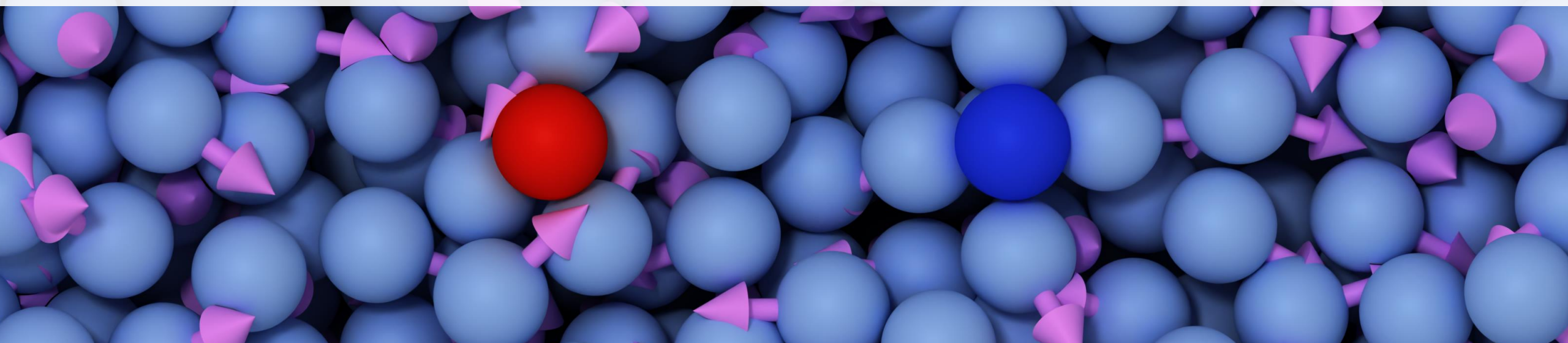


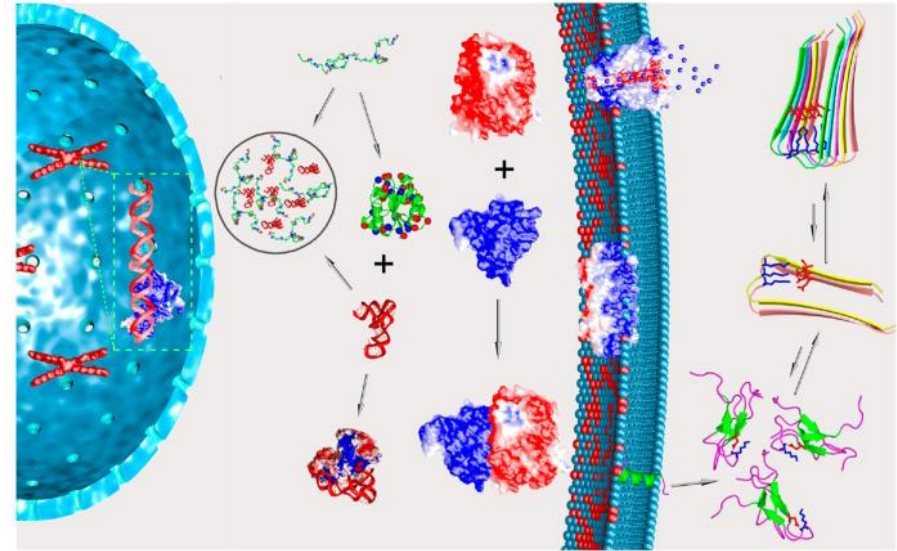
# Unraveling Electrostatic Interactions in Dipolar Solvents

Christopher Balzer

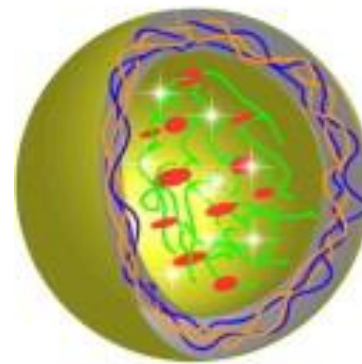
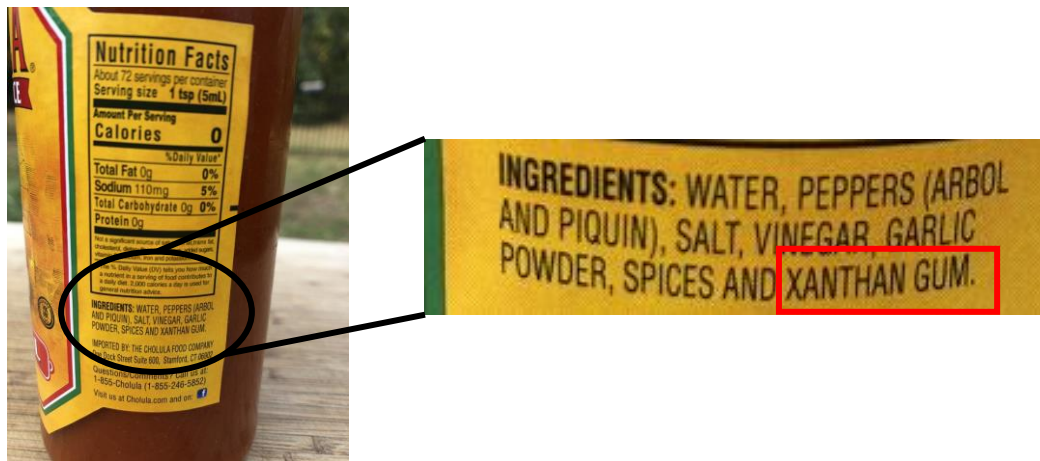
Varner, Balzer, Wang. *J. Phys. Chem. B*, 127, 19, 4328–4337, 2023



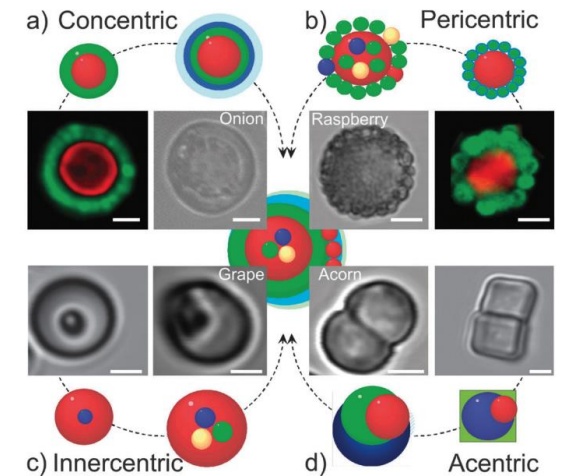
# Electrostatic interactions help define our world



Zhou, Pang. *Chem Rev.*, 118(4):1691-1741. 2018

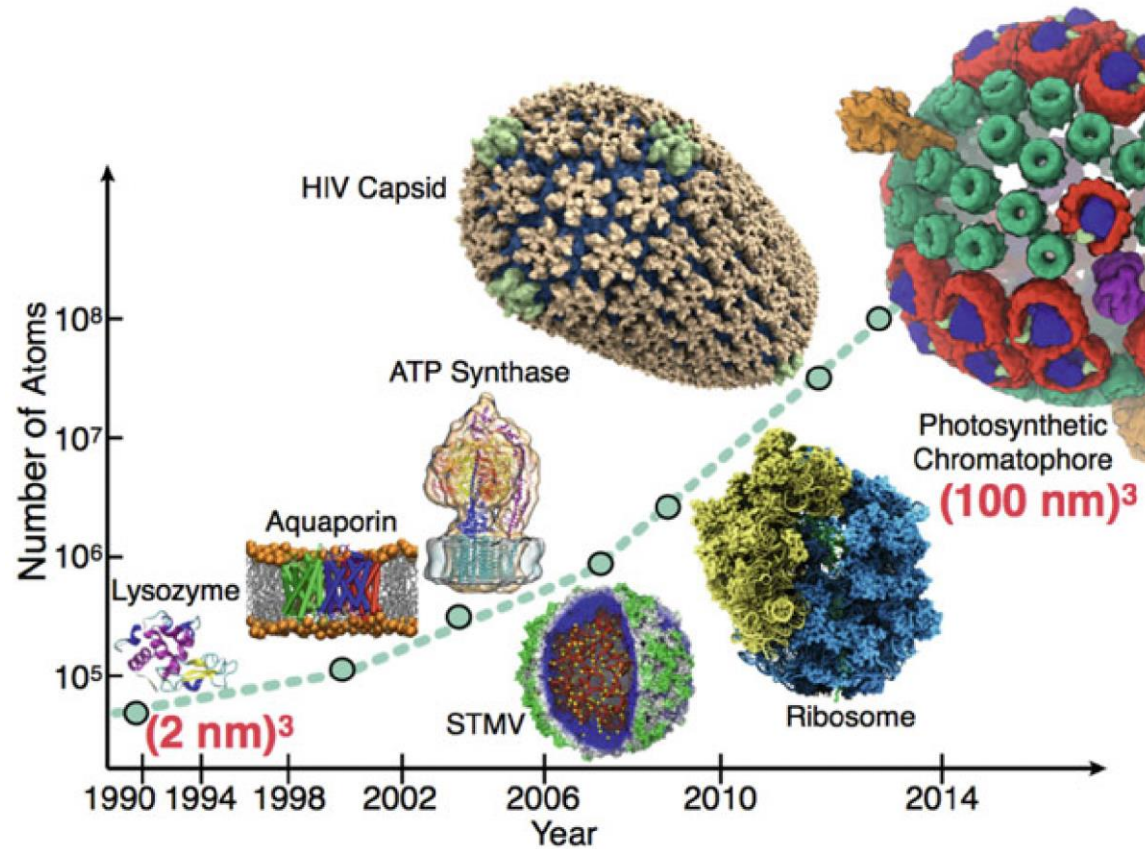


## Encapsulation

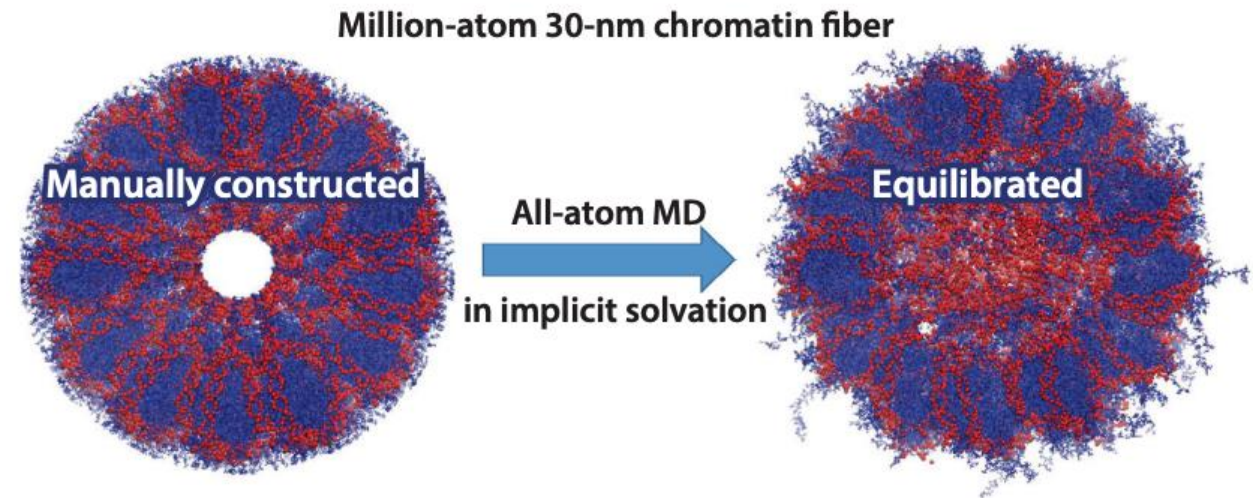


Yi and Sukhorukov. *Adv. in Coll. and Interface Sci.*, 207, 280-289. 2014

# Molecular dynamics in biophysical systems



Wilson, E. *et al.*. Structure and Function of Membrane Proteins. Methods in Molecular Biology, 2021

