# Quantitative prediction of the phase diagram of alkanes in polar solvents

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# OUR RESEARCH

- Development of a Coarse Grained model (CGm) for complex fluids (solvents+polymers)
  - <u>Realistic</u>  $\Rightarrow$  predictive
  - Simplified  $\Rightarrow$  accessible to numerical investigations (MC and EOS)
- We consider dipolar (NH<sub>3</sub>, N<sub>2</sub>O, H<sub>2</sub>S, ...) and quadrupolar solvents (CO<sub>2</sub>, C<sub>6</sub>H<sub>6</sub>, ...) and their mixtures with alkanes (C<sub>n</sub>H<sub>2n+2</sub>)
  - We improve the previous Lennard-Jones CGm (P. Virnau et al. JCP 121, 2169) by including a *polar spherically averaged* interaction (В.М. Mognetti et al. JCP 128, 104501)
- GOAL: avoid the use of *ad-hoc* extra parameters in mixing rules  $\Rightarrow$  <u>PREDICTIVITY</u> (no mixture experiments to fix the CGm)

$$\epsilon_{sp} = \xi \sqrt{\epsilon_s \epsilon_p}$$

# PLAN OF THE TALK

- The CGm for quadrupolar solvents: deriving the model and its validation using pure component experimental result
- The CGm for dipolar solvents: deriving the model and its validation using pure component experimental result
- Mixture phase diagram: validation of the new model using mixture with alkanes
  - Comparison with the previous modeling (LJ and and  $\xi < 1$ )
  - Comparison of the small residual discrepancies with apolar mixtures ones
- Conclusion

#### COARSE GRAINING





 $C_{16}H_{34}$  - chain of 5 monomers

 $CO_2$  - a single LJ-bead

Bead–spring model : LJ+FENE potential

## A bead-spring model for chain molecules: Lennard-Jones plus FENE potential



EOS can be derived for LJ+FENE!

## THE MODEL (dipolar) PCCP, submitted

• We start from the Stockmayer potential SM, LJ+DD beads

$$V^{(\mathsf{F},\mathsf{D})} = 4\epsilon_{s} \left[ \left(\frac{\sigma_{s}}{r}\right)^{12} - \left(\frac{\sigma_{s}}{r}\right)^{6} \right] + \frac{\mu^{2}}{r^{3}} \left[ \vec{n}_{i} \cdot \vec{n}_{j} - \frac{3}{r^{2}} (\vec{n}_{i} \cdot \vec{r}_{ij}) (\vec{n}_{j} \cdot \vec{r}_{ij}) \right]$$

• Averaging over  $\vec{n}_i$ ,  $\vec{n}_j \Rightarrow$  isotropic short ranged potential (G. Stell et al. Mol. Phys. 27, 1393)

$$V^{(\mathsf{A},D)} = 4\epsilon_s \left[ \left(\frac{\sigma_s}{r}\right)^{12} - (1+\lambda) \left(\frac{\sigma_s}{r}\right)^6 \right]$$
$$\lambda = \frac{1}{12\epsilon_s \sigma_s \kappa_B T}^{\mu^4} = \lambda_c \frac{T_c^{\text{exp}}}{T}$$

•  $\epsilon_s$ ,  $\sigma_s$  and  $\lambda_c$  determined using  $T_c^{exp}$ ,  $\rho_c^{exp}$  and  $\mu^{exp}$  (or an adjusted value of dipolar moment  $\mu^{adj}$ )

#### THE MODEL (quadrupolar) JCP, 108 (2008); PRE 77 (2008)

• Solvent molecules  $\Rightarrow$  (LJ+QQ)-beads

$$V^{(\mathsf{F},Q)} = 4\epsilon_s \Big[ \left(\frac{\sigma_s}{r_{ij}}\right)^{12} - \left(\frac{\sigma_s}{r_{ij}}\right)^6 \Big] + \frac{3Q^2}{4r_{ij}^5} f(\Omega_i, \Omega_j)$$

