

# Molecular simulation of Dissolved Inorganic Carbons for Underground Brine CO<sub>2</sub> Sequestrations Project Number:DE-FE0002057

California Institute of Technology

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# Challenges in Carbon Capture and Sequestration

## CO<sub>2</sub> Capture Technologies

- Post-Combustion Capture – Captured from flue gases at commercial-scale power station.
- Pre-Combustion Capture – CO<sub>2</sub> is removed before combustion takes place.
- Oxy-Fuel Combustion – The fuel is burned in Oxygen instead of air.

## CO<sub>2</sub> Transportations

- Pipelines, High pressure supercritical flow, Low temperature liquid

## CO<sub>2</sub> Sequestrations

- **Geological Storage (Deep sea, Coal mine, Oil field etc.)**
- Biological Processes (Ocean, Forest, Agriculture, Peat Production, etc)
- Physical Processes (Biomass treatments: Bio-Energy with CCS (BECCS), Biomass Pyrolysis)
- Chemical Techniques (Mineral Sequestration, etc)

## CO<sub>2</sub> Re-used

- Chemical conversions to hydrocarbon, polymerization, Food & Pharmaceutical industries, Enhanced Oil Recovery (EOR)

## CO<sub>2</sub> Monitoring

- CO<sub>2</sub> Leakage; in-situ measurements

# Why store CO<sub>2</sub> in brine?

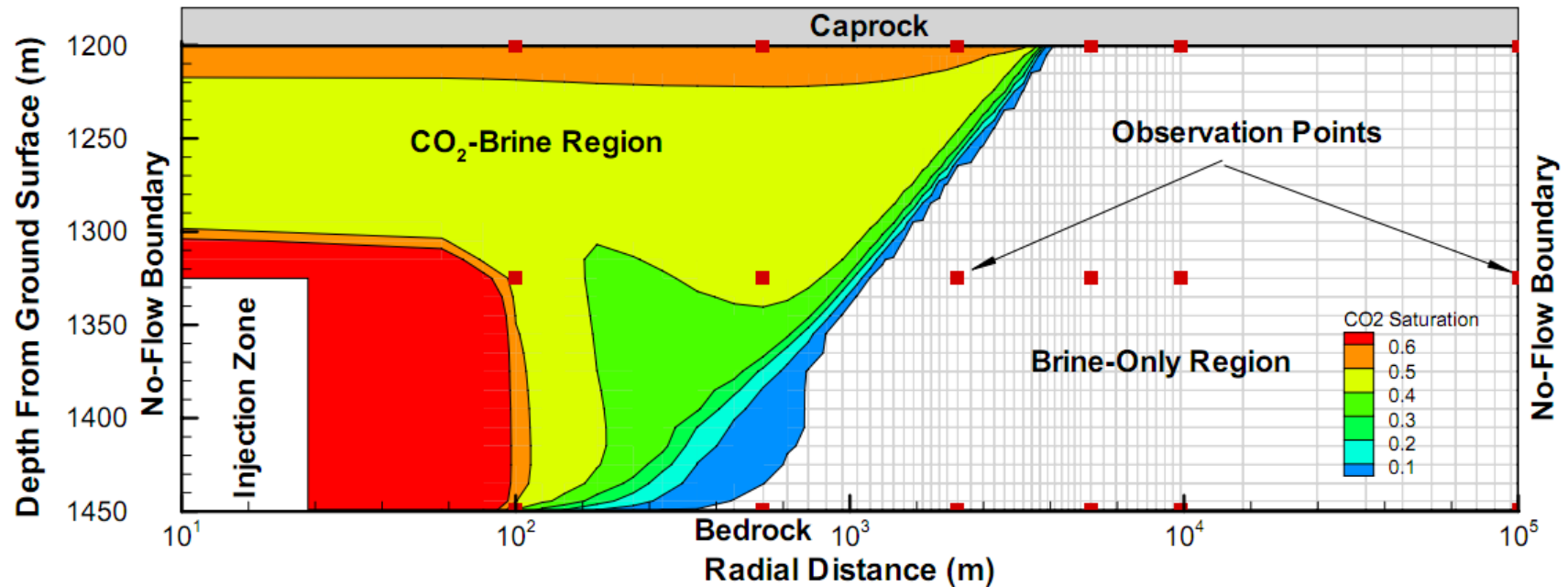
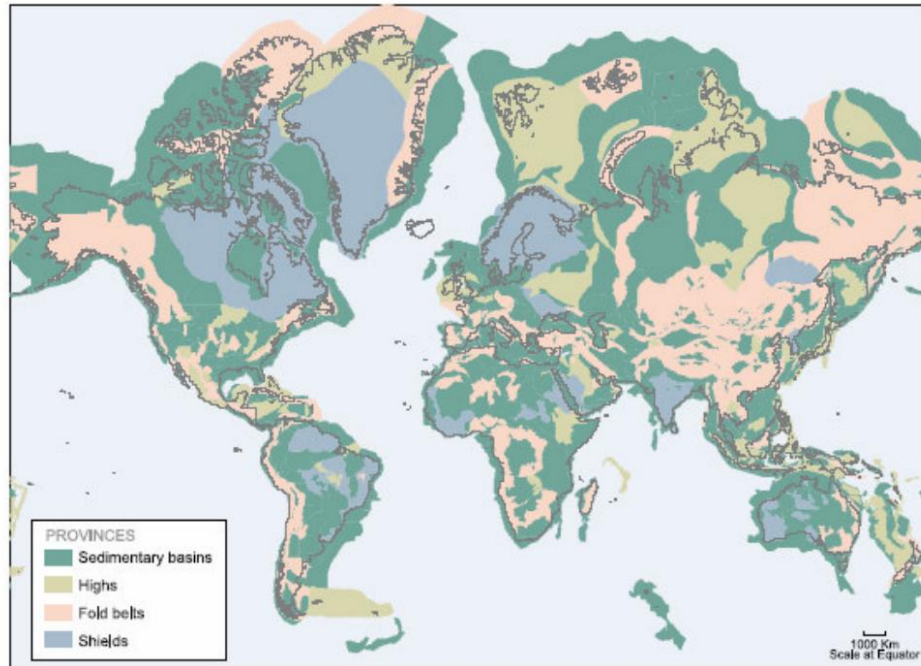