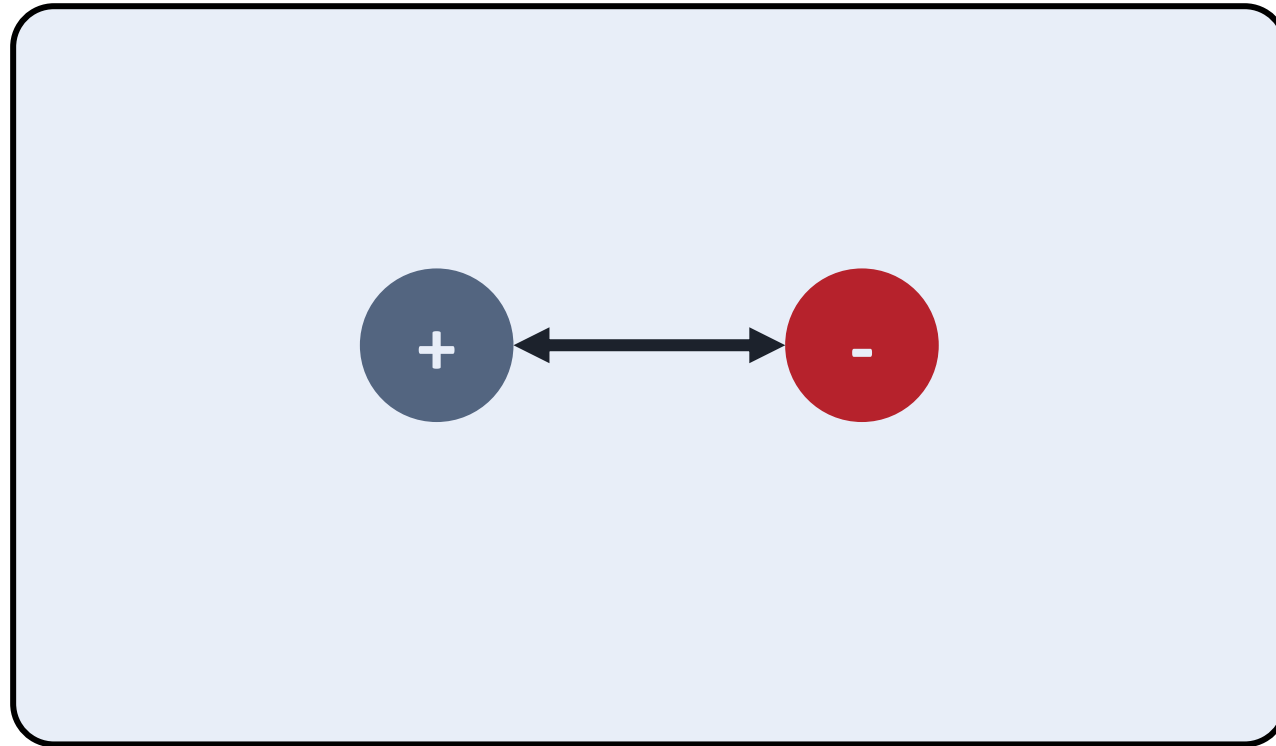


Onufriev and Case. *Annu. Rev. Biophys.* 48:275–96, 2019

# Today's focus

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The interaction between two oppositely charged ions



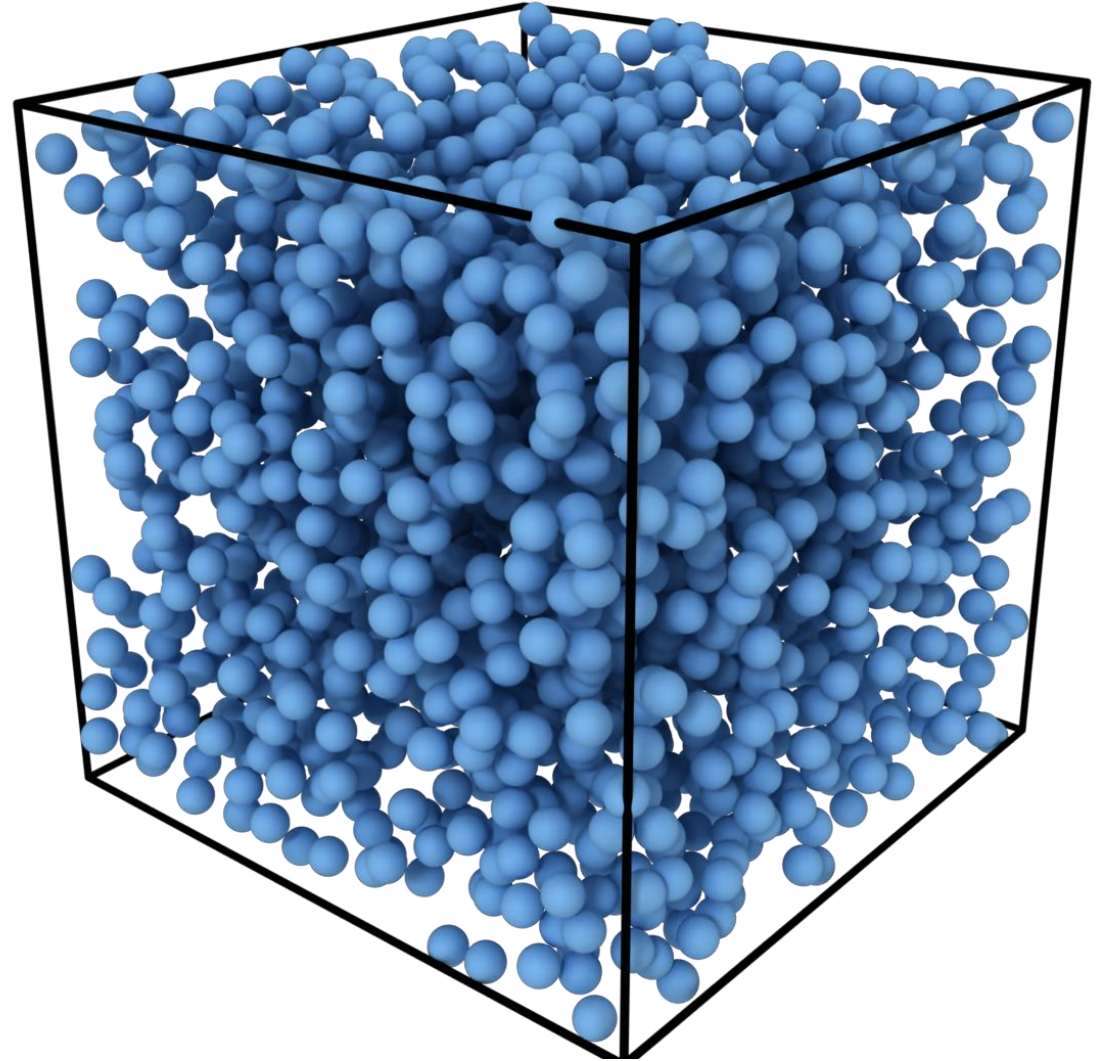
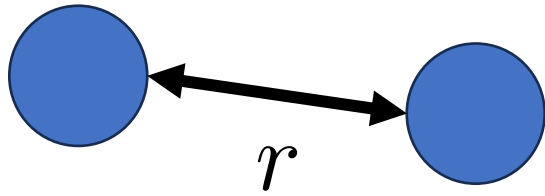
# Molecular dynamics simulations

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- Specify a pairwise potential between particles and evolve the system in time

*Ex. Lennard-Jones fluid*

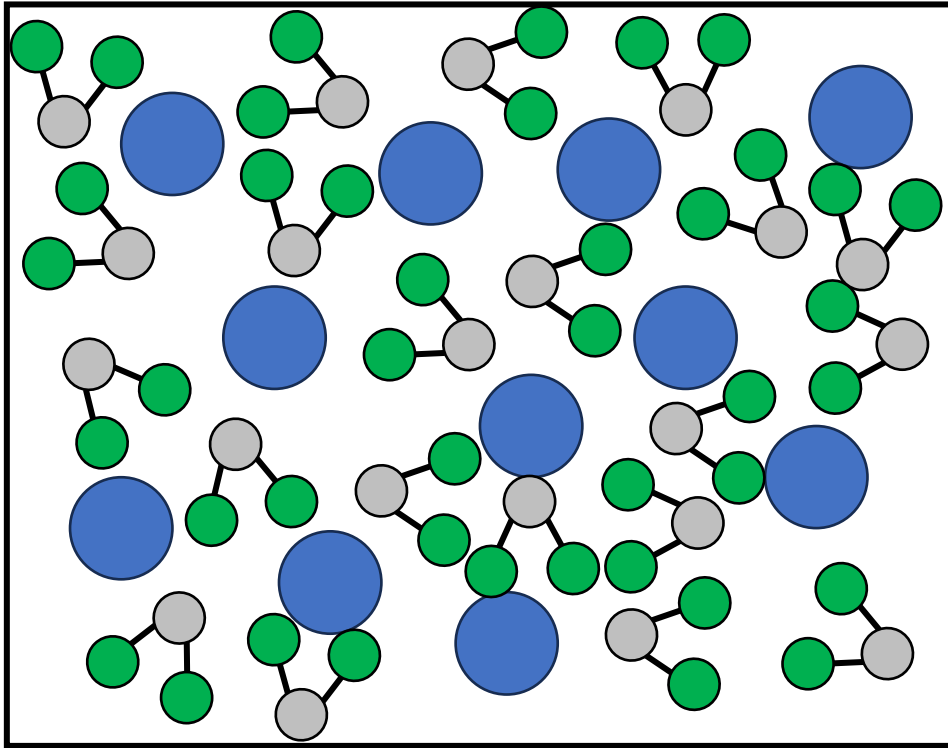
$$U(r) = \left(\frac{\sigma}{r}\right)^{12} - \left(\frac{\sigma}{r}\right)^6$$



