

# Theoretical prototype of a Hodgkin-Huxley neuron with 2D nanofluidic memristors

**How to build a neuron with salty water?**

**Paul Robin**, Nikita Kavokine, Lydéric Bocquet  
Micromégas, Ecole Normale Supérieure, Paris



**Ref.: P. Robin, N. Kavokine, L. Bocquet, Science, in revision.**

# Man versus machine: a two-sided game

## AlphaGo vs Lee Sedol (2016)



VS



# Man versus machine: a two-sided game

## AlphaGo vs Lee Sedol (2016)



4

VS

–



1

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VS

–



1

1920 CPUs, 280 GPUs  $\sim$  1 MW

$10^6$  bananas/day

1 brain  $\sim$  20 W

2 bananas/day

**Why?**

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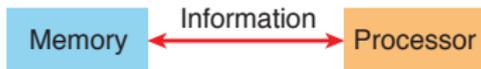
$10^6$  bananas/day

- Von Neumann architecture

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- Highly parallel



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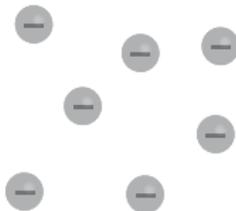


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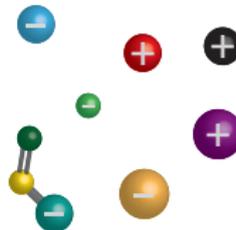
- Von Neumann architecture
- Electrons



1 brain  $\sim$  20 W

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- Highly parallel
- Ions with different “flavors”



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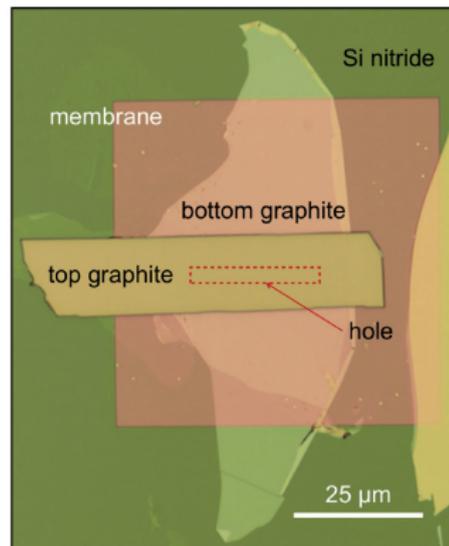
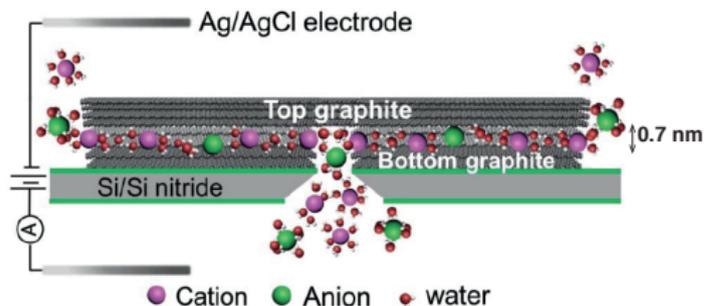
2 bananas/day

- Highly parallel
- Ions with different “flavors”

**Can we build a nanofluidic computer?**  
(or at least building blocks)

# A key nanofluidic device: the angstrometric slit

## Electrolyte confined to molecular level between two sheets



Effects of molecular nature of  
water/ions?

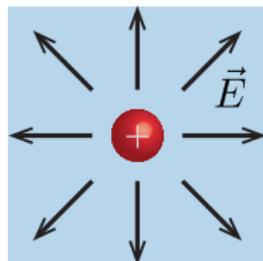
**No clear theoretical framework**

Radha *et al.*, Nature (2016); Esfandiar *et al.*, Science (2017); Mouterde *et al.*, Nature (2019)

# How do ions behave in extreme confinement?

## Confinement of interactions

Bulk water

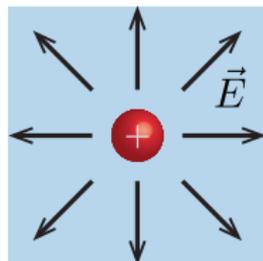


$$V_{3D} = \frac{q}{4\pi\epsilon_0\epsilon_r r}$$

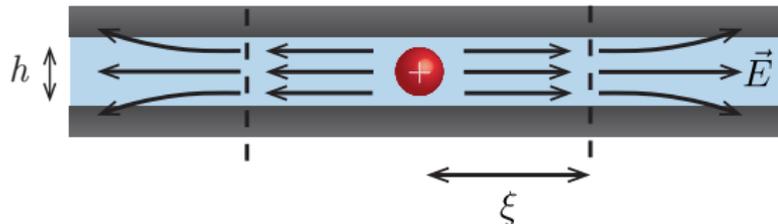
# How do ions behave in extreme confinement?

