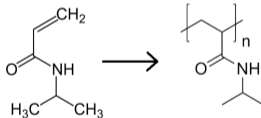


Thermodynamics of thermoresponsive polymer PNIPAM in aqueous solutions

Jakub Polak¹, Vladimír Palivec¹, Adam Kovalčík¹, Daniel Ondo¹ and Jan Heyda¹



¹Department of Physical Chemistry
University of Chemistry and Technology, Prague

1st Users Conference of IT4I
Tuesday, October 31, 2017

Outline

- 1 Introduction
- 2 Results
- 3 Summary



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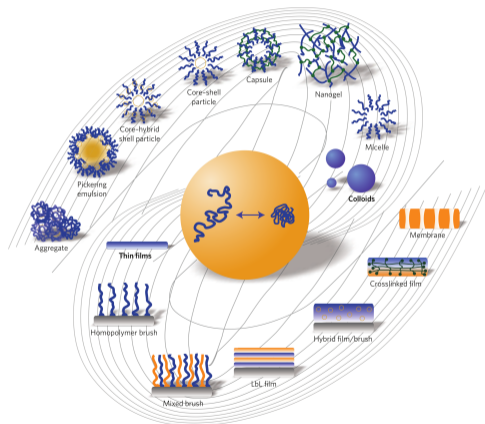
1 Introduction

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Smart Materials based on thermoresponsive polymers



- Large changes in a material property upon a application of a small external stimuli
 - Temperature, pressure, stress, moisture, light
 - Change of pH, addition of salt
- This change is reversible and controllable
 - Volume phase transition
 - Conformation (cis/trans)
 - Polarity
 - Optical properties (transparent/opaque)
 - Electrical properties ((non-)conductive)
- Near transition sensitive to another stimuli
 - → Multiresponsive materials

Stuart et al. *Nature Materials*, 2010, 9, pp. 101-113



Computational methods

- System:

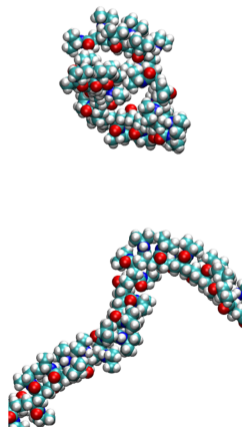
- 1 PNIPAM chain in 6nm cubic box filled with 10k water molecules
- Different force-fields employed and fine-tuned
- Different chain lengths investigated

- Method and scalability:

- **Direct MD hopeless for thermodynamics**
- Replica Exchange MD (REMD) technique for sampling
- 76 replicas spanning the temperature range 270-420 K
- Equilibration ≈ 50 -100 ns, production ≈ 100 ns per replica
- Gromacs 5.1.2 package was used
- Large number of particles \rightarrow good scaling
- 1 replica per 1 core ≈ 5 ns/day, 1 replica per node (24 cores) provides ≈ 85 ns/day
- \rightarrow **76x24=1824** cores/job (Salomon cluster)

- Analysis:

- Coil \leftrightarrow Globule equilibrium sampled $K = P_{coil}/P_{globule}$
- Direct access to transition free energy, $\Delta G = -RT \ln K$



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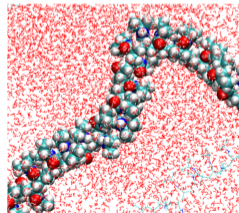
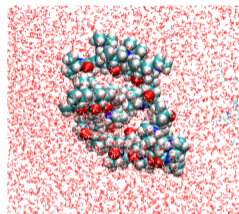
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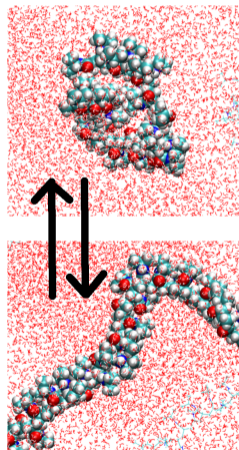
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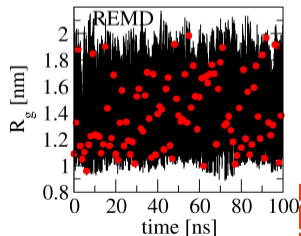
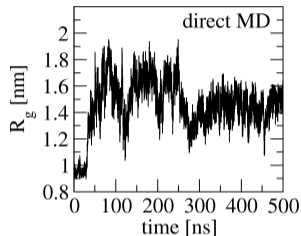
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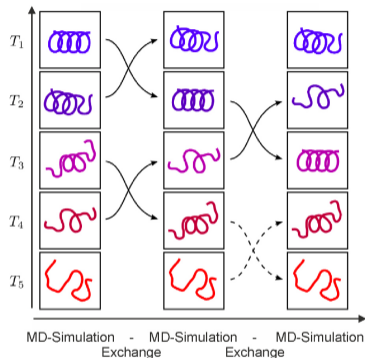
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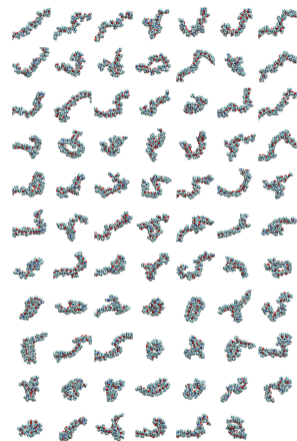
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Enhanced sampling via replica exchange MD simulation