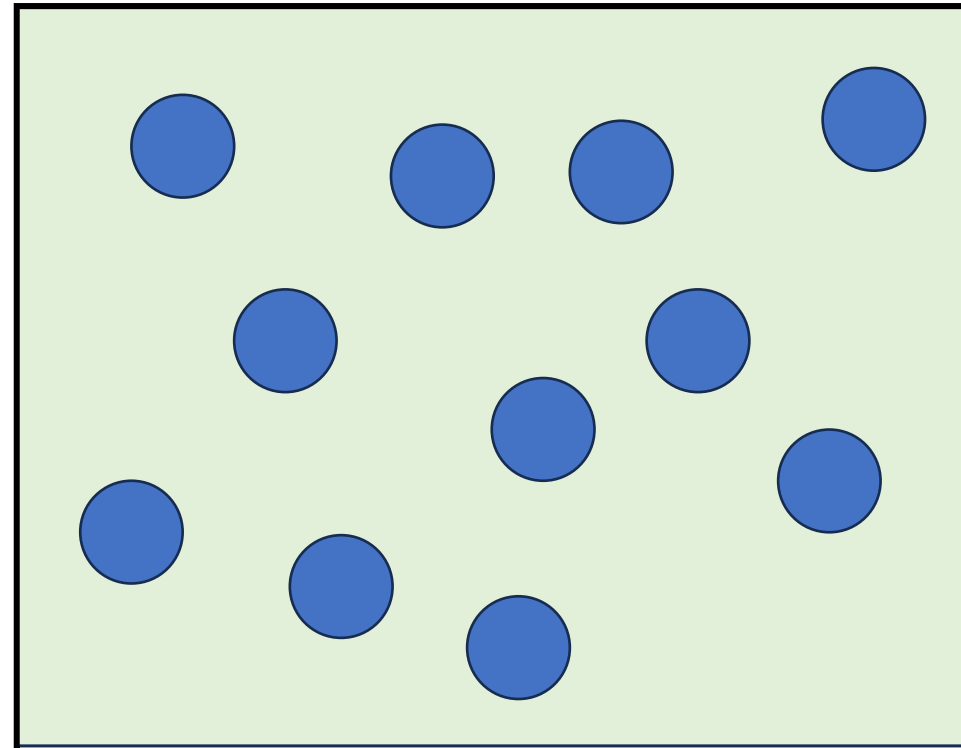
# Implicit versus explicit solvent

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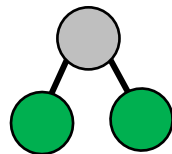
Explicit Solvent



Implicit Solvent



Solvent

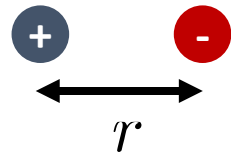


Solute



# Where do the degrees of freedom go?

- Solvent degrees of freedom are embedded into the dielectric constant

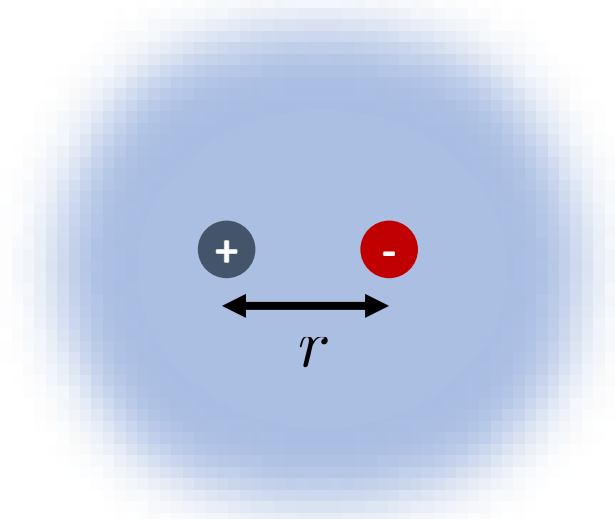


Vacuum

$$U(r) = \frac{-1}{4\pi\epsilon_0 r}$$

Debye (1912)

$$\frac{\epsilon - 1}{\epsilon - 2} = \frac{\beta\rho\mu^2}{9}$$



Dielectric Background

$$U(r) = \frac{-1}{4\pi\epsilon(\Theta)r}$$

Kirkwood-Fröhlich (1939)

$$\frac{(\epsilon - 1)(2\epsilon + 1)}{2\epsilon} = \frac{\beta\rho\mu^2}{3} (1 + z\langle\cos\theta\rangle)$$

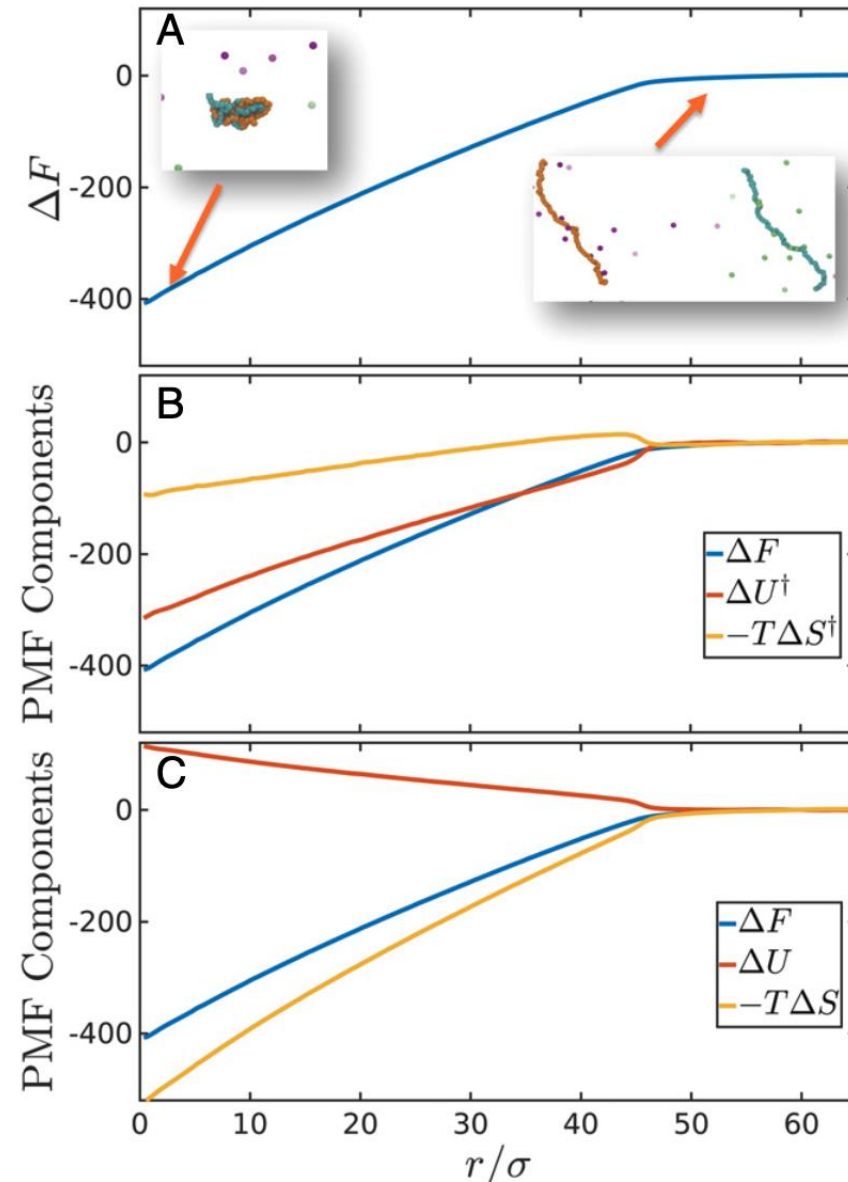
# Consequence of implicit solvent potentials

- In implicit solvent models, the energy of a given microstate has a temperature dependence

$$F = -k_B T \ln(Z) = -k_B T \ln \left( \sum_{\Gamma} e^{-E[\Gamma]/k_B T} \right),$$

- Entropy is hidden in the energy's temperature dependence

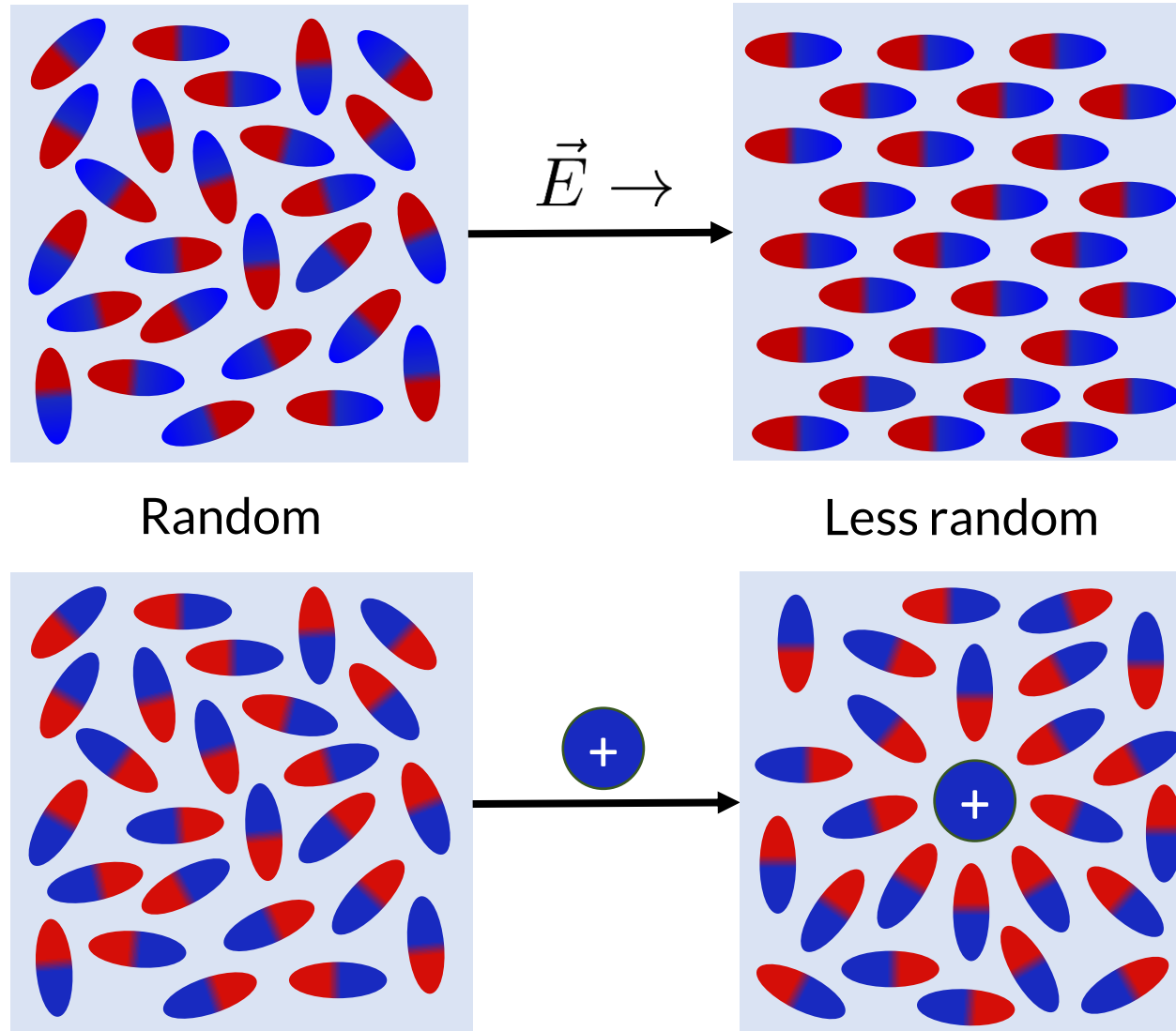
$$-TS = F - \langle E \rangle + T \left\langle \frac{\partial E}{\partial T} \right\rangle.$$