Figure 1. Schematic of the “closed” deep brine aquifer for CO<sub>2</sub> injection, with numerical mesh and observation points for the transient features of the aquifer in response to the CO<sub>2</sub> injection. The figure shows a large target formation with a radial extent of 100 km.

- Large underground reservoir for storage sites

# Feasibility of CO<sub>2</sub> storage in brine

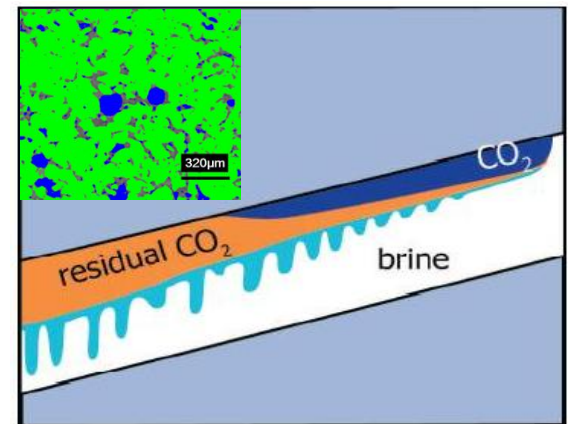


## ■ Possible storage sites

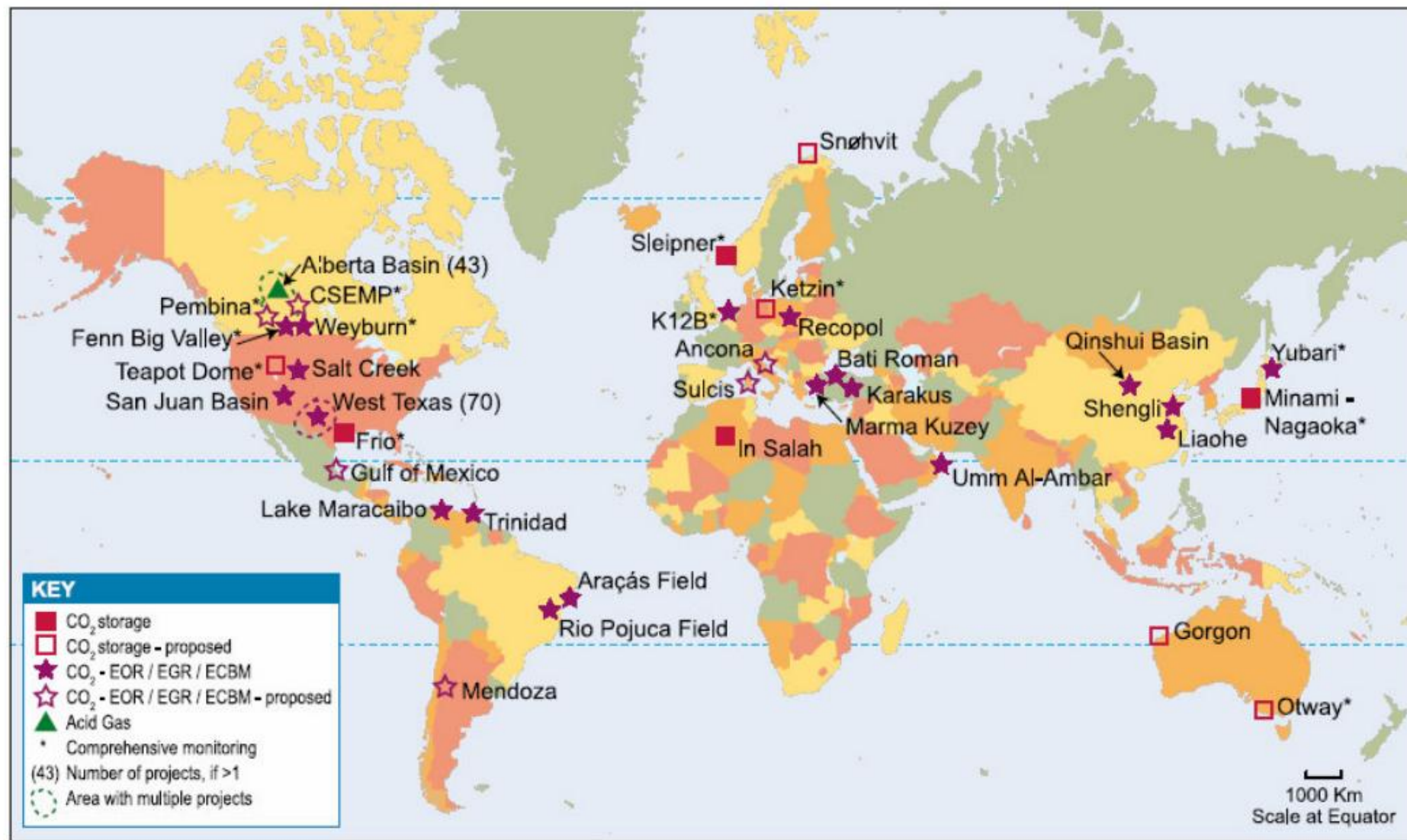
1. sedimentary basins
2. Fold belts
3. Highs
4. Shield areas

## ■ Fundamental questions

- How can you be sure that the CO<sub>2</sub> stays underground?
- How much CO<sub>2</sub> can be stored?
- In what form is CO<sub>2</sub> when stored?