• Averaging over  $\Omega_i \Rightarrow \underline{\text{isotropic}}$  potential (G. Stell et al. Mol. Phys. 27, 1393; E. Müller et al. Ind. Eng. Chem. Res. 42, 4123 )

$$V^{(\mathsf{A},Q)} = 4\epsilon_s \left[ \left( \frac{\sigma_s}{r_{ij}} \right)^{12} - \left( \frac{\sigma_s}{r_{ij}} \right)^6 - \frac{7}{20} q_c \frac{T_c^{\mathsf{exp}}}{T} \left( \frac{\sigma_s}{r_{ij}} \right)^{10} \right]$$
$$q_c = \frac{Q^4 \sigma_s^{-10}}{\epsilon_s k_B T_c^{\mathsf{exp}}}$$

•  $\epsilon_s$ ,  $\sigma_s$  and  $q_c$  determined using  $T_c^{exp}$ ,  $\rho_c^{exp}$  and  $Q^{exp}$  (or an adjusted value of quadrupolar moment  $Q^{adj}$ )



 $\epsilon_0$  and  $\sigma_0$  being the parameters for the uncut LJ potential (i.e. if  $\mu=0$ )

#### THE MC METHODS Virnau et al., JCP 120, 10925

- Successive Umbrella Sampling
  - Algorithm constrained to sample configurations with n or n+1 particles (if n+2 or n-2 particles are generated the move is rejected)
  - In such a way P(n+1)/P(n) is determined
  - Spanning in n one is able to reconstruct P(n) and F(n)= log P(n) with the interface tension (Binder PRA25, 1982)  $\gamma = \Delta F/2L^2$



#### PURE QUADRUPOLAR SUBSTANCES

# J. Chem. Phys. **128**, 104501, (2008)

# CO<sub>2</sub>: $Q_{exp}$ (q<sub>c</sub>=0.387) and $Q_{adj}$ (q<sub>c</sub>=0.470)



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We also perform well when compared to fully atomistic models (which are too complicated for mixtures)



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C<sub>6</sub>H<sub>6</sub>:  $Q_{exp} = 12DÅ(q_c=0.247)$  and  $Q_{adj} = 13.4DÅ(q_c=0.38)$ 



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#### PURE DIPOLAR SUBSTANCES

## Phys. Chem. Chem. Phys., submitted

**NH3:**  $\mu_{exp}=1.482D$  ( $\lambda_c=0.131$ ) and  $\mu_{adj}=1.65D$  ( $\lambda_c=0.218$ )



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N<sub>2</sub>O: 
$$\mu_{exp}=0.166D \ (\lambda_c=1.75\cdot 10^{-5})$$
 and  $\mu_{adj}=1.25D \ (\lambda_c=0.060)$ 



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### POLAR FLUIDS WITH ALKANES

#### EXPENSIVE SIMULATIONS

• Two methods

TPT1 – MSA FAST BUT INACCURATE IN THE CRITICAL REGION (L. G. MacDowell)



• QUADRUPOLAR EXAMPLES (CO<sub>2</sub>). IE/DF an integral equationdensity functional theory (M. Oettel)

#### ALKANES PHASE DIAGRAM (P. Virnau)



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#### QUADRUPOLAR MIXTURES

#### J. Chem. Phys., accepted

# MONOMER MIXTURES ( $CH_4 + CO_2$ )

using: i) simple LJ ( $q_c=0$ ), and ii)  $q_c=0.47$  (the adjusted value)



Note: mean-field theories such as TPT1-MSA overestimate the critical pressure and thus predict too large two-phase loops (can be improved by MC)

# MIXTURES: $CO_2 + C_{16}H_{34}$

(P. Virnau et al. JCP **121**, 2169 )

• (left) <u>Isotherm</u>:  $\star$  are MC results (T=486 K),  $\blacksquare$  exp. results (right) <u>Critical line</u>: the full line are previous MC with  $\xi \leq 1$ 



- Note the nice agreement with experiments at low T

- The results with  $q_c > 0$  ( $\xi = 1$ ) agree with previous simulations in which  $\xi < 1$  has been tuned (reminder  $\epsilon_{sp} = \xi \sqrt{\epsilon_s \epsilon_p}$ )