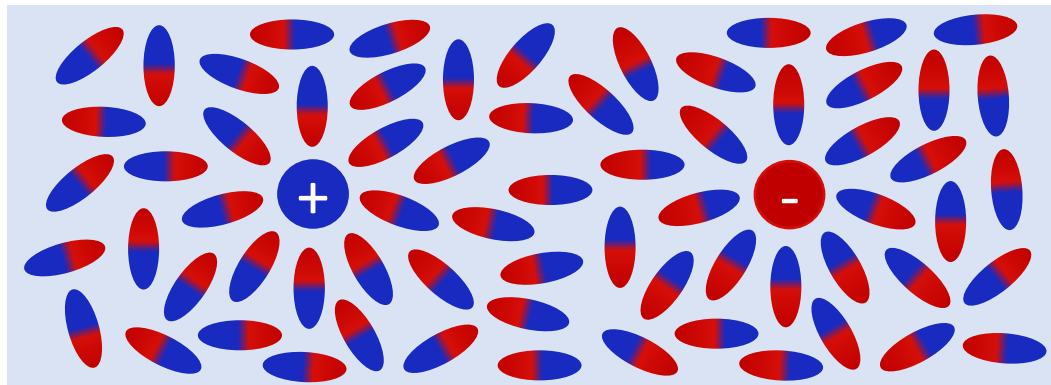
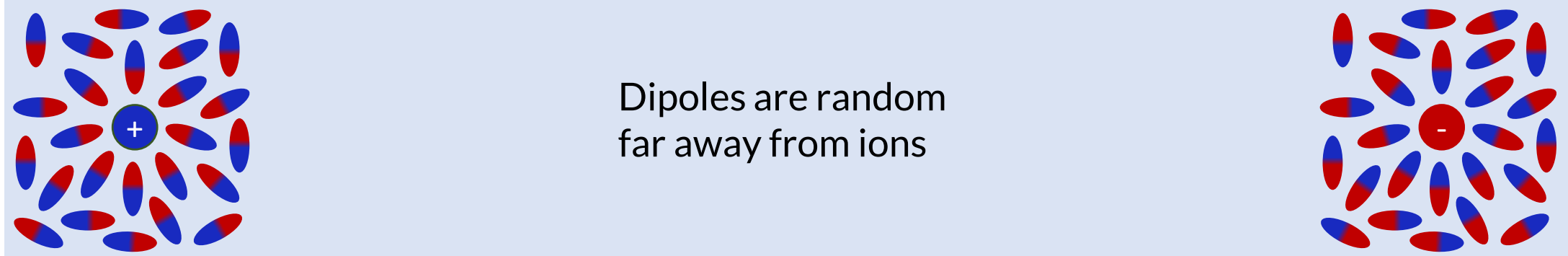
# Dipole orientation in the presence of fields

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Charges generate an electric field → can be ions, charged macromolecules, etc.

# A simple potential of mean force



$$\Delta F = \frac{q_i q_j}{4\pi\epsilon(\Theta)r} \quad (\text{PMF})$$

$$\Delta S = \frac{q_i q_j}{4\pi\epsilon(\Theta)r} \frac{\partial\epsilon(\Theta)}{\partial T}$$

$$\Delta U = \Delta F + T\Delta S = \frac{q_i q_j}{4\pi\epsilon(\Theta)r} \left( 1 + T \frac{\partial\epsilon(\Theta)}{\partial T} \right)$$

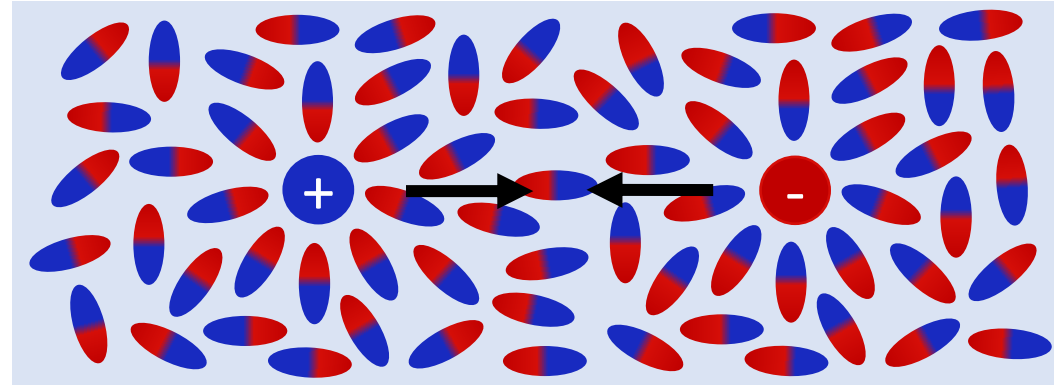
# Motivating questions

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1. How important is the electrostatic entropy in solvent mediated ionic interactions?
2. Under what conditions will entropy dominate the potential of mean force?
3. What is the underlying molecular picture?
4. Is this phenomenon general or solvent/ion specific?

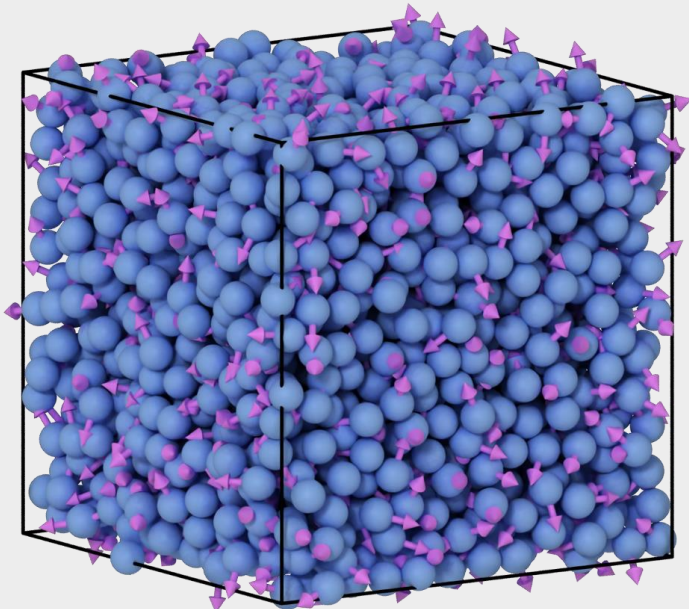
# System and Methods

- Two oppositely charged ions immersed in a dipolar solvent

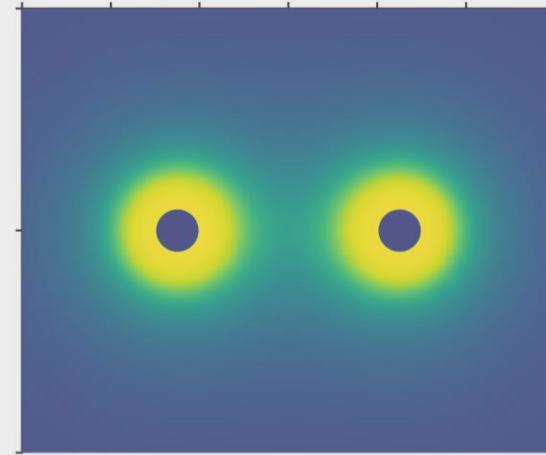


$$PMF \rightarrow \Delta F = \Delta U - T\Delta S$$

## Coarse-grained molecular dynamics



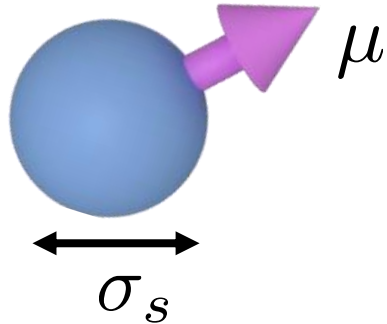
## Dipolar Self-Consistent Field Theory



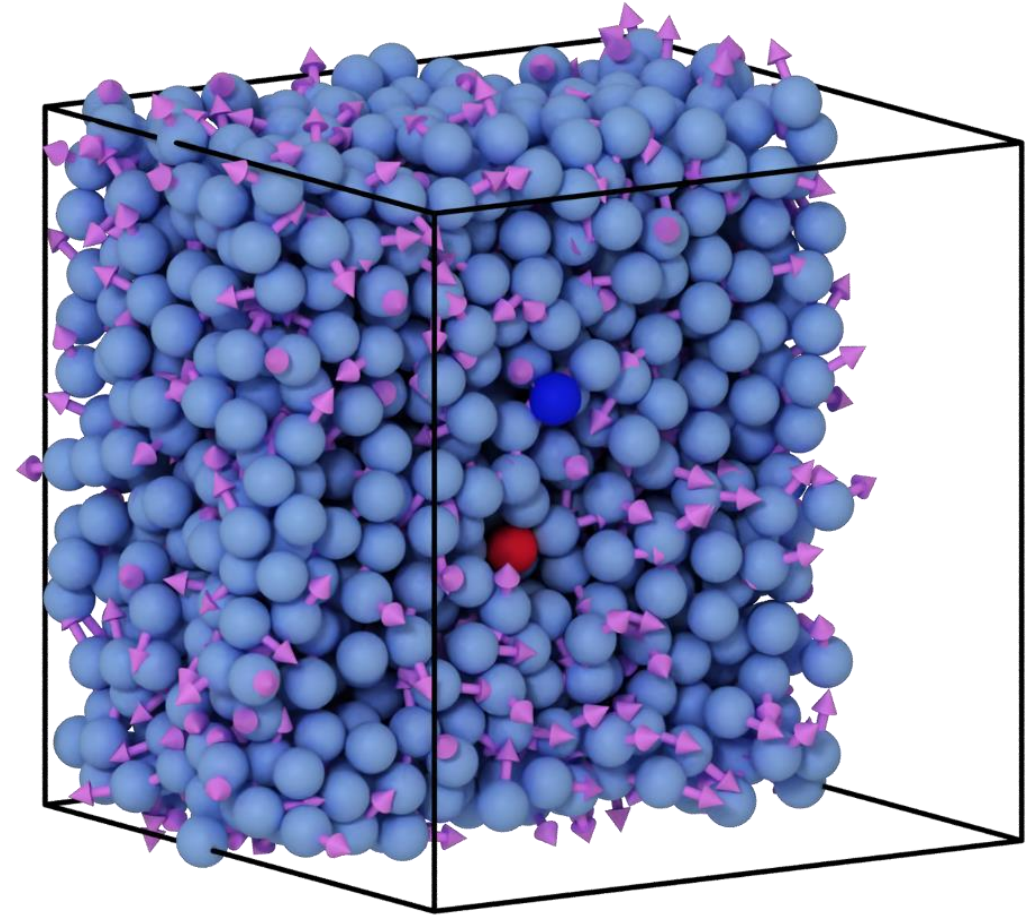
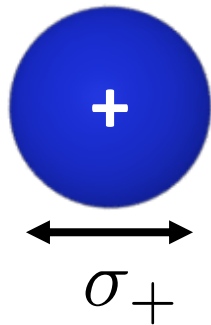
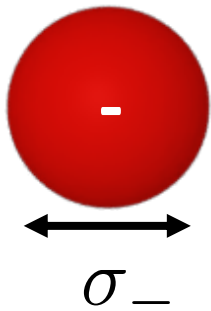
$$\Xi = \int \mathcal{D}w \int \mathcal{D}w_{\text{or}} \int \mathcal{D}w_{\text{el}} \int \mathcal{D}\rho_{\text{or}} \int \mathcal{D}\rho_{\text{el}} e^{-\beta H}$$