# Locations of CO<sub>2</sub> storage sites





# Introduction

For Monitoring, Verification and Accounting (MVA) of CO<sub>2</sub> sequestration. need to measure the Dissolved Inorganic Carbons (DIC) in underground brine water at *higher sensitivity, lower cost, in situ, at higher frequency and over long period of time*

*Quantum Cascade Lasers (QCL) could provide Mid-IR spectroscopic measurement that could provide higher sensitivity of DIC measurement, to “quantify and resolve at high sensitivity over an extended spatial scale; improve the reliability of next-generation detection and sensing technologies; and quantify the mass of sequestered CO<sub>2</sub>, over its volume (both depth and lateral extent) and as a function of time “(technical Area #2 of the FOA).*

To interpret the results of such studies, need to predict how the Mid-IR spectra for CO<sub>2</sub> (aq, or dissolved) and HCO<sub>3</sub><sup>-</sup> change as a function of pressure, pH, temperature and salinity.

# Objectives

- Use first principles QM and ReaxFF to predict the MIR spectra of DIC species in water.
- Determine how the MIR spectra change with external conditions (temperature, pressure, salinity).
- Determine the acidity changes as a result of pressure, temperature and the presence of supercritical CO<sub>2</sub> during underground brine water carbon sequestration process.
- Provide graduate students and scientists professional training in molecular simulation to prepare them for the applications of the acquired knowledge for carbon sequestration.

# Specific Technical objectives

Simulation and identification of the Mid-IR absorption features of  $\text{CO}_2$  (aq) and  $\text{HCO}_3^-$ ;

Simulation of the Mid-IR absorption spectral changes as the pressure, pH, temperature, and salinity change;

Calculation of the resulting pH and equilibrium constants for the dissolved inorganic carbon species in brine waters under high pressure, high temperature, and high  $\text{CO}_2$  concentration conditions;

Thus illustrate chemistry reaction pathways for  $\text{CO}_2$  sequestration in underground brine water and rock cap reservoirs.



# New results: Carbonate system in aqueous solution

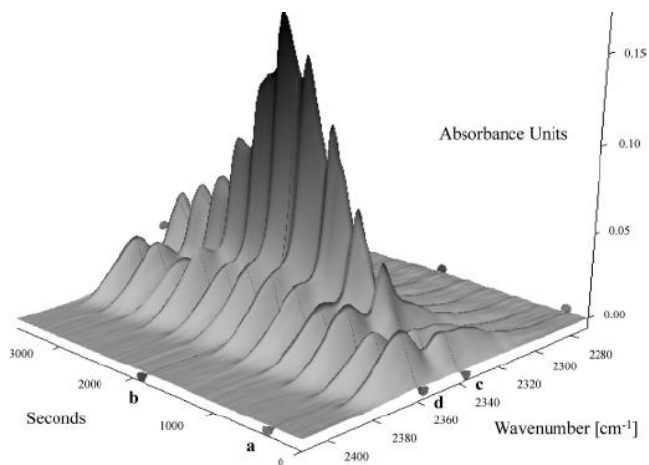
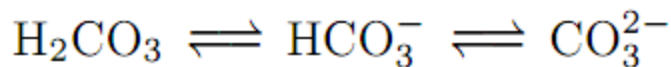
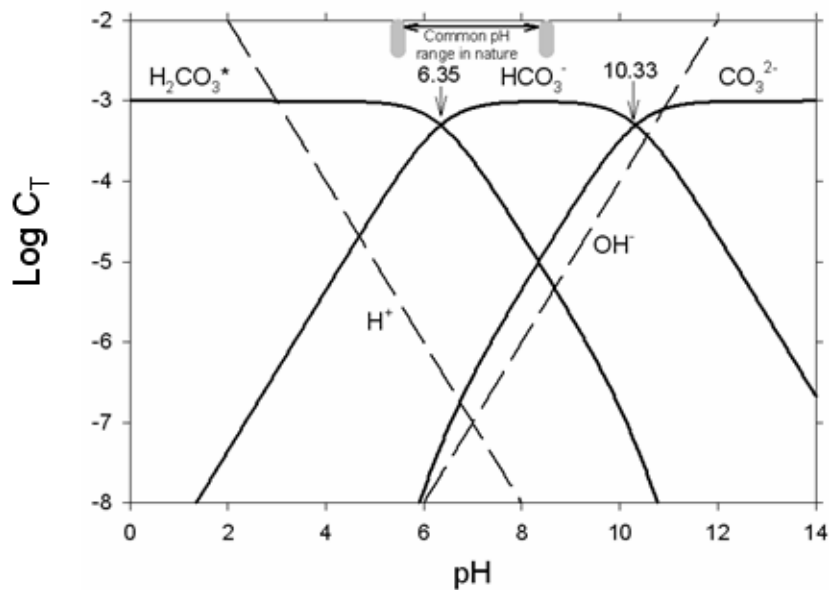


FIG. 4. FT-IR recording when analyzing the saturation process of a 1.35 g/L  $\text{CO}_2$  standard. (a) At 300 seconds the saturation with  $\text{CO}_2$  was started. (b) At 1800 seconds the solution was purged with pure nitrogen to remove the dissolved  $\text{CO}_2$ . In addition to (c) the analyte characteristic absorption band, (d) gaseous  $\text{CO}_2$  absorption bands are also visible.