## Confinement of interactions

Bulk water



'2D<sup>+</sup>' confined water,  $\xi \sim 14$  nm



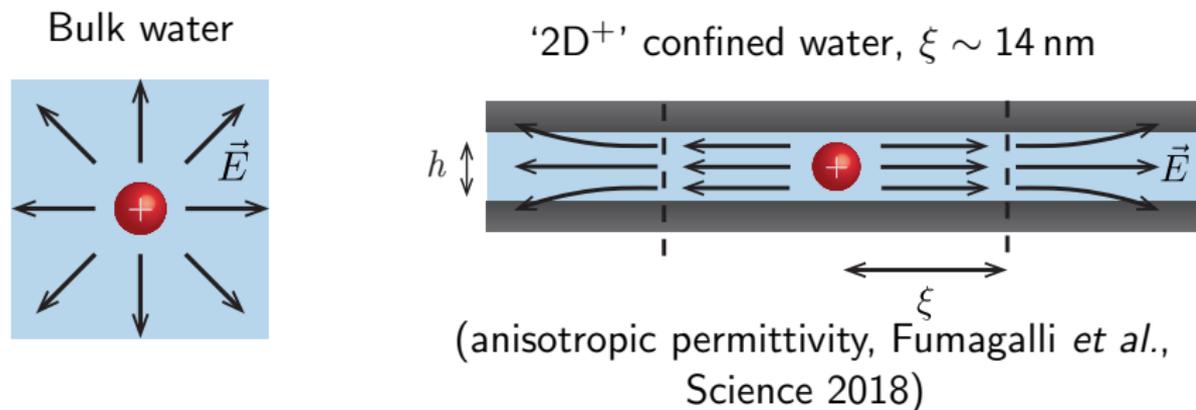
(anisotropic permittivity, Fumagalli *et al.*,  
Science 2018)

$$V_{3D} = \frac{q}{4\pi\epsilon_0\epsilon_r r}$$

$$V_{2D^+} = -\frac{q}{4\pi\epsilon_0\epsilon_r \xi} \log \frac{r}{r + \xi}$$

# How do ions behave in extreme confinement?

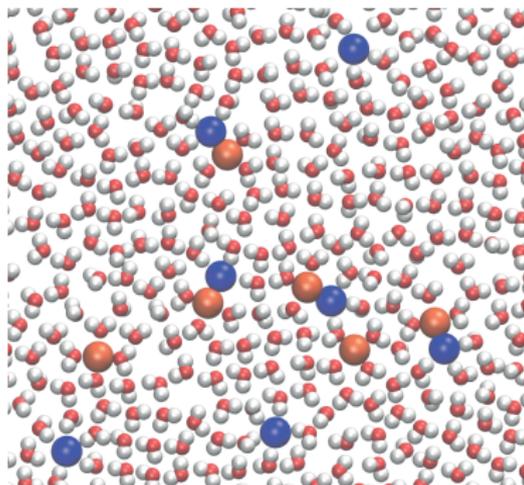
## Confinement of interactions



$$V_{3D} = \frac{q}{4\pi\epsilon_0\epsilon_r r} \ll V_{2D^+} = -\frac{q}{4\pi\epsilon_0\epsilon_r \xi} \log \frac{r}{r + \xi}$$

**Confinement also impacts interactions**

# Reinforced interactions in confinement: Bjerrum pairs



MD simulation of NaCl in 2D  
monolayer water

## Bjerrum pairs

Normally only observed in **weak electrolytes**

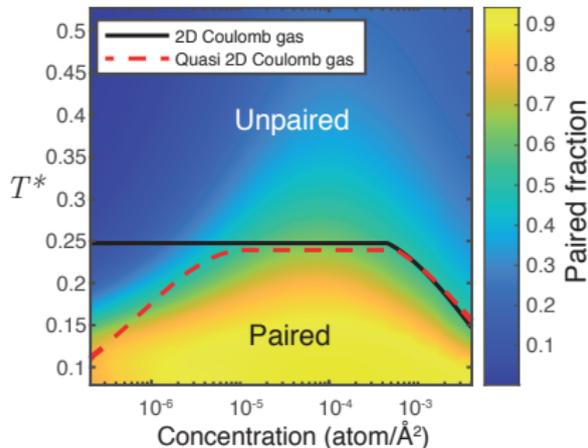
First predicted in 1D confinement  
(Kavokine *et al.*, Nature Nano.,  
2019)