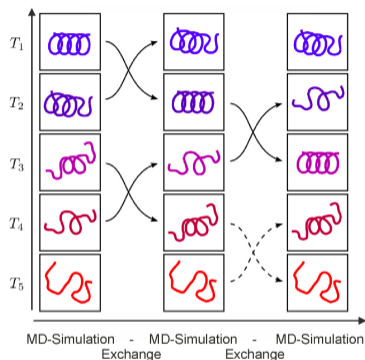
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- Largely increased sampling of the conformational space at all Temp.
- Very suitable for thermodynamic studies (all Temp. in a single run)



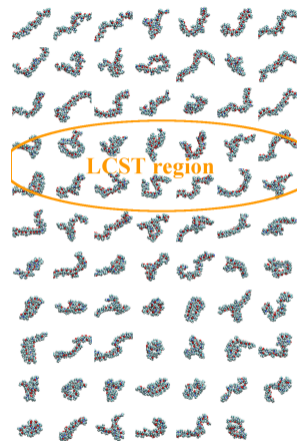
Zacharias et al., J. Phys.:
Condensed Matter, 2015, 27, pp.
323101



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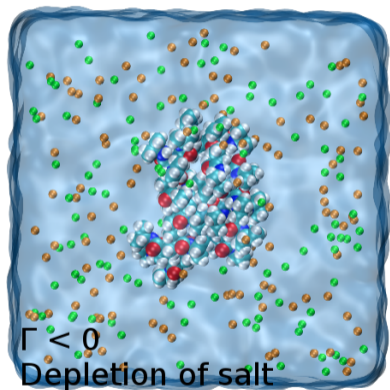
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Theory: Meeting atomistic and macroscopic properties



$$K = \frac{P_{coil}}{P_{globule}} \rightarrow \Delta G = -RT \ln K$$

$$\left(\frac{\partial \Delta G}{\partial T} \right) = -\Delta S \quad \left(\frac{\partial \Delta G}{\partial c_3} \right) = -RT \Delta \Gamma_{23}$$

$$\Gamma_{23} = \rho_3 (G_{23} - G_{21}) \approx - \left(\frac{\partial \mu_2}{\partial \mu_3} \right)_{p, T, m_2} \quad (\text{dialysis exp.})$$

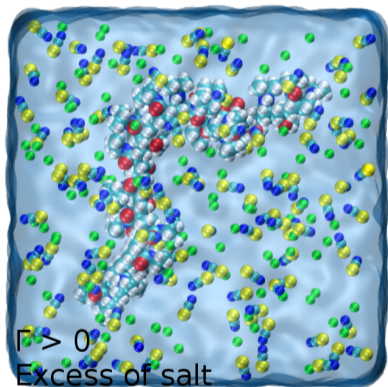
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$$\Delta T(c_3) = - \frac{RT \Delta \Gamma(c_3)}{\Delta S_0 + RT \left(\frac{\partial \Delta \Gamma}{\partial T} \right) c_3} \quad (\text{all together})$$

- 1-water, 2-PNIPAM, 3-salt
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Jan Heyda (UCT)