# Ions in Stockmayer fluid

- Solvent beads are neutral with a point dipole



- Point charge at center of mass

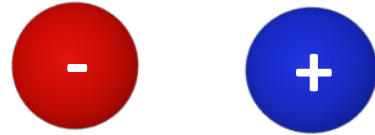


# Stockmayer fluid - Pair potentials

WCA Potential

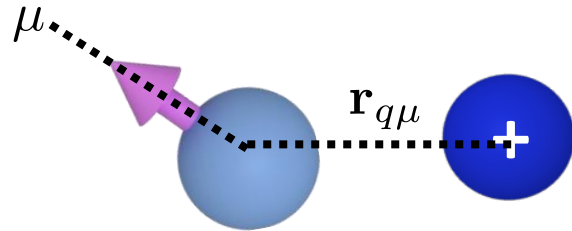
$$U_{ij}^{LJ}(r) = \begin{cases} 4\epsilon_{ij} \left[ \left(\frac{\sigma_{ij}}{r}\right)^{12} - \left(\frac{\sigma_{ij}}{r}\right)^6 + \frac{1}{4} \right] & r \leq 2^{1/6}\sigma_{ij} \\ 0 & r > 2^{1/6}\sigma_{ij} \end{cases}$$

Charge-Charge



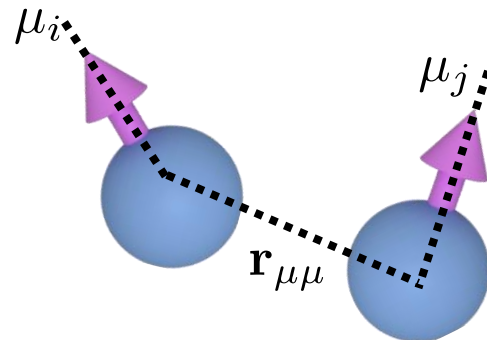
$$U_{ij}^{qq}(r) = \frac{1}{4\pi\epsilon_0} \frac{q_i q_j}{r}$$

Charge-Dipole



$$U^{q\mu}(\mathbf{r}) = \frac{1}{4\pi\epsilon_0} \frac{q(\mathbf{r}_{q\mu} \cdot \boldsymbol{\mu})}{|\mathbf{r}_{q\mu}|^3}$$

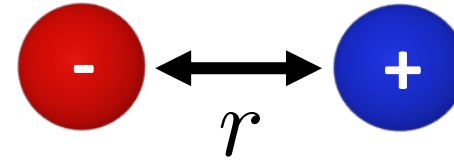
Dipole-Dipole



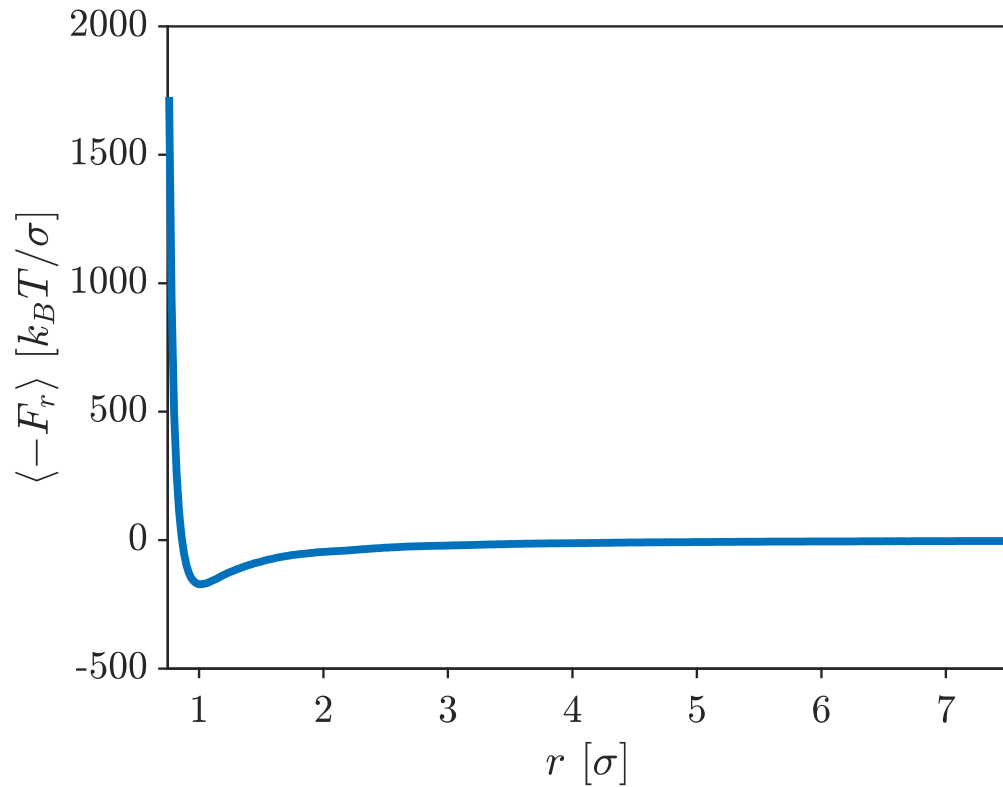
$$U_{ij}^{\mu\mu}(\mathbf{r}) = \frac{1}{4\pi\epsilon_0} \frac{\boldsymbol{\mu}_i \cdot \boldsymbol{\mu}_j}{|\mathbf{r}_{\mu\mu}|^3} - \frac{3}{4\pi\epsilon_0} \frac{(\boldsymbol{\mu}_i \cdot \mathbf{r}_{\mu\mu})(\boldsymbol{\mu}_j \cdot \mathbf{r}_{\mu\mu})}{|\mathbf{r}_{\mu\mu}|^5}$$

# Potential of Mean Force (PMF) from MD

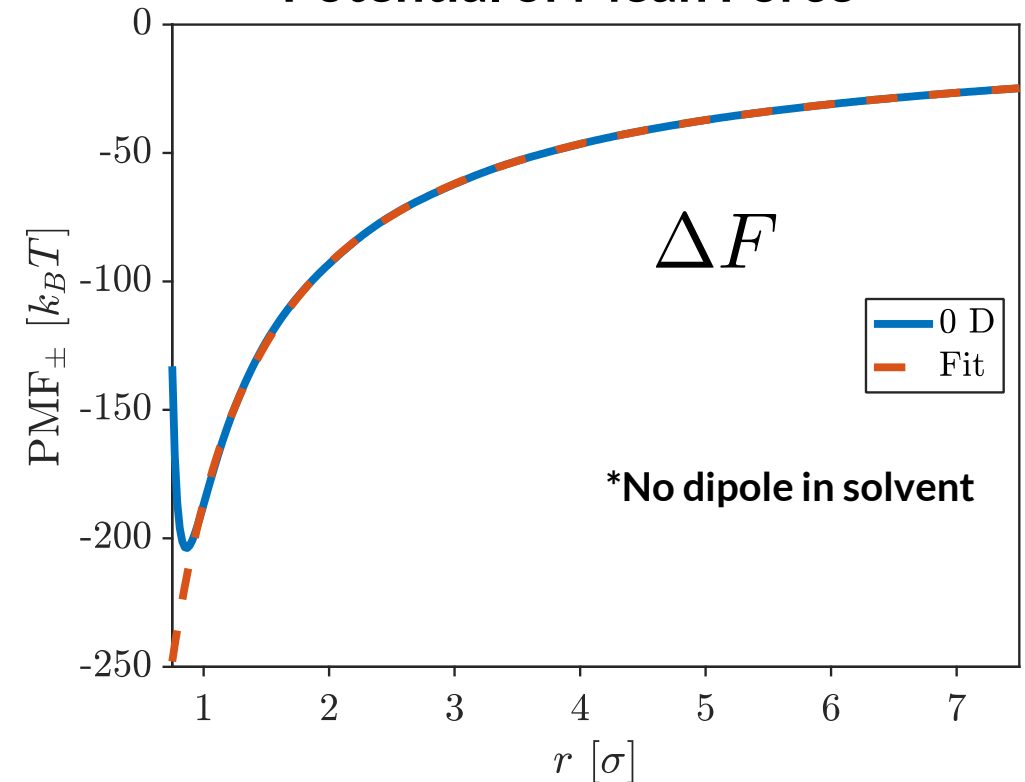
- Apply a force to sample the collective variable



