*, Volume **10**, Chapter 5, Pages 127–163, Elsevier, 2014.

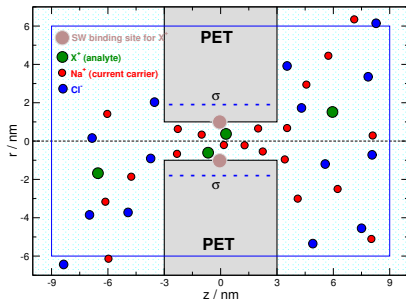
## Reduced models reproduce experimental data for device behavior properly.

- Why is that?
- How can reduced models work while they ignore seemingly important molecular details (water, for example)?
- Our answer is that they work, because they get those properties right that are important for device behavior.
- In the case of nanopores/channels, it is the axial behavior of concentration profiles.
- When we build a reduced model by ignoring certain degrees of freedom, we can ignore the „unimportant” ones and we must include the „important” ones in the model.
- How do you distinguish „important” and „unimportant” details is the art of multiscaling. Sometimes, it is obvious. Sometimes, it is not.

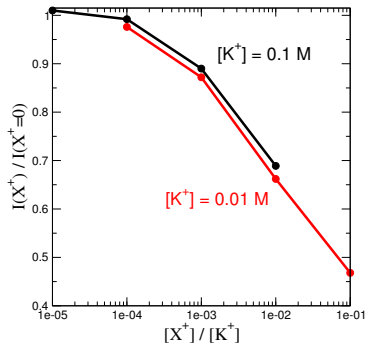


## Nanopore sensor of biomolecules – preliminary NP+LEMC results

- Pore contains selective **square-well** binding sites for the analyte molecule ( $X^+$ ) that is present in the sample in small (possibly trace) concentration
- $X^+$  ions continuously replace  $Na^+$  ions as  $[X^+]$  increases



- **Calibration curves:** Current reduction vs.  $[X^+]$
- Small  $[X^+]$  can be detected
- Noise/sign relation is important



**Possibility for multiscaling:** connect reduced model of binding site to MD or QM simulations

Thanks for your attention!