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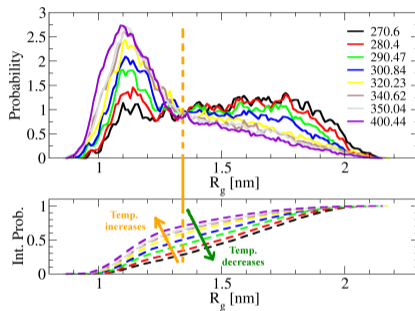
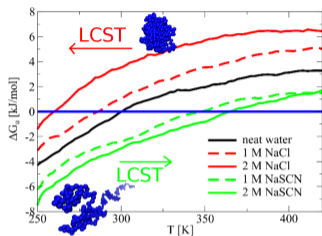
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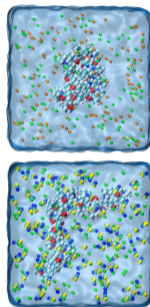
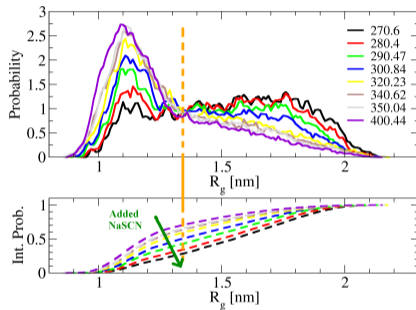
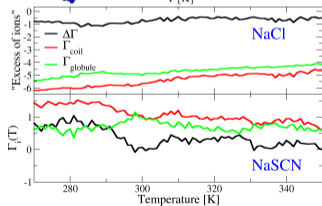
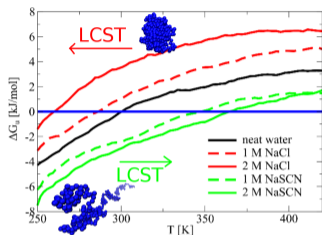
Thermodynamics from simulation perspective



- With increasing temperature the collapsed population rises
- coil \rightleftharpoons globule equilibrium $\Rightarrow \Delta G_U(T) = -RT \ln \frac{[C_{oil}](T)}{[G_{lobule}](T)}$
- Addition of salt may lead to swelling (NaSCN), or collapse (NaCl)
- These two stimuli (c_{salt} and ΔT) compensate at new LCST

Polak, J.; Palivec, V.; Kovalcik, A.;
Ondo, D.; Heyda, J. in preparation

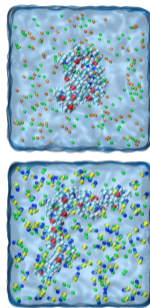
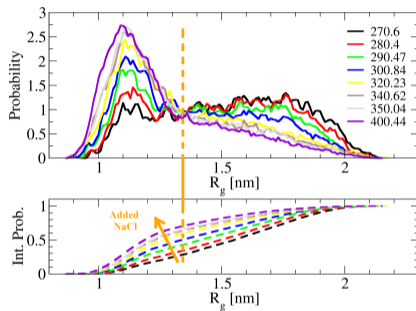
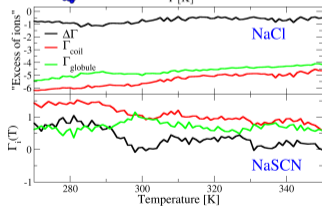
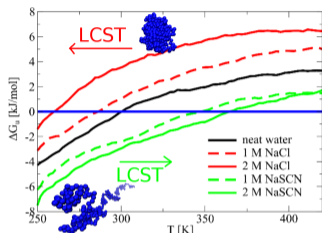
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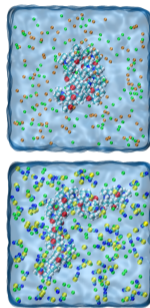
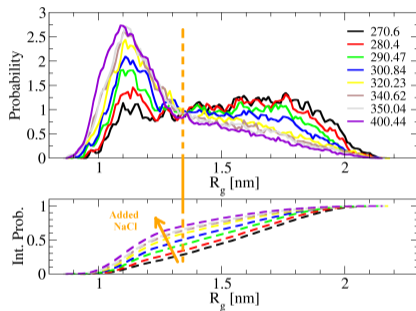
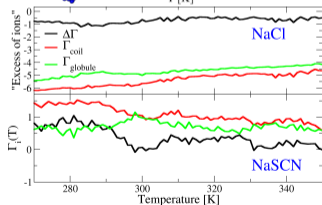
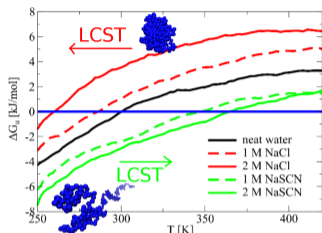
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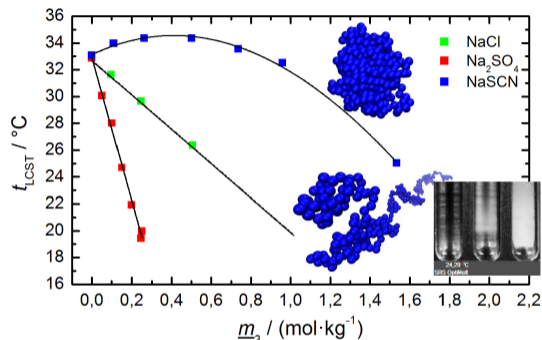
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Hard experimental thermodynamic data