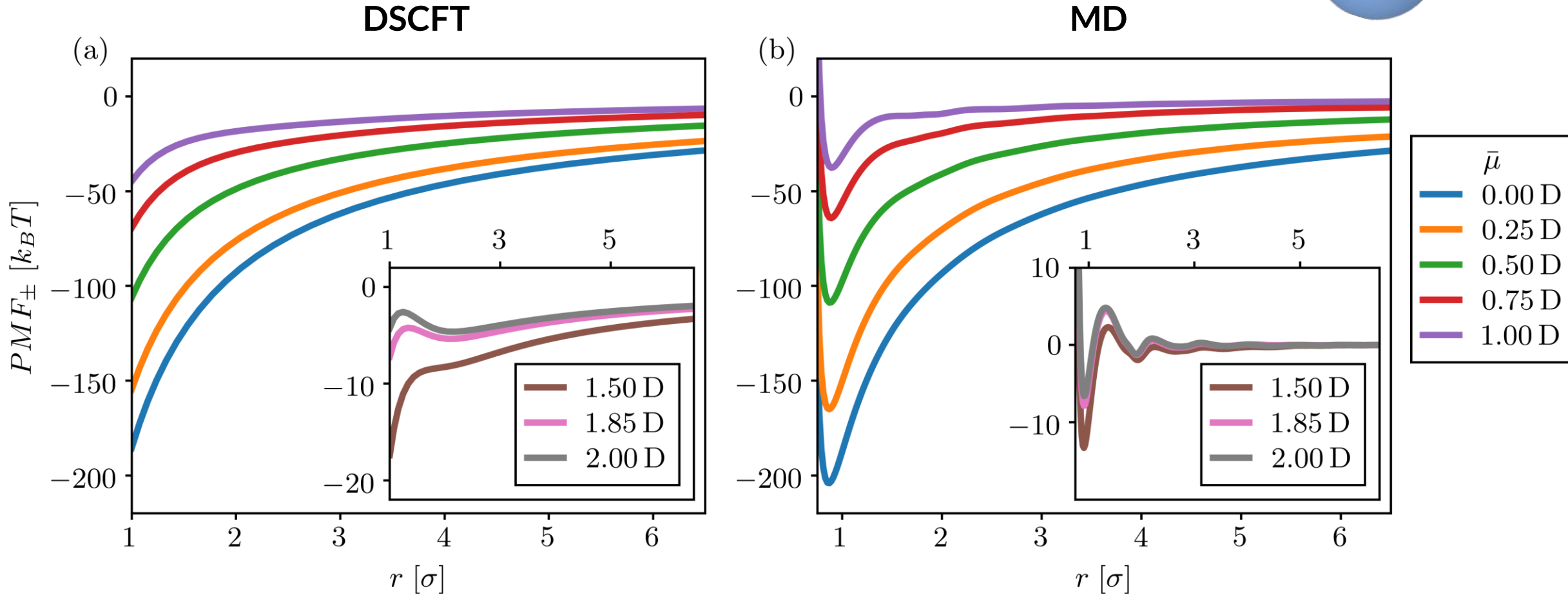
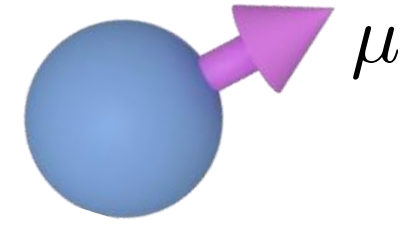
## Mean Applied Force along Coordinate



## Potential of Mean Force



# PMFs from DSCFT and MD simulation



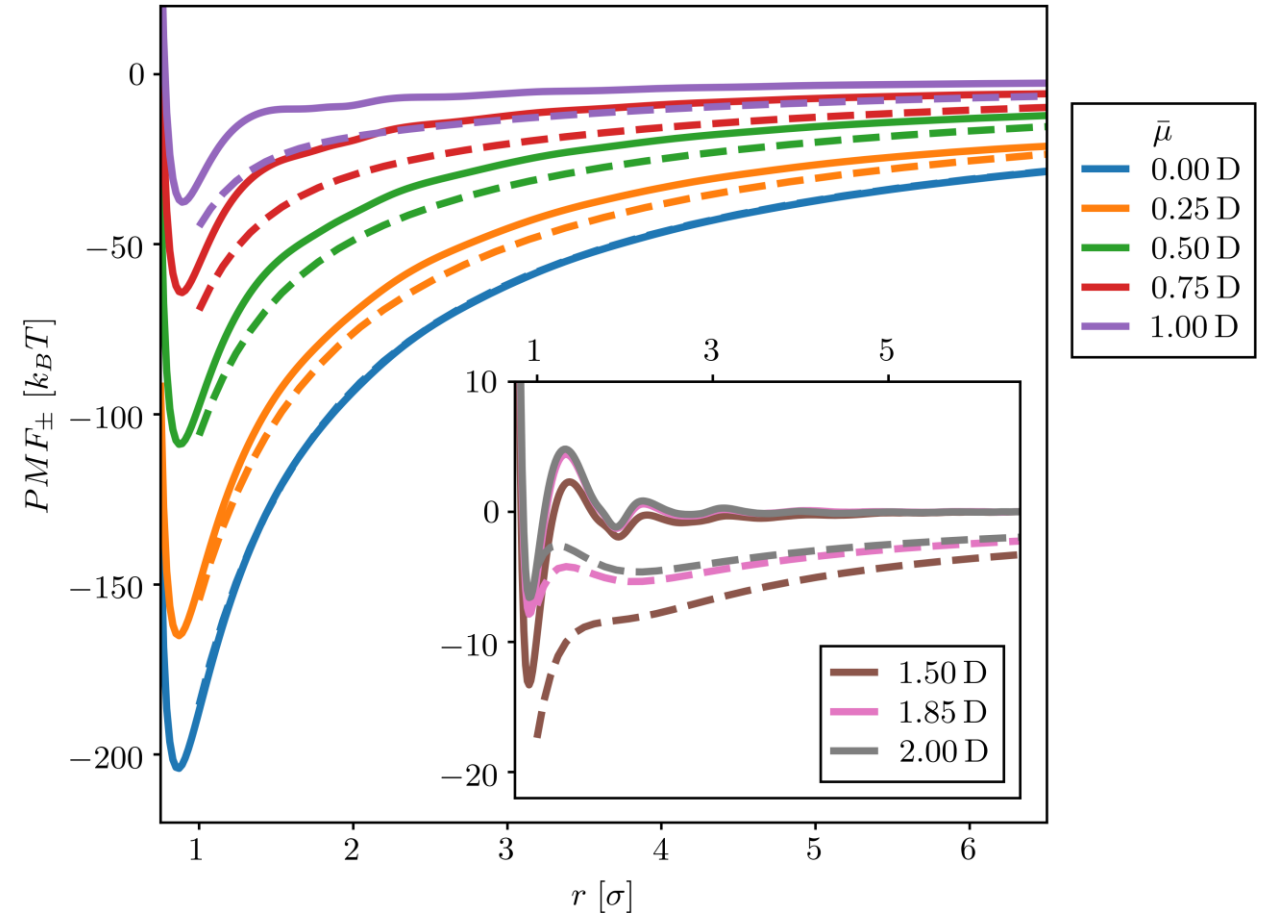
- Increasing dipole moment increases the effective dielectric constant
- PMFs reproduce Coulomb behavior for large ion separation



# Comparison of PMFs

- The agreement between methods breaks down at higher dipole moment
  - DSCFT does not account for dipole-dipole correlation

| Dipole Moment (D) | $\epsilon_r$ (DSCFT) | $\epsilon_r$ (MD) |
|-------------------|----------------------|-------------------|
| 0.00              | 1.00                 | 1.00              |
| 0.25              | 1.21                 | 1.32              |
| 0.40              | 1.54                 | 2.24              |
| 0.50              | 1.84                 | 2.52              |
| 0.75              | 2.89                 | 4.54              |
| 1.00              | 4.37                 | 9.43              |
| 1.50              | 8.57                 | —                 |
| 1.85              | 12.52                | —                 |
| 2.00              | 14.46                | —                 |



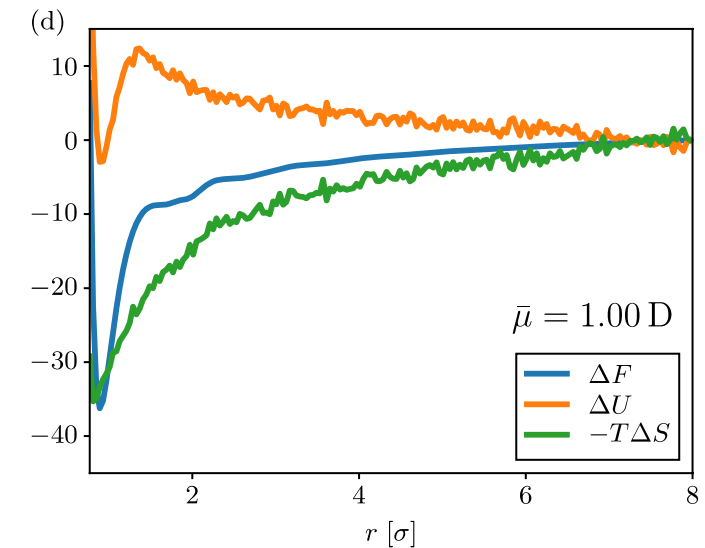
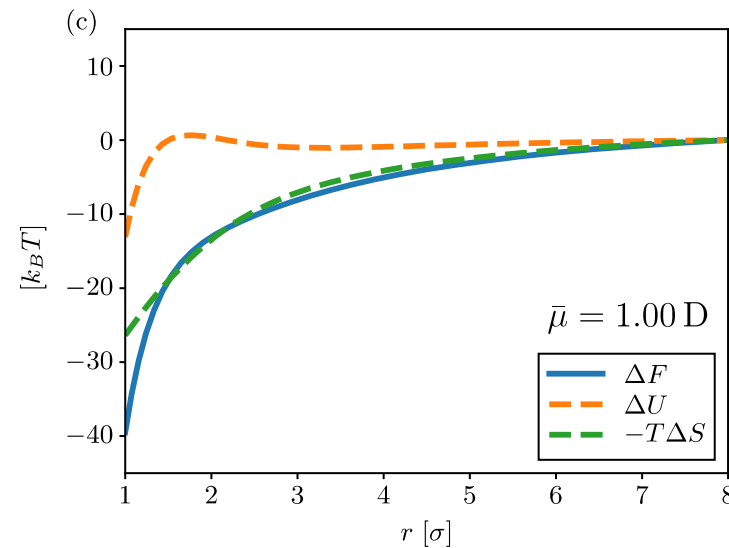
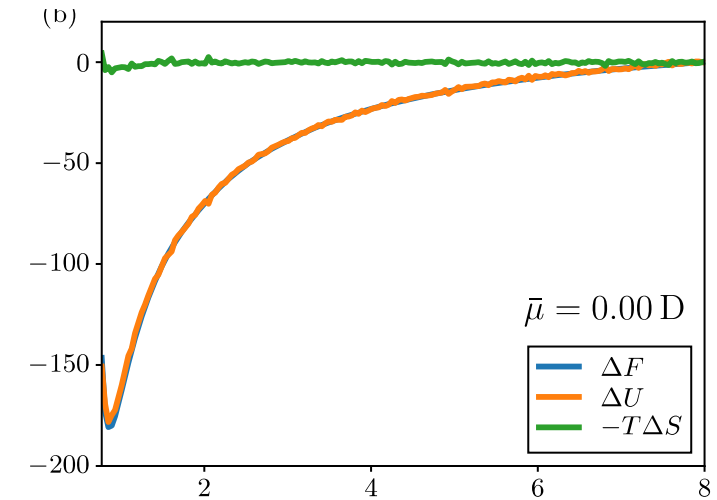
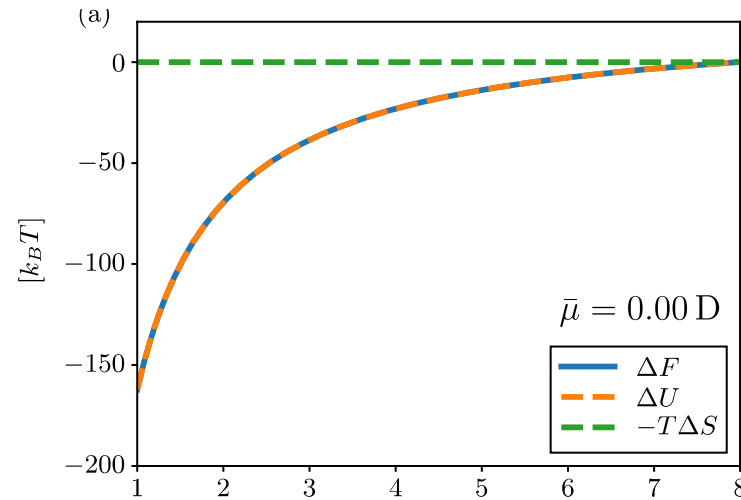
# Decomposed free energy $\Delta F = \Delta U - T\Delta S$