## Experiments

(Sheng Wu, Caltech/PEERi)

At pressure =1 atm as function pH)

Use theory to predict how spectra changes for high pressure and Temperature

temperature	pKH	pK <sub>1</sub>	pK <sub>2</sub>	pK <sub>w</sub>
<i>fresh water</i> 5 °C	1.19	6.517	10.56	14.73
25	1.47	<b>6.35</b>	<b>10.33</b>	<b>14.00</b>
50	1.72	6.28	10.17	13.26
<i>seawater</i> 25 °C	1.54	5.86	8.95	13.20

Now use theory to predict forms of  $\text{CO}_2$  in underground brine?

# QM calculations of Vibrational Spectra of Gas-Phase CO<sub>2</sub> and H<sub>2</sub>O

DFT QM electronic structure calculations were performed, using the Jaguar 7.0 QM package and the augmented split-valence double (aug-cc-pVDZ) and triple (aug-cc-pVTZ) zeta basis set of Dunning and coworkers.

We tested the accuracy of the B3LYP, X3LYP, M06, M06-2X and M06-HF DFT functionals in predicting the vibrational frequencies of CO<sub>2</sub> and H<sub>2</sub>O in the gas phase and in implicit solvation, using the PDF module in the Jaguar 7.0 package.

All functionals gave similar performance (within 5 cm<sup>-1</sup> of each other).

We list the frequencies of the best performer (B3LYP) in Table 1. Both basis sets show reasonable agreement with experiment, with the double zeta predicting the frequencies more accurately on average.

# Frequencies H<sub>2</sub>O, CO<sub>2</sub>

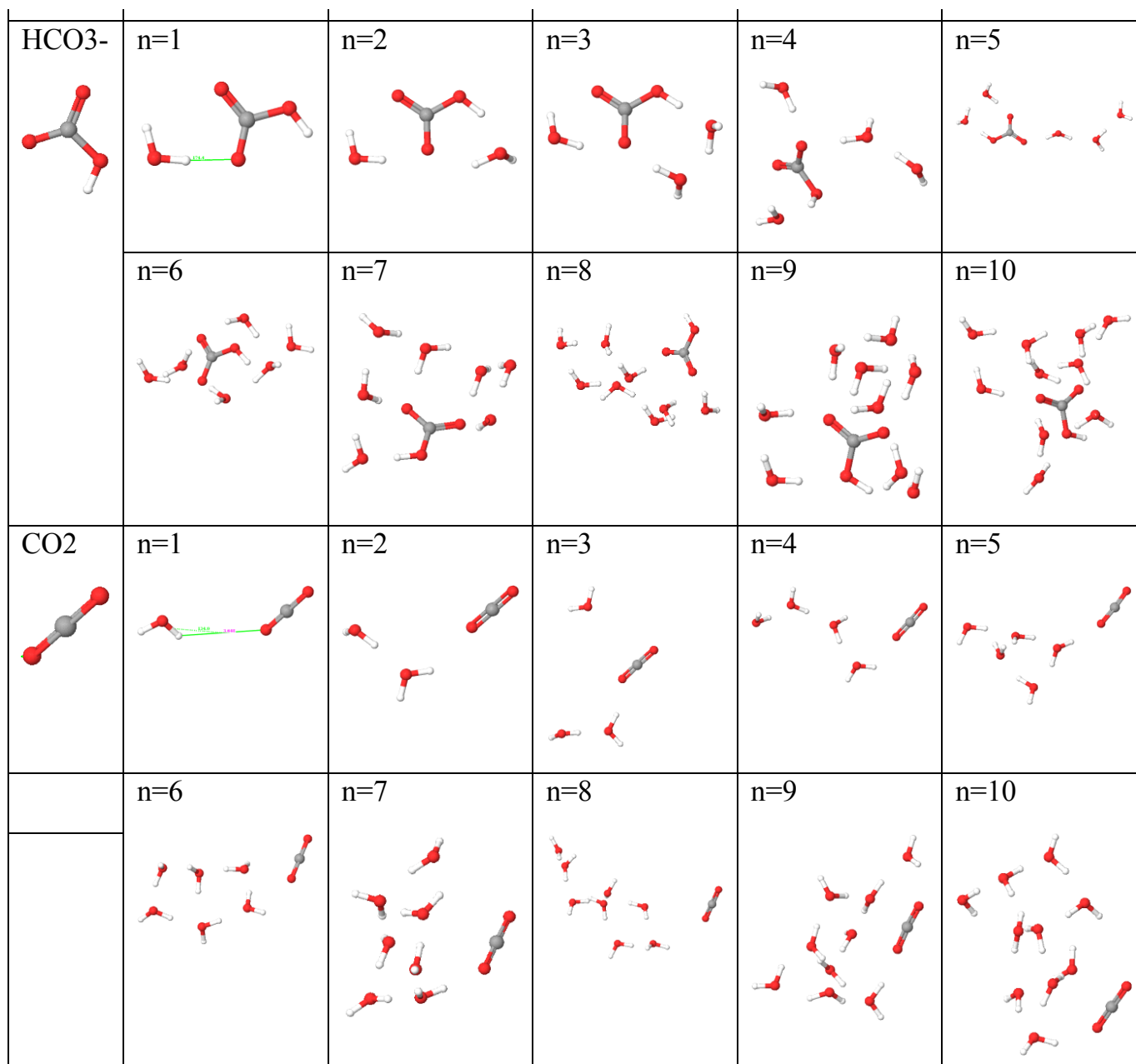
Frequencies (cm<sup>-1</sup>)