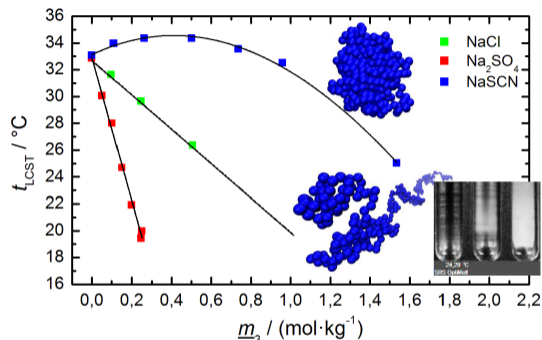


- Excluded salts cause linear decrease of LCST, i.e., cloud-point, (NaCl, Na₂SO₄)
- Salts with excess on polymer surface lead to weak nonlinear increase (NaSCN)

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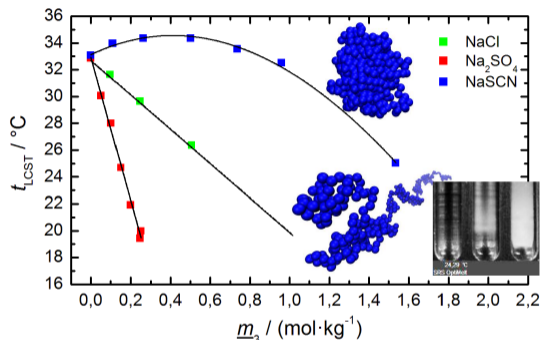
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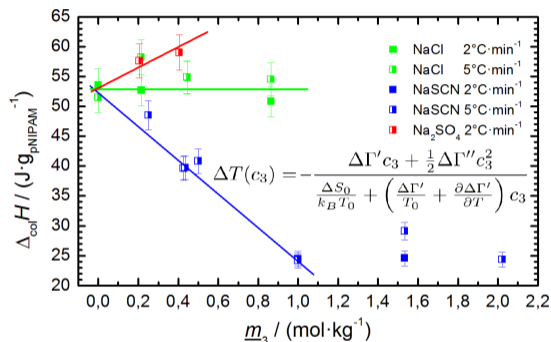


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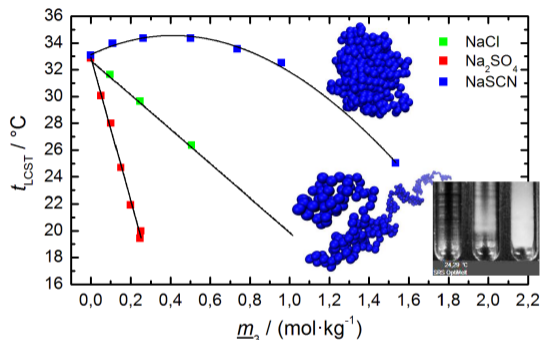
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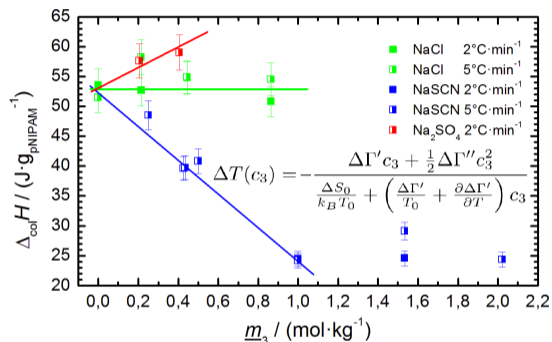
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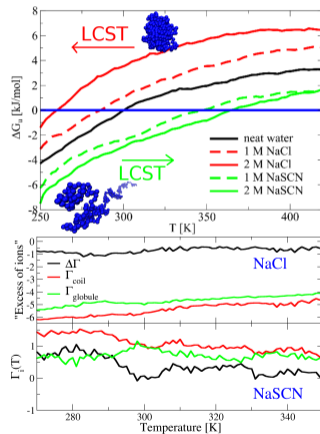
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Conclusion

- Highly parallelized REMD was employed to:
 - develop reliable force-field of pNIPAM
 - investigate thermodynamic properties in water
 - investigate effect of salt on thermodynamics
 - quantify salt excess and/or depletion
- Results are complemented with experiments:
 - cloud-point measurements
 - DSC calorimetry
 - ITC calorimetry
- Outlook:
 - effect of the polymer chain length on LCST
 - role of finite polymer concentration (i.e., many chains)