#### DETERMINING THE CRITICAL POINT

• Order parameter (neglecting pressure mixing, M. Fisher)

$$\mathcal{M} = N_p + x_1 \cdot N_s + x_2 \cdot E_{\text{tot}}$$

- $x_1$ ,  $x_2$  (like  $\mu_s$  and  $\mu_p$ ), tuned in order to get the best agreement between  $P(\mathcal{M})$  and the universal Ising plot (N. Wilding)
- FSS analysis with  $x_1$  determined minimizing the cumulants  $(x_2 \approx 0)$



#### DIPOLAR MIXTURES

## Phys. Chem. Chem. Phys., submitted

# MONOMER MIXTURE $CH_4 + NH_3$

• Critical line



• The new model can reproduce *i*) the proper type of phase diagram and *ii*) quantitative significant data

# $NH_3 + C_{16}H_{34}$

• Critical line and an isothermal slice (for  $NH_3+C_{16}H_{34}$ )



• Agreement with experiment not yet perfect

# CONCLUSIONS

- We have introduced two CGm for dipolar and quadrupolar solvents
- The models are highly portable and can be immediately derived for a given solvents (without additional efforts)
- Phase diagrams of the pure substances are in good agreement with experiments (even if compared with atomistic models)
- Using simple combining rules, mixture phase diagrams are nicely in agreement with experiments
- Residual discrepancies are comparable with apolar systems ones

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#### POLYMER MIXTURES: first examples



- TPT1 cannot reproduce the critical region (being a Mean-Field theory)
- At lower temperature the agreement seems to be worse (quality of the CGm?)

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#### MIXTURES: other apolar cases TPT1



- We confirm the previous scenario in which discrepancies are bigger
- We have to investigate the low temperature (high pressure) discrepancies with MC simulations (in progress!)

# A SIMPLER CASE (Xe + Kr)



# ANGLE-DEPENDENT POTENTIALS

Does the not-averaged model work even better? No (B. M. Mognetti et al. Phys. Rev. E 77, 041506)

• (left) Same  $\epsilon_s$ ,  $\sigma_s$ , and Q



• (right) Same  $T_c$ ,  $\rho_c$ , and Q

 $\Rightarrow$  We learn *i*) the importance of <u>fixing the CP</u> and *ii*) we are encouraged to use the averaged model

# TPT1-MSA EQUATION OF STATES

- Strategy: to know how good is the EOS and where can be used
- Previous project: TPT1-MSA (L. G. MacDowell et al. JCP 113, 419; JCP 117, 6360)
  - Potential mapped onto two Yukawa potentials  $[\mathcal{Y}_1(r), \mathcal{Y}_2(r)]$  which allow us to compute g(r) and the thermodynamics (Y. Tang et al. JCP **99**, 9828; FPE **134**, 21)
- We generalize the previous considerations using two more Yukawa tails to fit the quadrupolar part of the potential

$$V_{q_c}^{(\mathsf{A})}(r) = \begin{cases} d_{\mathsf{HS}}(q_c, T) &, r < r_0 \\ \left(\mathcal{Y}_1(r) + \mathcal{Y}_2(r)\right) - \frac{7}{20}q_c \frac{T_c}{T} \left(\mathcal{Y}_3(r) + \mathcal{Y}_4(r)\right) &, r > r_0 \end{cases}$$

plus proper one fluid approximation for  $q_c$  in the mixtures

#### MC vs. MSA-TPT1 EOS

Pure substances. Nice agreement far from the critical point.