	Experiment	aug-cc-pVTZ	aug-cc-pVDZ	assignment
<b>H<sub>2</sub>O</b>		Quantum mechanics		
<b>v2</b>	1594.7	1628.4	1622.3	symmetric bending
<b>v1</b>	3657.1	3821.9	3803.3	symmetric stretch
<b>v3</b>	3756	3947.7	3937.5	antisymmetric stretch
<b>CO<sub>2</sub></b>				
<b>v2</b>	667	659	655.5	degenerate bending OCO
<b>v1</b>	1388	1325.8	1305.4	symmetric stretch OC
<b>v3</b>	2349	2401.4	2379.2	antisymmetric stretch OC

This provides a calibration for the accuracy of DFT

In practice we will use these scaling parameters to adjust predicted results for the aqueous phases under various conditions

QM calculations on the equilibrium structures for HCO<sub>3</sub><sup>-</sup> and CO<sub>2</sub> in water clusters. Use to train ReaxFF force field for large scale calculations



# Problem: Need to describe equilibrium between $\text{CO}_2$ , $\text{HCO}_3^-$ , $\text{H}_3\text{O}^+$ , $\text{CO}_3^{--}$ , etc as function of pressure and temperature

QM not handle such large systems, has problems at high Temperature

To solve this problem we developed: ReaxFF reactive force field

Describes reaction mechanisms (transition states and barriers) at ~ accuracy of QM at computation costs ~ ordinary force field MD

$$E = E^{Val} + E^{Coul} + E^{VdW}$$

Valence energy

Electrostatic energy

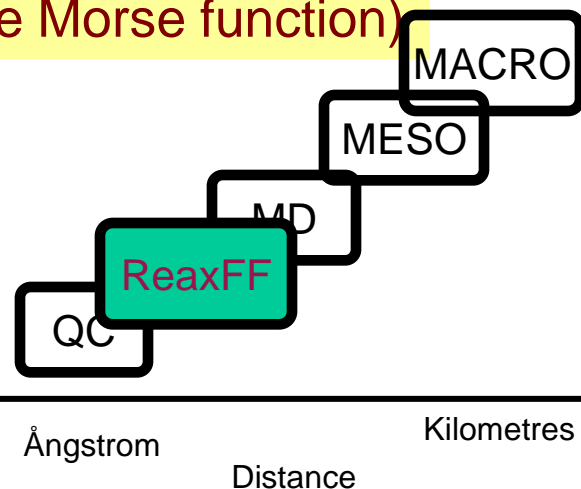
short distance Pauli Repulsion + long range dispersion

(pairwise Morse function)

years

Time

$10^{-15}$



bonds break, form smoothly

Accurate description reaction barriers.

charges change smoothly as reactions proceed

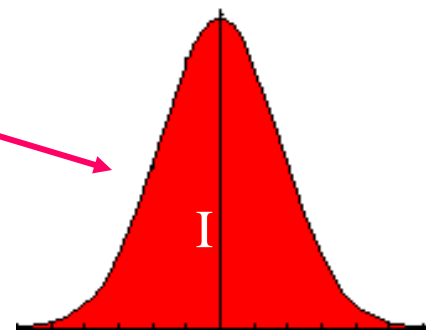
All parameters from quantum mechanics

ReaxFF describes reactive processes

for 1000s to millions of atoms

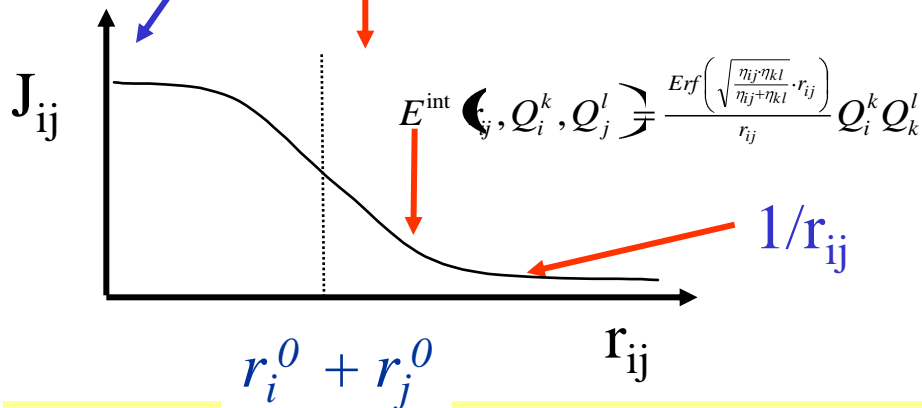
# Critical element ReaxFF: charges flow as the reactions proceed

- Self-consistent Charge Equilibration (QEq)
- Describe charges as distributed (Gaussian)
- Thus charges on adjacent atoms shielded (interactions  $\rightarrow$  constant as  $R \rightarrow 0$ ) and include interactions over ALL atoms, even if bonded (no exclusions)



- Allow charge transfer (QEq method)

$$E(\{q_i\}) = \sum_{i < j} J_{ij}(q_i, q_j, r_{ij}) + \sum_i \left( \chi_i q_i + \frac{1}{2} J_i q_i^2 \right) \quad \text{Keeping: } \sum_i q_i = Q$$



Hardness (IP-EA)