**Confinement makes water a poor solvent**

# Reinforced interactions in confinement: Bjerrum pairs

Strength of interactions parameter:

$$T^* \sim k_B T \frac{4\pi\epsilon\epsilon_r\xi}{q^2}$$



Numerical/Analytical phase diagram  
**Kosterlitz–Thouless transition**

## Bjerrum pairs

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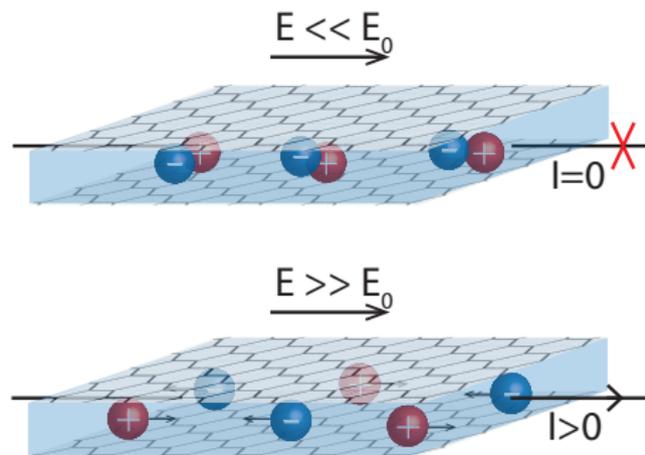
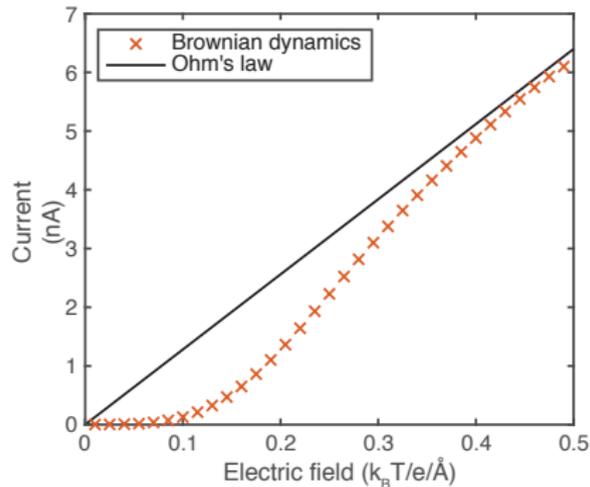
**Confinement makes water a poor solvent**

# Why are pairs interesting?

## Wien effect (Onsager, 1934):

Pairs are neutral, do not conduct, but break under a strong voltage

## Voltage-gated ion channels



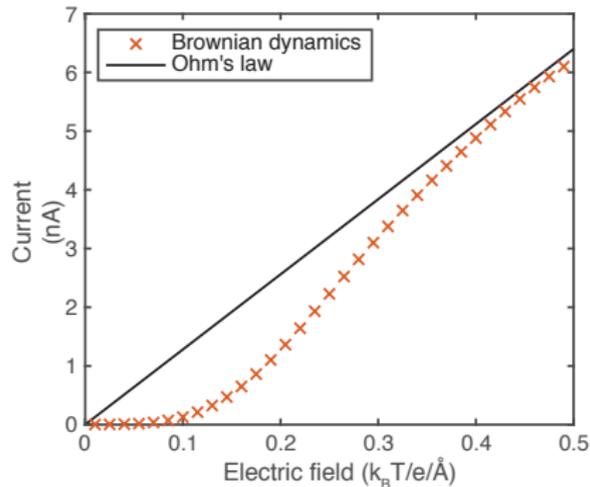
Artificial ion channels

# Why are pairs interesting?

## Wien effect (Onsager, 1934):

Pairs are neutral, do not conduct, but break under a strong voltage

## Voltage-gated ion channels



2D Wien effect:

A fraction  $n_f$  of ions is "free":

$$\dot{n}_f = \frac{1 - n_f}{\tau_d(E)} - \frac{n_f^2}{\tau_a} = 0$$

$$I \propto n_f E$$

$$\tau_d \propto E^{1/T^*}$$

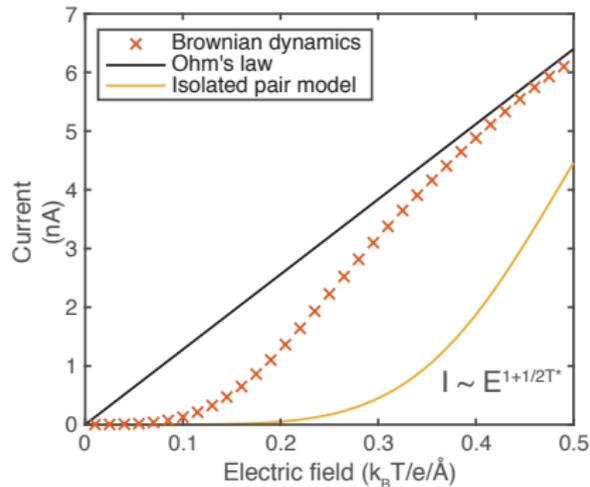
(self-similarity argument)

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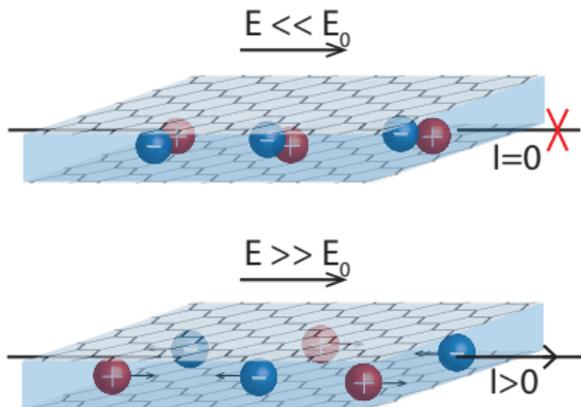
$$\tau_d \propto E^{1/2T^*}$$

(self-similarity argument)

**Onsager's Wien effect fails!**

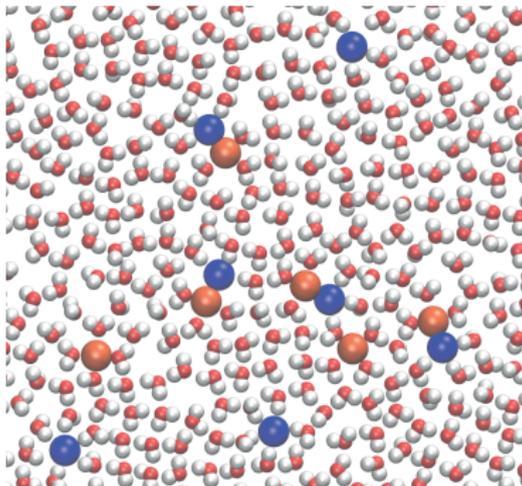
# The problem with Wien effect: Bjerrum polyelectrolytes

Onsager's picture:



$$\dot{n}_f = \frac{1 - n_f}{\tau_d(E)} - \frac{n_f^2}{\tau_a} = 0$$

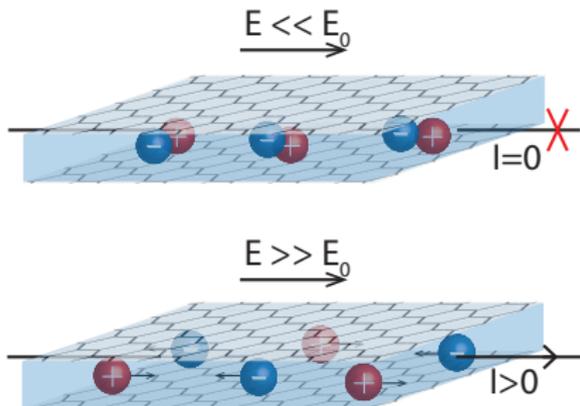
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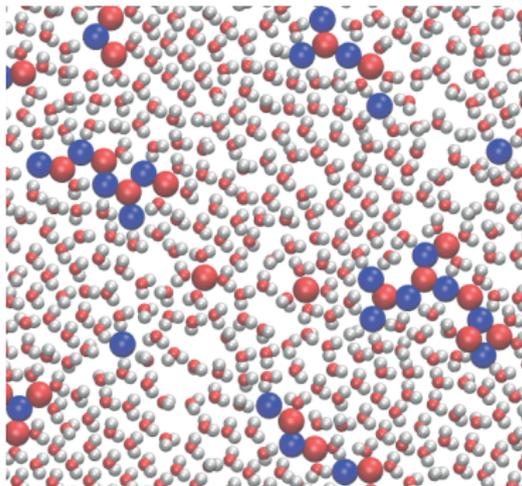
NaCl,  $E = 0$

# The problem with Wien effect: Bjerrum polyelectrolytes

Onsager's picture:



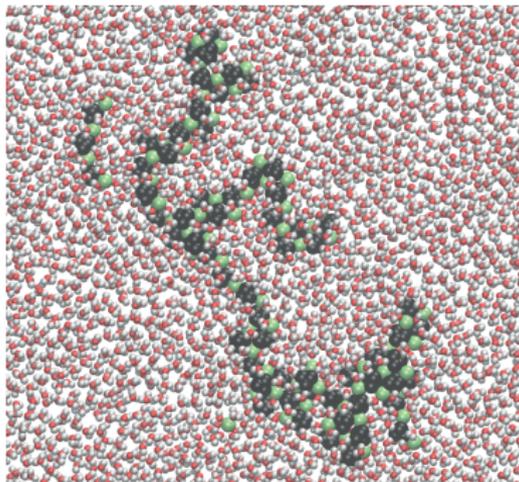
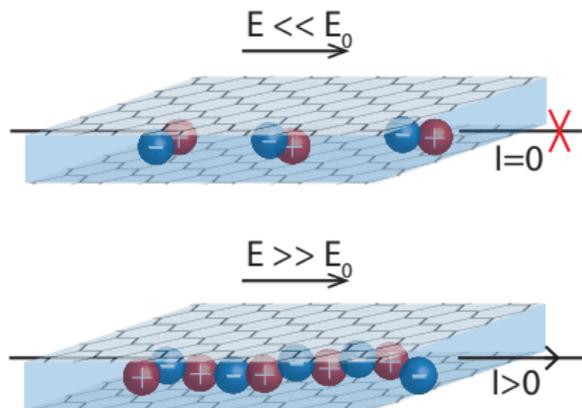
$$\dot{n}_f = \frac{1 - n_f}{\tau_d(E)} - \frac{n_f^2}{\tau_a} = 0$$
$$\tau_d \propto E^{1/T^*}$$



NaCl,  $E > 0$

# The problem with Wien effect: Bjerrum polyelectrolytes

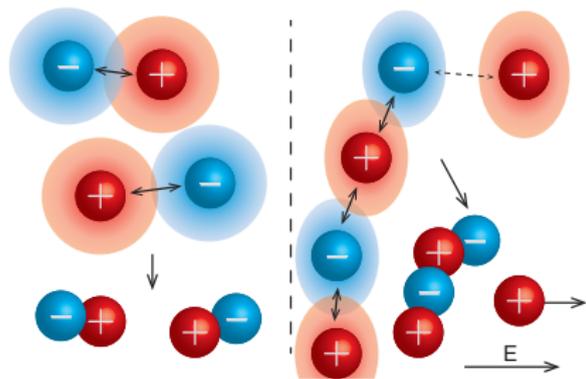
Polyelectrolytic Wien (PEW) effect:



$\text{CaSO}_4, E > 0$

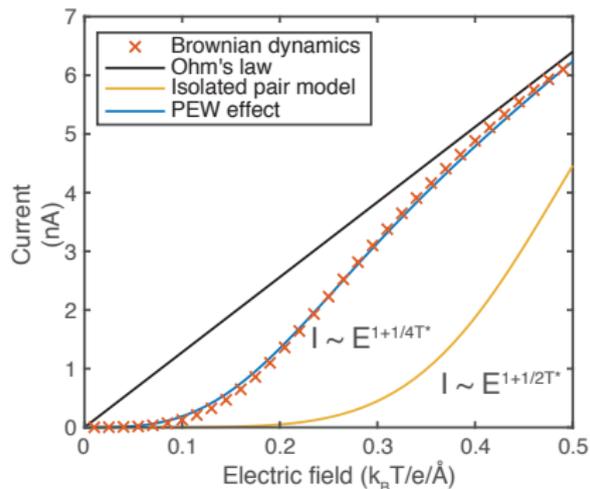
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Polyelectrolytic Wien (PEW) effect:



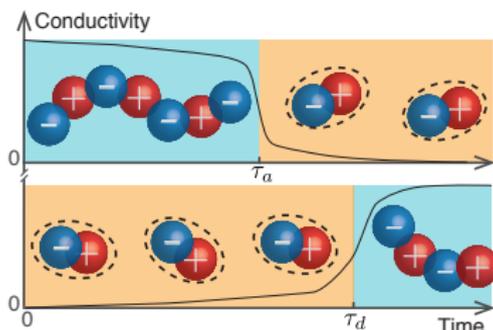
$$\dot{n}_f = \frac{1 - n_f}{\tau_d(E)} - \frac{n_f^2}{\tau_a} = 0$$

$$\tau_d \propto E^{1/2T^*}$$



MD simulations vs theory  
(no fitting parameter)