- No dipole case returns Coulomb potential in a vacuum

DSCFT

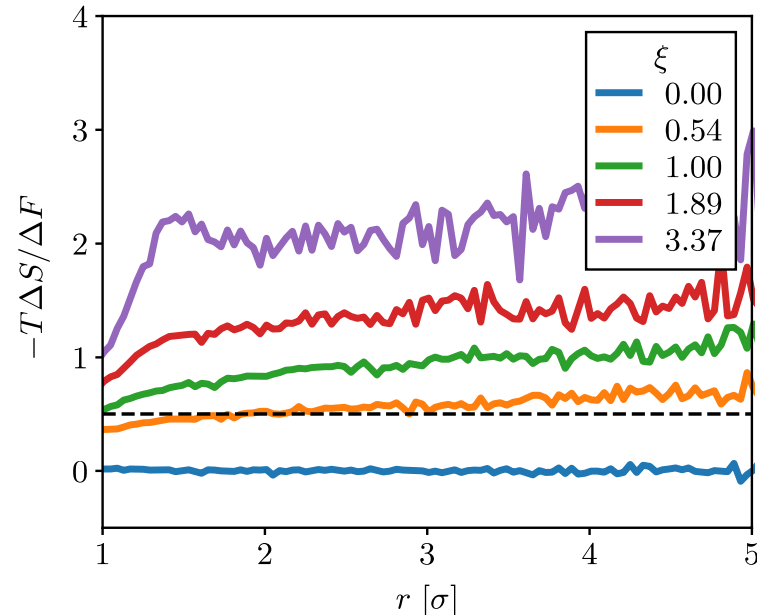
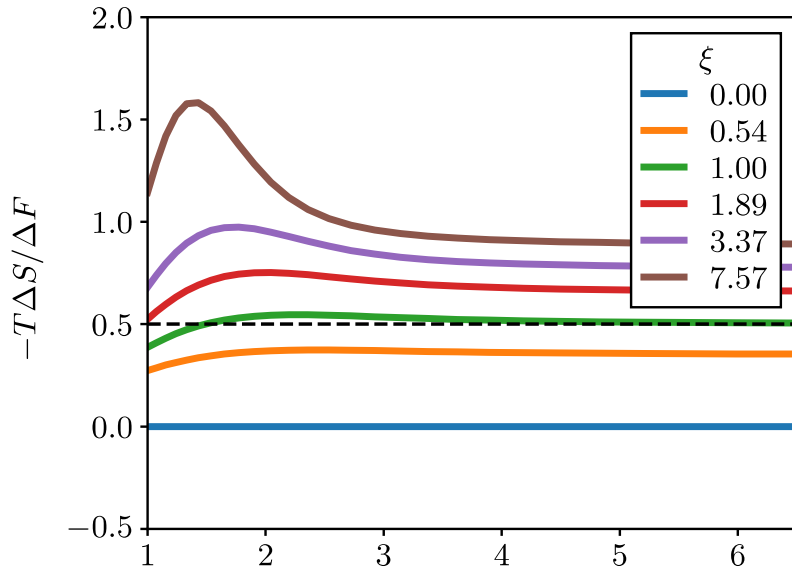
MD

- For moderate dipole moment, entropy dominates the PMF
- Note the good agreement between DSCFT and MD



for water,  $\bar{\mu} = 1.85$  D

# Ratio of entropy

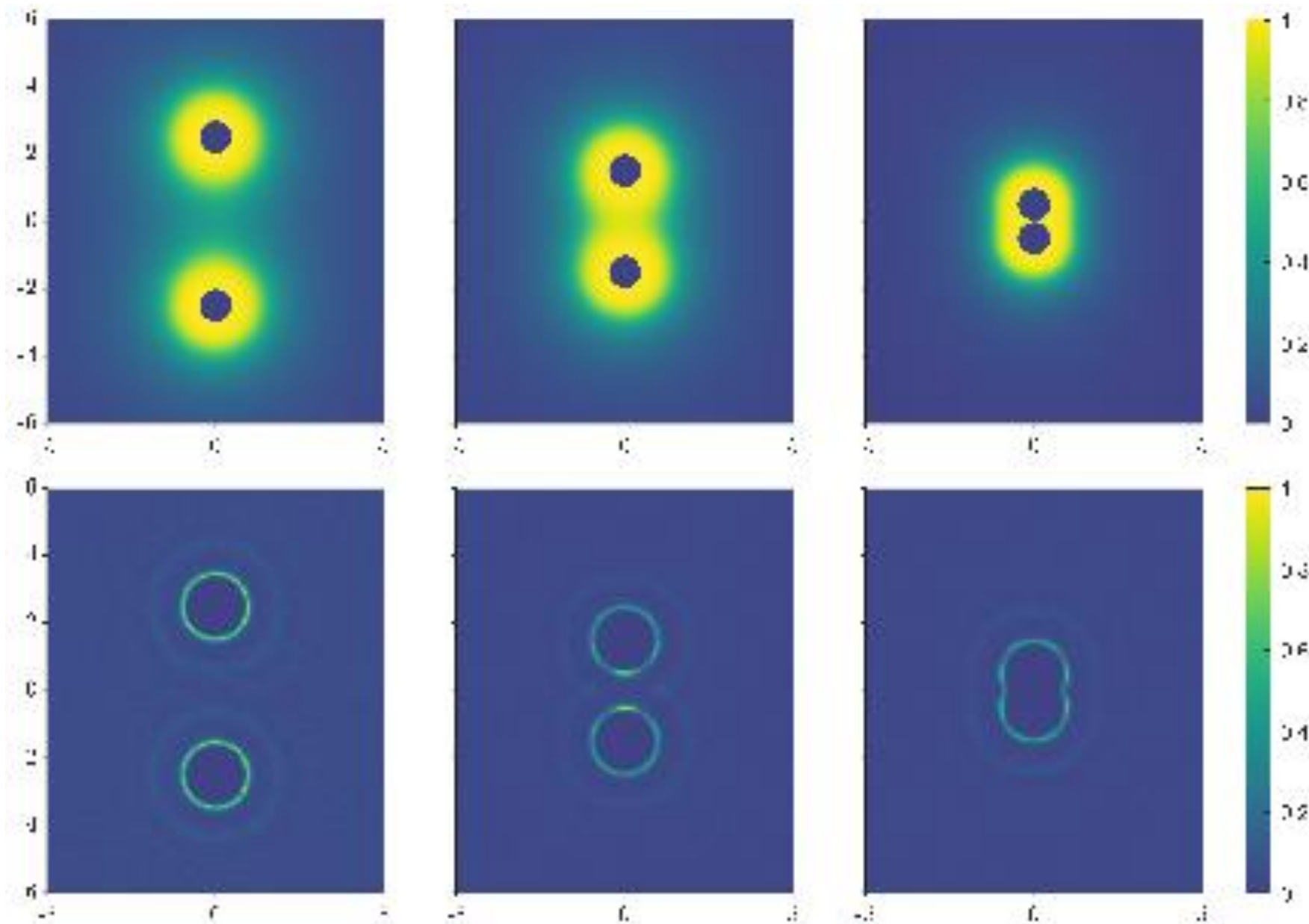


Debye Approximation: 
$$\frac{-T\Delta S}{\Delta F} = \frac{\xi}{1 + \xi} \quad \xi = \frac{\beta\bar{\mu}^2}{3v\epsilon_0}$$

$\xi > 1 \implies$  Entropy dominance!

- Both methods crossover from energy to entropy dominant
- DSCFT recovers the result from Debye in long range
- For large dipole moments, the process is entropic

# Visualizing the solvent polarization



DSCFT (Local Orientation)