Electronegativity (IP+EA)/2

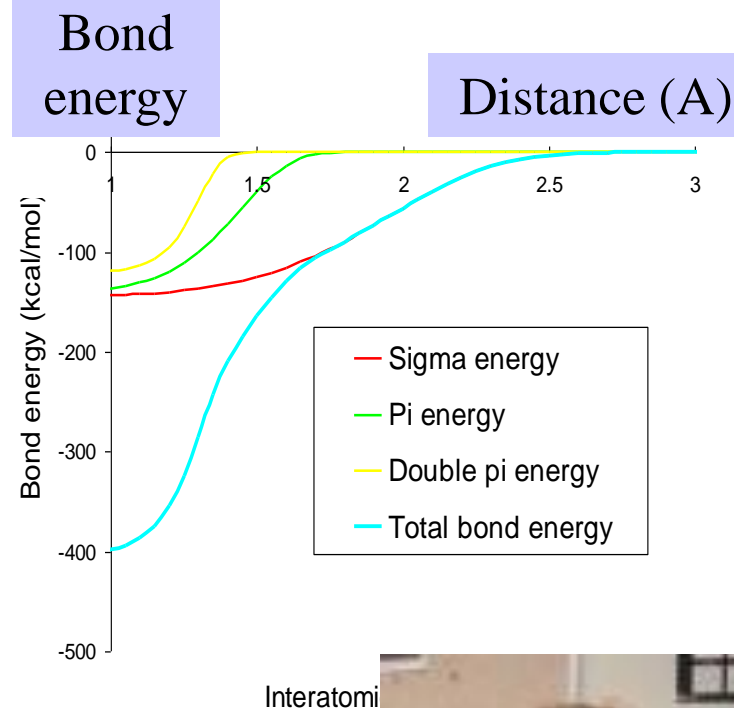
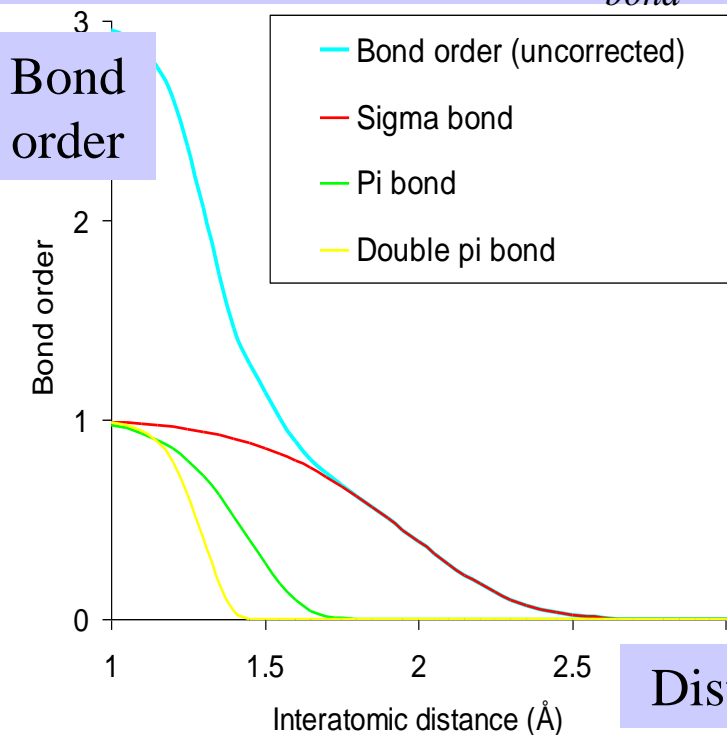
Three universal parameters for each element:  $\chi_i^o, J_i^o, R_i^o$

1991: use experimental IP, EA,  $R_i$ ; ReaxFF get from fitting QM

# Bond distance $\rightarrow$ bond order $\rightarrow$ forces

Use general functional form and determine parameters from fitting the bond breaking for many single, double, and triple bonded systems

Parameters from QM  $E_{bond} = -D_e^\sigma \cdot BO_{ij}^\sigma \cdot f(BO_{ij}^\sigma) - D_e^\pi \cdot BO_{ij}^\pi - D_e^{\pi\pi} \cdot BO_{ij}^{\pi\pi}$



## • Valence Terms ( $E^{Val}$ ) based on Bond Order: dissociates smoothly

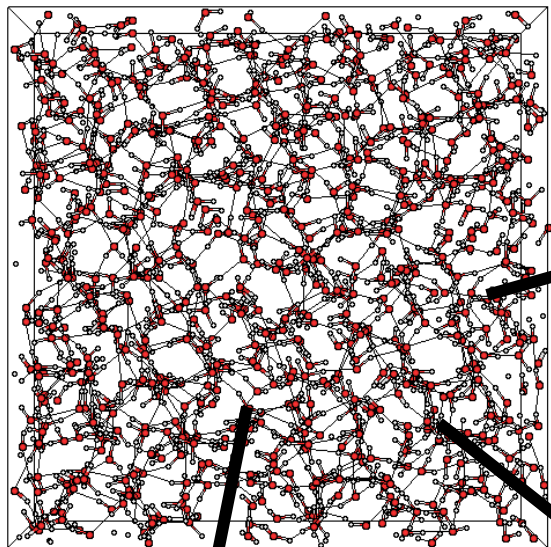
- Forces depend only on geometry (no assigned bond types)
- Allows angle, torsion, and inversion terms (where needed)
- Describes resonance (benzene, allyl)
- Describes forbidden ( $2_s + 2_s$ ) and allowed (Diels-Alder) reactions
- Atomic Valence Term (sum of Bond Orders gives valency)