# Conduction memory: memristor effect



PEW effect:

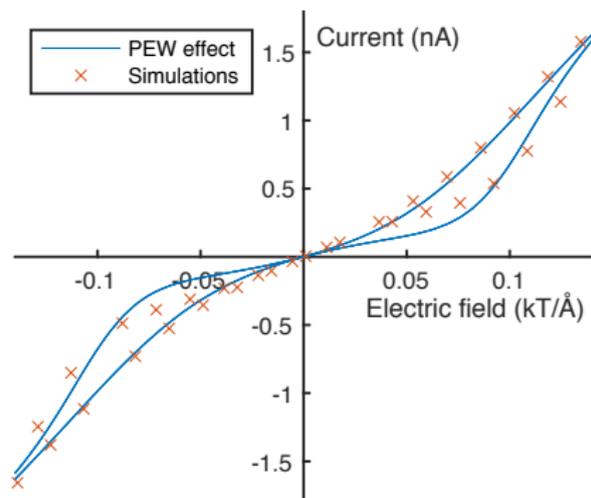
$$I \propto n_f E$$

$$\dot{n}_f = \frac{1 - n_f}{\tau_a(E)} - \frac{1}{\tau_d} n_f^2$$

$n_f$ : % of ions in polyelectrolytes

**Memristor**

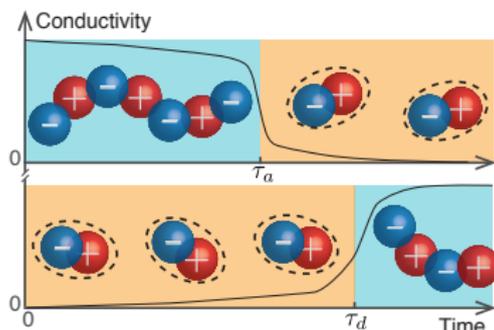
$$E = E_0 \cos 2\pi ft$$



MD simulations vs theory

**Pinched  $\Rightarrow$  memristor**

# Conduction memory: memristor effect



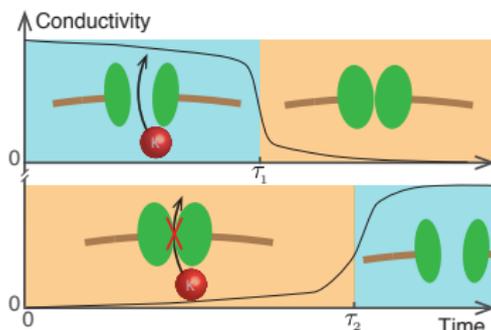
PEW effect:

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$$\dot{n}_f = \frac{1 - n_f}{\tau_a(E)} - \frac{1}{\tau_d} n_f^2$$

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**Memristor**



$K^+$  ion channel:

$$I = gn^4 \Delta V$$

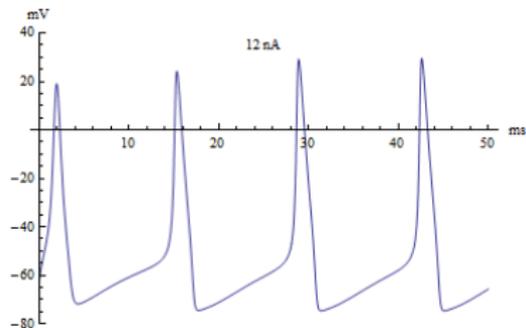
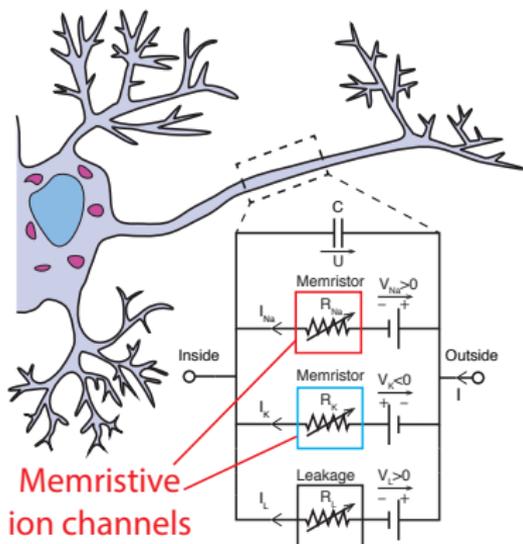
$$\dot{n} = \frac{1 - n}{\tau_1(\Delta V)} - \frac{n}{\tau_2(\Delta V)}$$