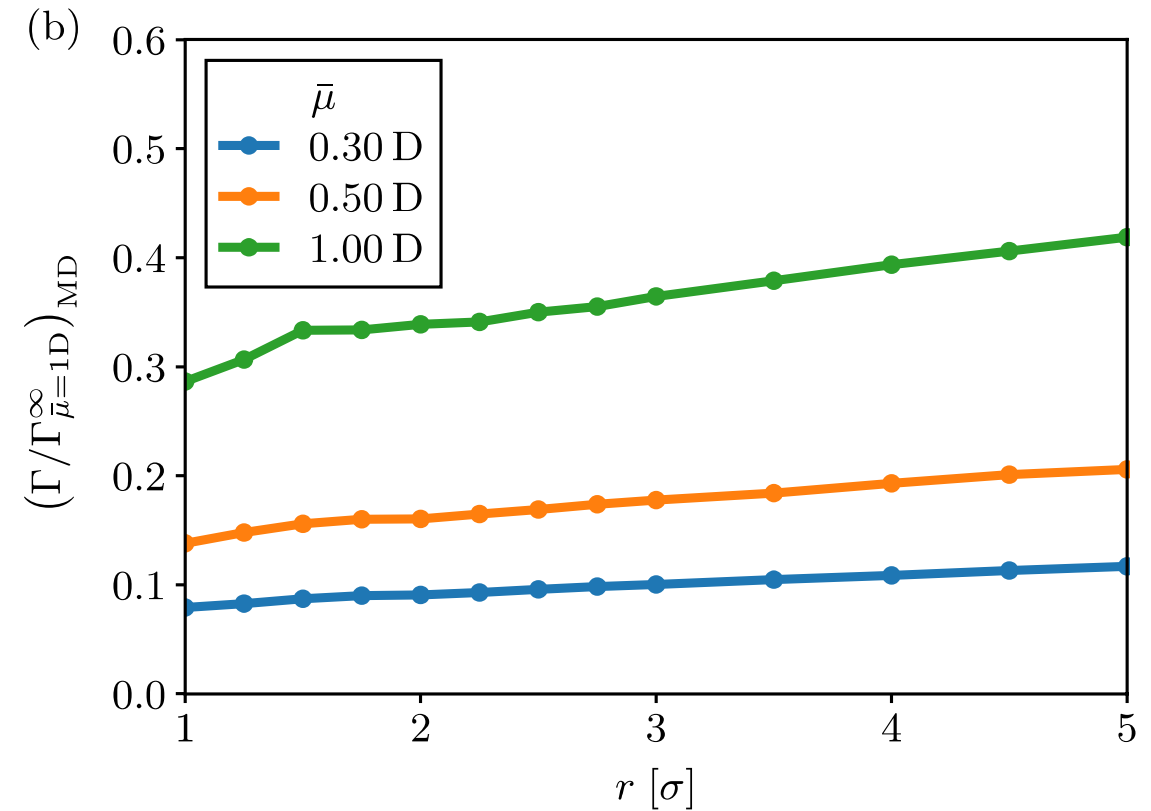
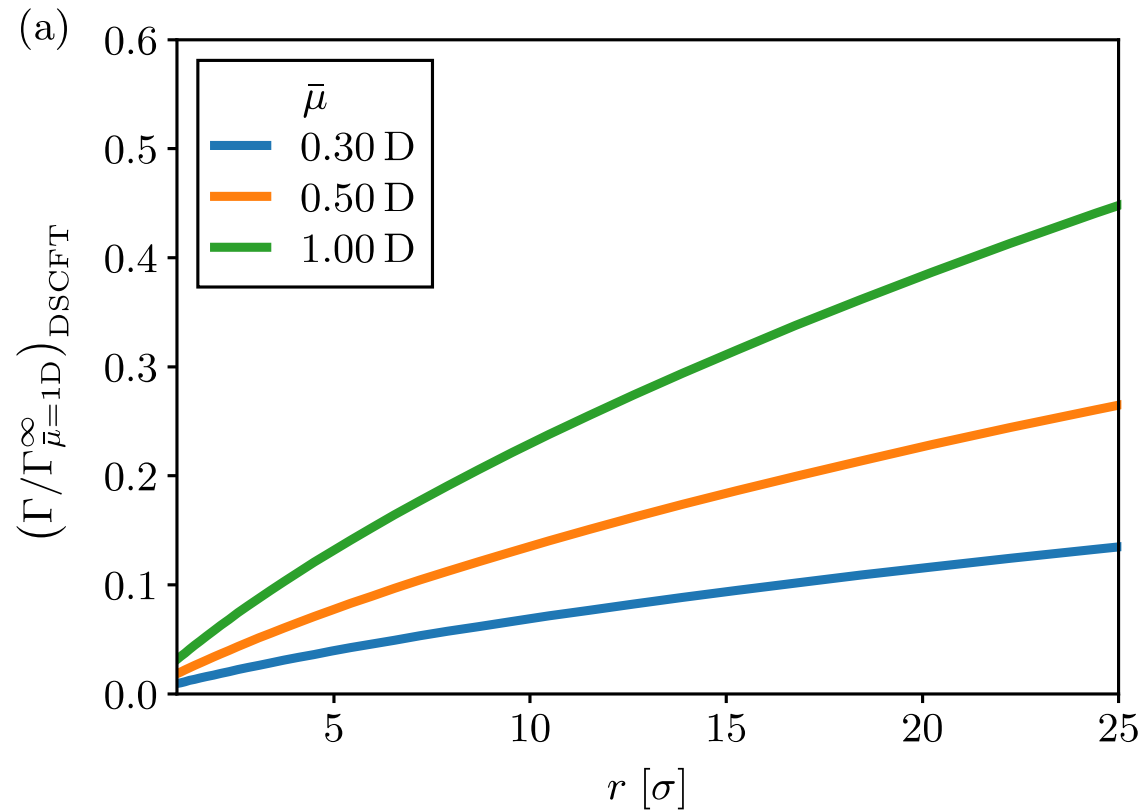
$$|P| = \chi_{\text{or}} |\nabla\phi|$$

MD (Average Dipole)

$$|\langle\mu(\mathbf{r})\rangle|$$

# Quantifying the solvent polarization

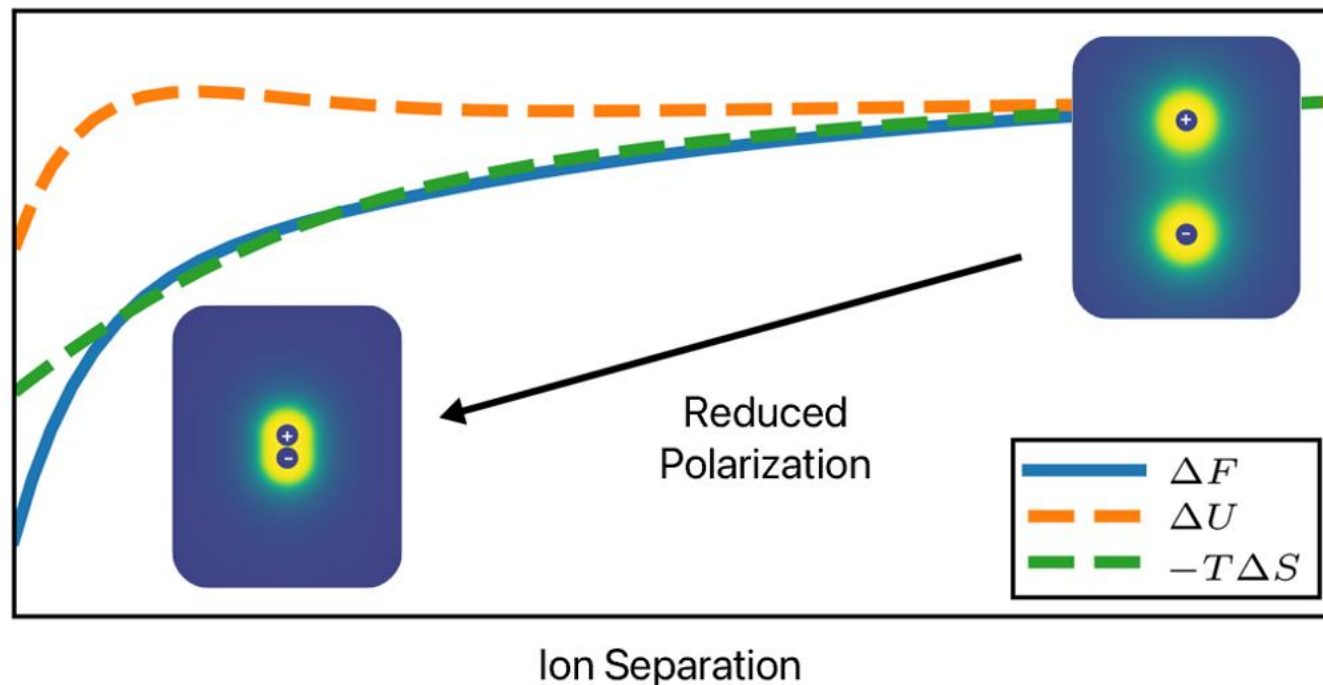
- The excess polarization decreases as we bring the ions together
- The magnitude of the change increases for increasing dipole strength



# Summary

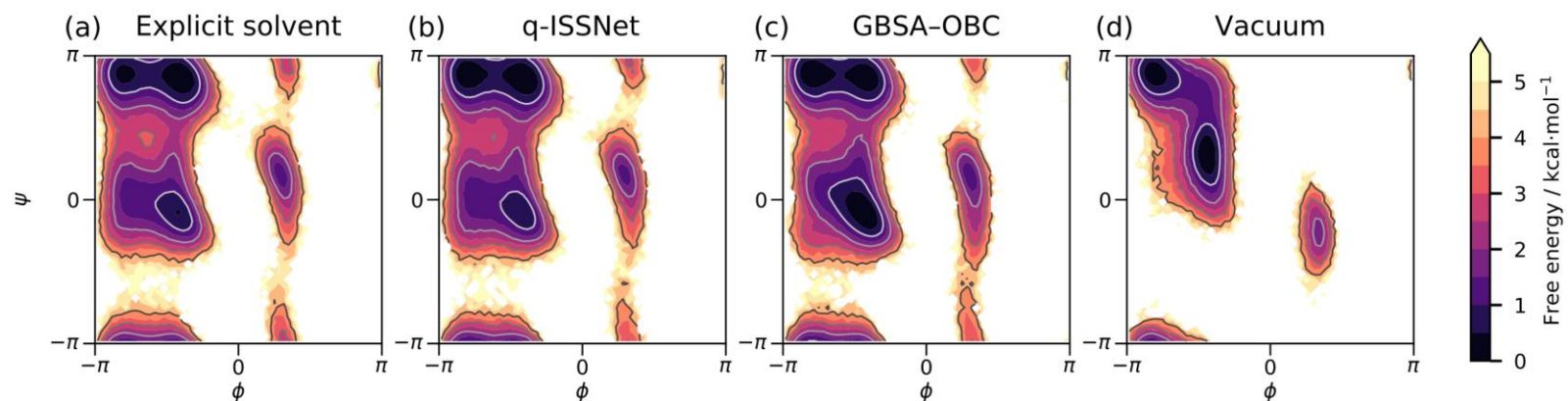
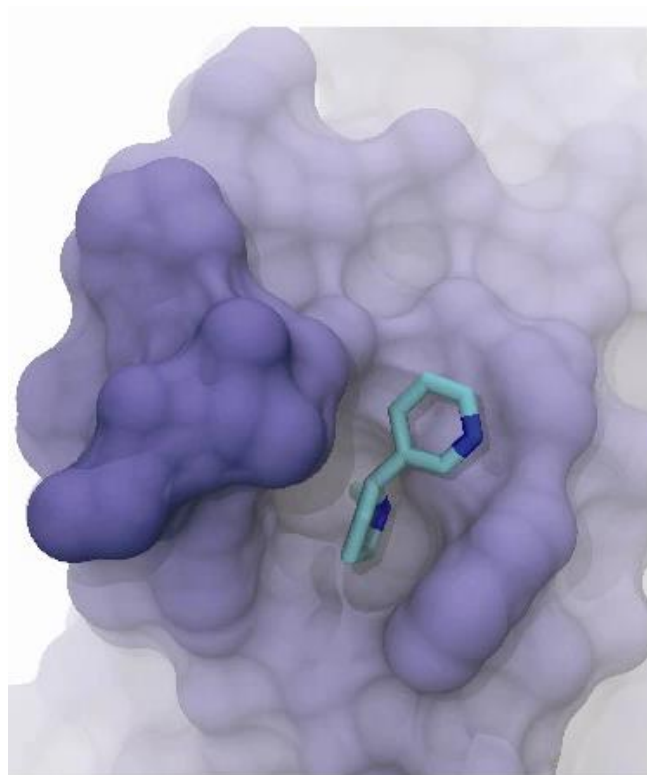
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- Implicit solvent models often hide entropy in effective interaction parameters
- If the dipole strength is large enough, the solvent entropy dominates the interaction between two oppositely charged ions



# Beyond Two Ions

- Enthalpy-entropy compensation
- Machine-learned implicit solvent models



Chen et al, J. Chem. Phys. 155, 084101 (2021)

# Acknowledgements

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- Prof. Zhen-Gang Wang
- Sam Varner