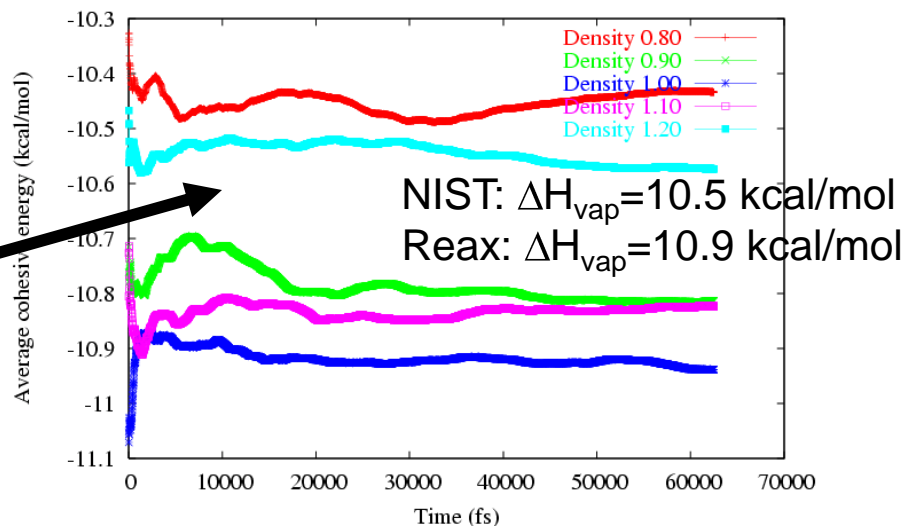


# Molecular Dynamics Test of ReaxFF for Bulk Water

800 water box

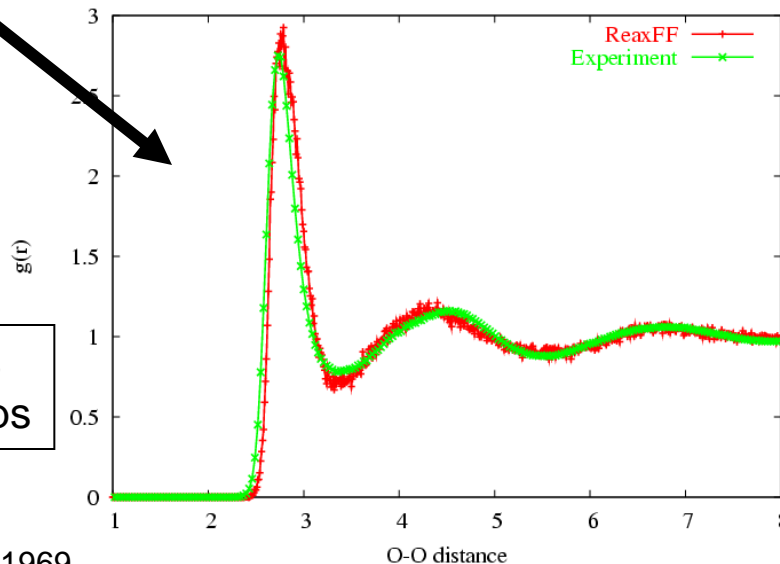
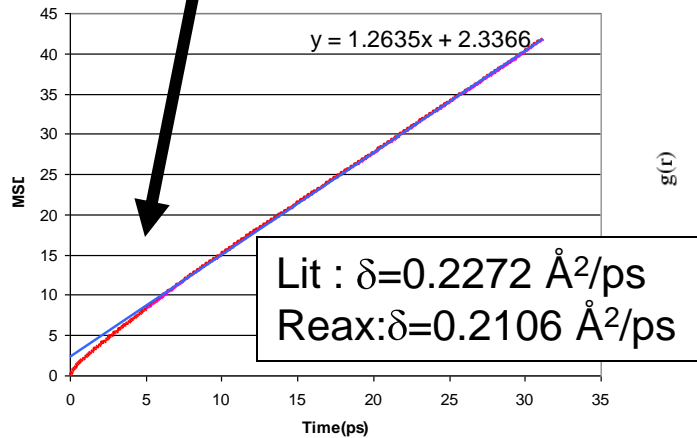