H<sub>2</sub>S:  $\mu_{exp}=1.1D$  ( $\lambda_c=0.023$ )



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H<sub>2</sub>S: \mu_{exp}=1.1D (\lambda_c=0.023)
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H<sub>2</sub>S:  $\mu_{exp}=1.1D \ (\lambda_c=0.023)$ 



# REMAPPING $V^{(A,D)}$ in $V^{LJ}$

• 
$$V^{(\mathsf{A},\mathsf{D})} = 4\epsilon_s [(\frac{\sigma_s}{r})^{12} - (1+\lambda)(\frac{\sigma_s}{r})^6] = 4\tilde{\epsilon}_s [(\frac{\tilde{\sigma}_s}{r})^{12} - (\frac{\tilde{\sigma}_s}{r})^6]$$
  
 $\tilde{\epsilon}_s = \epsilon_s (1+\lambda_c T_c/T)^2$   $\tilde{\sigma}_s^6 = \sigma_s^6/(1+\lambda_c T_c/T)$ 

- We cut and shift (at  $2 \cdot \tilde{\sigma}_s^{7/6}$ ) the effective LJ  $\Rightarrow \epsilon_s$  and  $\sigma_s$  rescaled by proper known factors

- Having a set of simulation results for the cut and shifted LJ potential  $\{T_i^*, \rho_{i,q}^*, \rho_{i,l}^*, p_i^*, \gamma_i^*\}$  (and knowing  $\epsilon_s$  and  $\sigma_s$ )
  - The physical temperature  $T_i$  must satisfy the following relation

$$T_i = \frac{\tilde{\epsilon}_s T_i^*}{k_B} = \frac{T_i^*}{k_B} \epsilon_s (1 + \lambda_c \frac{T_c}{T_i})^2$$

- Knowing  $T_i$  one can compute  $\tilde{\epsilon}_s$  and  $\tilde{\sigma}_s$  and mapping all the simulation quantities in physical unit (using standard formula)

# FIXING THE CGm, DIPOLAR MODEL

- At the critical point  $T = T_c$  the mapped LJ potential must be equal to the LJ interaction of the apolar model  $\tilde{\epsilon}_s(T_c) = \epsilon_0 \ \tilde{\sigma}_s(T_c) = \sigma_0$
- Using the mapping formula  $\epsilon_s o ilde{\epsilon}_s, \ \sigma_s o ilde{\sigma}_s$  at the critical point

$$\frac{\epsilon_s}{\epsilon_0} = \frac{1}{(1+\lambda_c)^2} \qquad \qquad \frac{\sigma_s^6}{\sigma_0^6} = (1+\lambda_c)$$

and using the expression  $\lambda_c = \lambda_{c0} (\epsilon_0/\epsilon_s) (\sigma_0/\sigma_s)^6$  we finally conclude

$$rac{\epsilon_s}{\epsilon_0} = (1-\lambda_{c0})^2 \qquad rac{\sigma_s{}^6}{\sigma_0{}^6} = rac{1}{(1-\lambda_{c0})} \qquad \lambda_c = rac{\lambda_{c0}}{1-\lambda_{c0}}$$

Notice that for  $\lambda_{c0} \rightarrow 1$  the mechanism break down (also in the quadrupolar case?)

• Alternatively use  $T_c(\lambda_c)/T_c(0) = (1 + \lambda_c)^2$  and  $\rho_c(\lambda_c)/\rho_c(0) = \sqrt{1 + \lambda_c}$ in the previous slide

# ON THE USE OF MAGNIFIED VALUES FOR $\mu$

• Is it only our problem? <u>No</u>

	$\mu_{\sf phys}/{\sf D}$	$\mu_{opt}/D$ our CGm	$\mu_{\rm opt}/{\sf D}$ SM FPE <b>220</b> , 1
NH <sub>3</sub>	1.482	1.482	_
H <sub>2</sub> S	1.1	1.1	1.64
CCl <sub>2</sub> O	1.17	2	3.035
N <sub>2</sub> O	0.166	1.25	1.76
C <sub>6</sub> H <sub>5</sub> Cl	1.7	3.5	-

- We use optimal dipolar moments magnified by the same order of magnitude of the SM potential
- Possible explanations
  - Magnification related to polarizable effects
  - Point-like approximation is not good

# MONOMER MIXTURES $(CH_4 + C_6H_6)$ using: *i*) simple LJ (Q=0), *ii*) the experimental value Q=12 DÅ, and *iii*) the adjusted one Q=13 DÅ