Acknowledgement

- Experiments: Jakub Polak, Adam Kovalcik, Daniel Ondo (LCST, ITC, DSC)
- Simulations: Vladimir Palivec, Denis Zadrazil, Emil Pavelka– see our poster



- Czech Science Foundation, Grant 16-57654Y
- CIISB proposal at CEITEC-MU Brno (DSC, DLS, SAXS)
- IT4Innovations National Supercomputing Center – LM2015070
 - Project OPEN-7-50
 - Project OPEN-10-36

Thank you for your attention

Looking for 14 ChemJets – (flyers&info by our poster)

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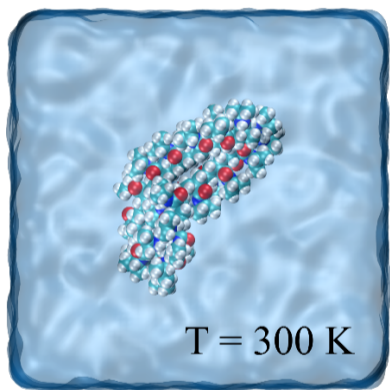
Biochemistry • Biotechnology • Chemical Engineering •
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Drug Design • Electrochemistry • Environmental Chemistry
• Food Chemistry & Analysis • Materials Chemistry •
Metallurgy • Organic Chemistry • Particle Technology •
Physical Chemistry • Soft Matter Chemistry

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Submit your application via e-mail to marika.kurova@vscht.cz
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Theory: Meeting atomistic and macroscopic properties



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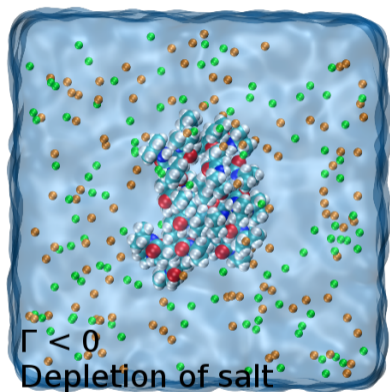
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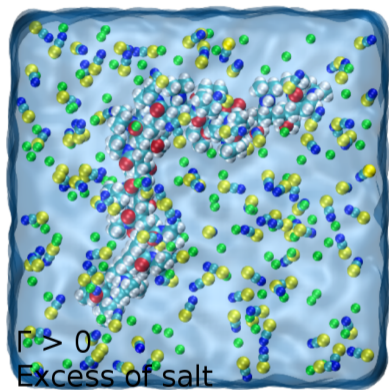
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Theory: Meeting atomistic and macroscopic properties



Algaer et al. *JPCB*, 2011, 115, pp. 13781
 Heyda et al. *Macromolecules*, 2013, 46, pp. 1231
 Heyda et al. *JPCB*, 2014, 118, pp. 10979
 Okur et al. *JPCB*, 2017, 121, pp. 1997

$$\Delta G(\Delta T, c_3) \simeq \Delta G(T_0) + \left. \frac{\partial \Delta G}{\partial T} \right|_0 \Delta T + \left. \frac{\partial \Delta G}{\partial c_3} \right|_0 c_3 + \dots \quad (\text{Taylor})$$

$$\Gamma_{23} = \rho_3(G_{23} - G_{21}) \approx - \left(\frac{\partial \mu_2}{\partial \mu_3} \right)_{p, T, m_2}$$

$$\Delta \Gamma_{23} = \Gamma_{c3} - \Gamma_{g3} \rightarrow \mu_c - \mu_g = \Delta G(c_3) \dots \text{Gibbs E.}$$

$$\Delta \Gamma(c_3, \Delta T) = \Delta \Gamma' c_3 + \frac{1}{2} \Delta \Gamma'' c_3^2$$

$$\Delta T(c_3) = - \frac{\Delta \Gamma' c_3 + \frac{1}{2} \Delta \Gamma'' c_3^2}{\frac{\Delta S_0}{k_B T_0} + \left(\frac{\Delta \Gamma'}{T_0} + \frac{\partial \Delta \Gamma'}{\partial T} \right) c_3}$$

- 1-water, 2-PNIPAM, 3-salt
 G_{21} , G_{23} – Kirkwood-Buff integrals (*effective excluded volume*)
 Γ_{23} – Preferential interaction (*number of particles*)
- Depleted salt affects ΔT
- Binding salt affects ΔT and ΔH