$n$ : 'activity' of the channel  
(Hogdkin and Huxley, 1952)

**also a memristor!**

# Can we replicate what Nature does with ion channels?

## Hodgkin-Huxley neuron model

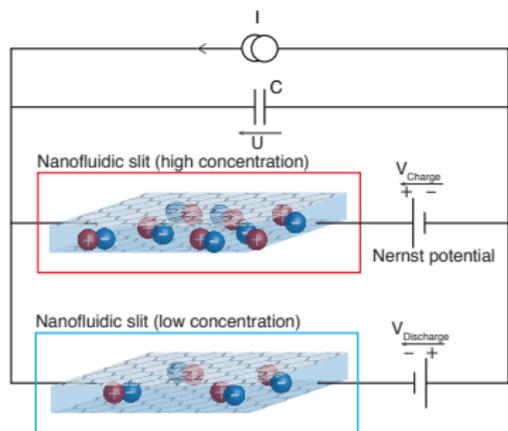


Hodgkin-Huxley model (Nobel 1963)

Action potential train (Wikipedia)

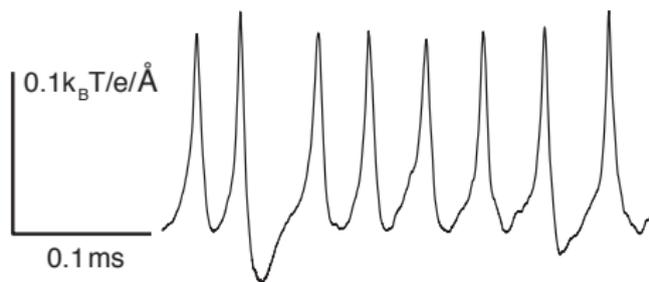
# Can we replicate what Nature does with ion channels?

## Prototype nanofluidic neuron



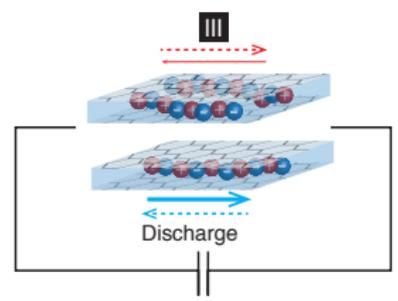
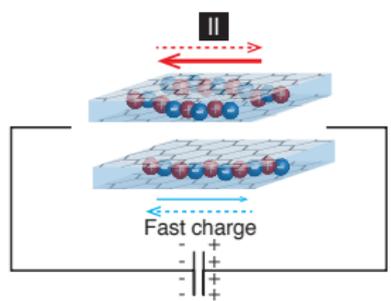
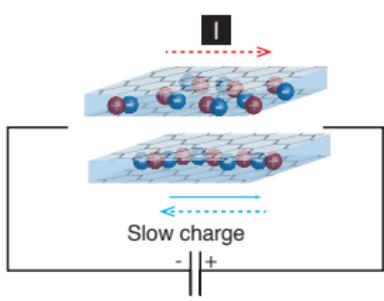
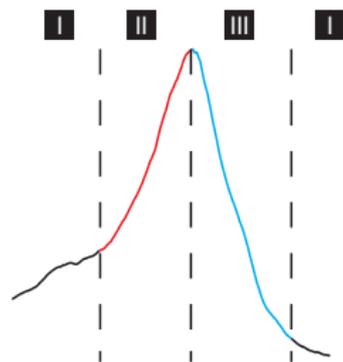
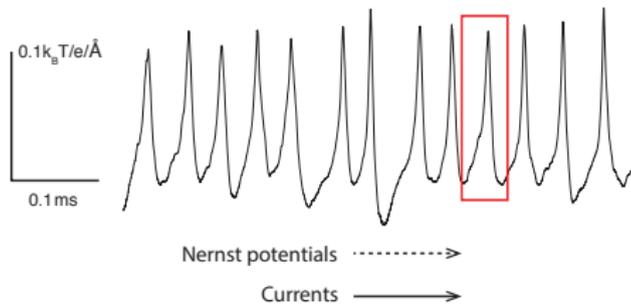
Nanofluidic neuron  
(Two coupled simulation boxes)

Fully simulated with molecular dynamics:



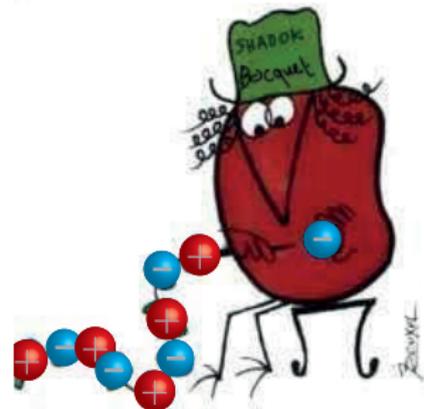
Action potential train

# Spiking mechanism



# Conclusion

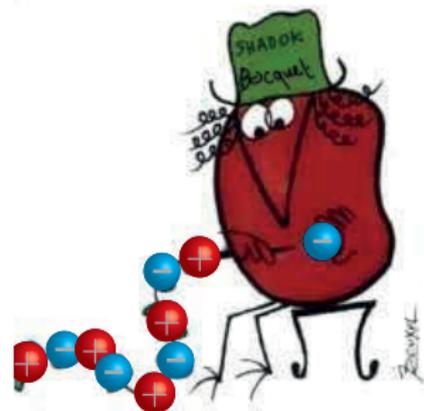
- Ion clusters under confinement



Ref.: P. Robin, N. Kavokine, L. Bocquet, *Science*, in revision.

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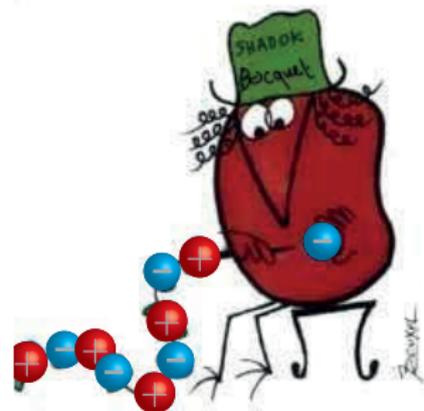
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- Ion clusters under confinement
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- Memristor: building block for ionic computing

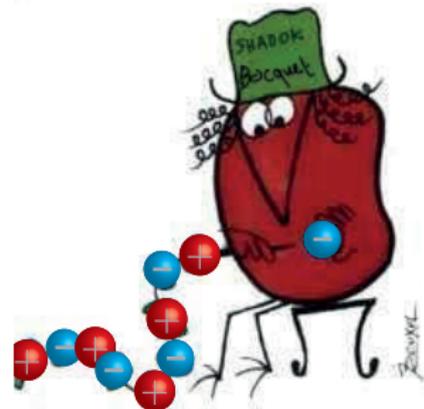


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**Take-home message**



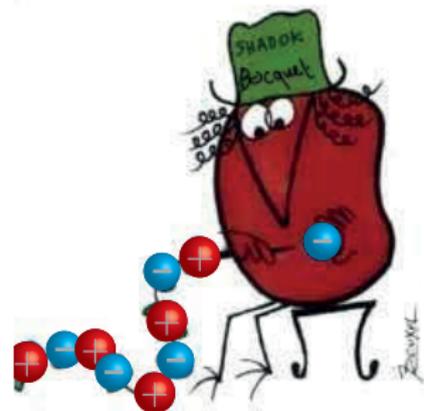
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## Take-home message

- Confinement also impacts interactions



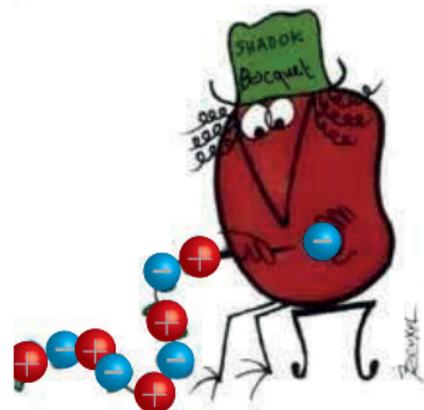
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- Confinement also impacts interactions
- Large structures  $\Leftrightarrow$  Long correlation times  $\Leftrightarrow$  Memory



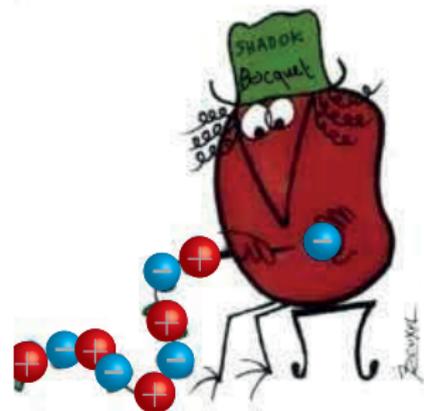
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## Take-home message

- Confinement also impacts interactions
- Large structures  $\Leftrightarrow$  Long correlation times  $\Leftrightarrow$  Memory
- **Experimentally accessible!**

...Dynamical nanofluidics is worth the journey!



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