Density,  
cohesive  
energy



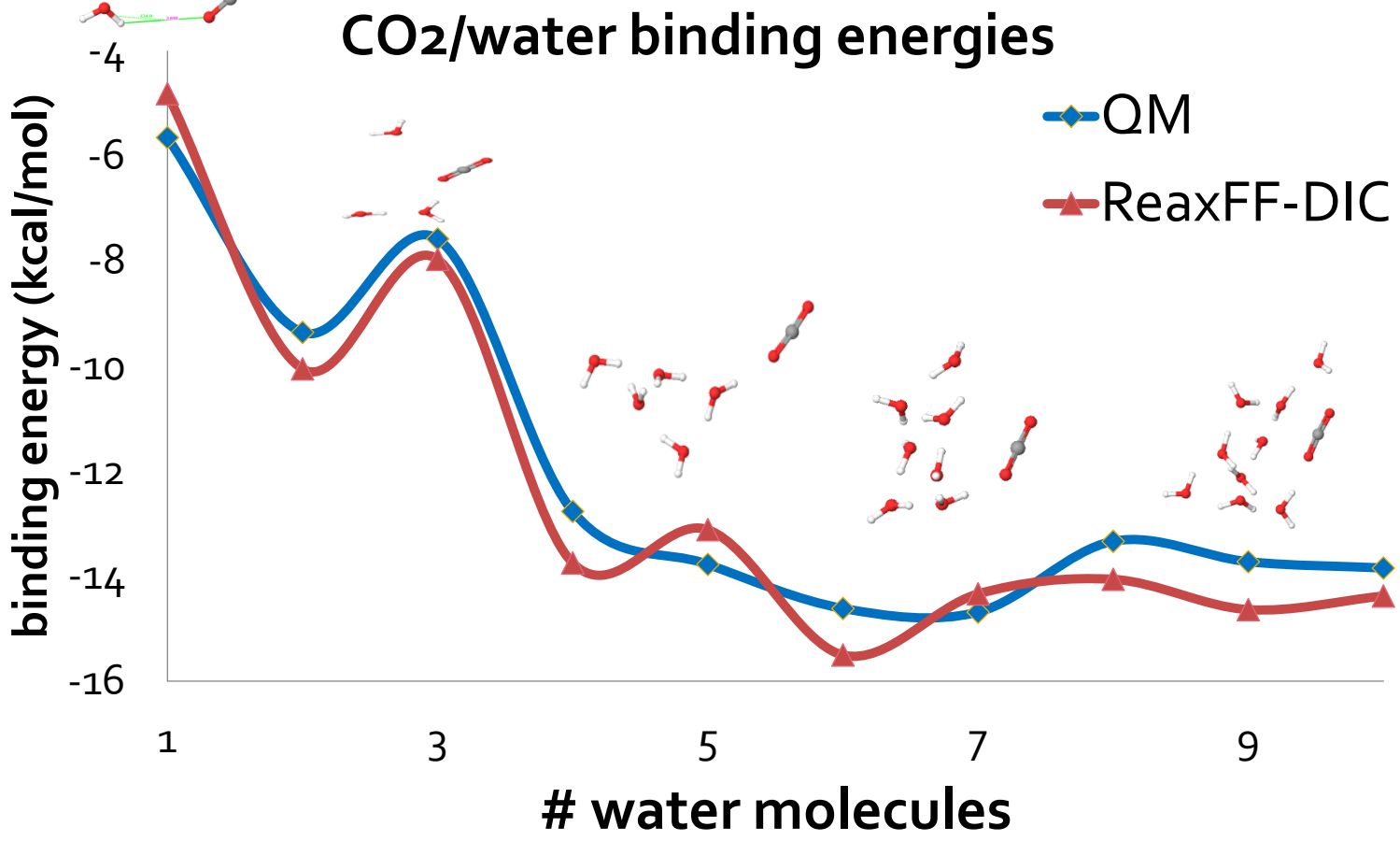
Radial  
distribution

Diffusion constant



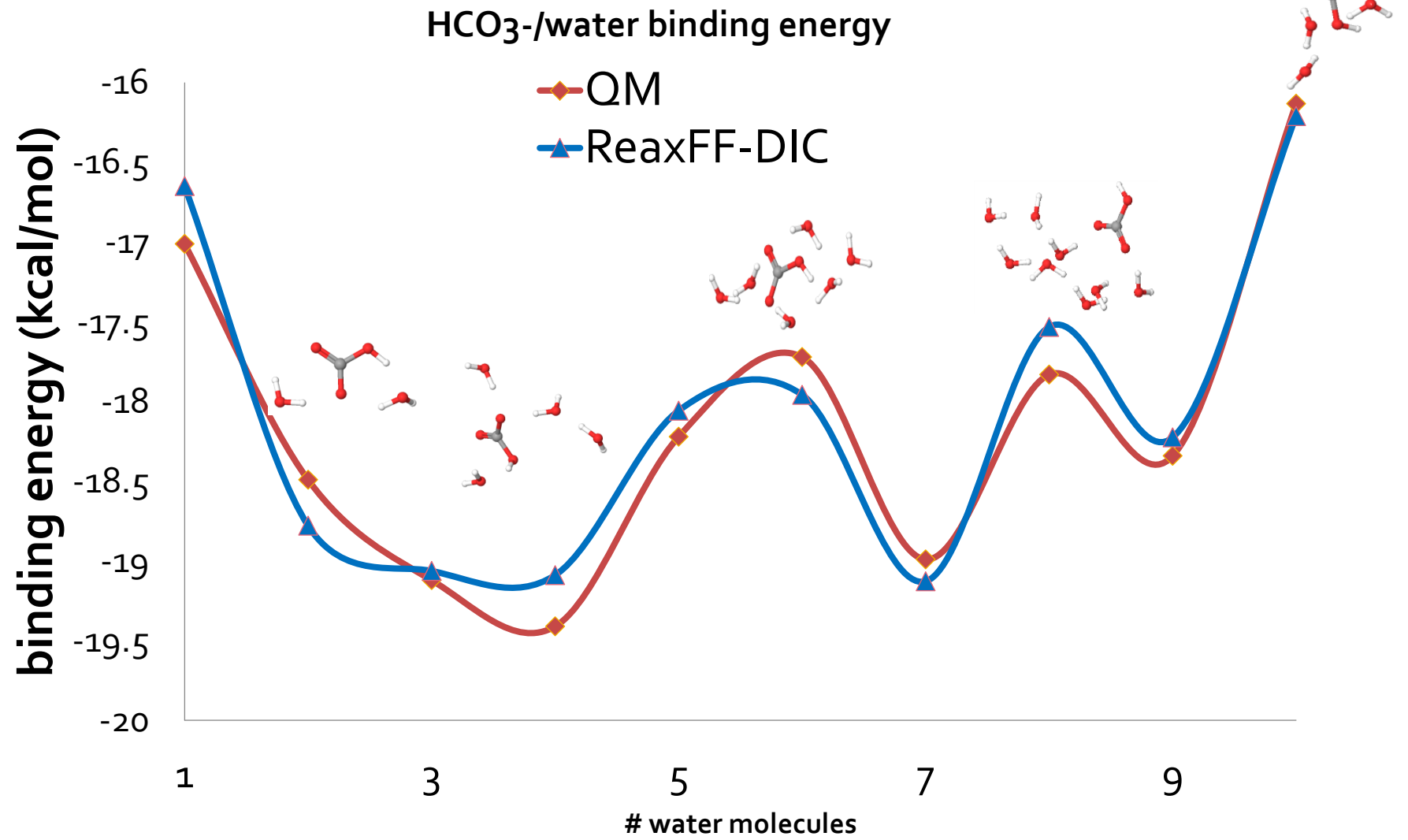
Experimental data  
from Chem. Phys.  
Special Issue vol.  
258, pp. 121-137  
(2000)

# Development of the ReaxFF-DIC forcefield for solvation CO<sub>2</sub> species in water

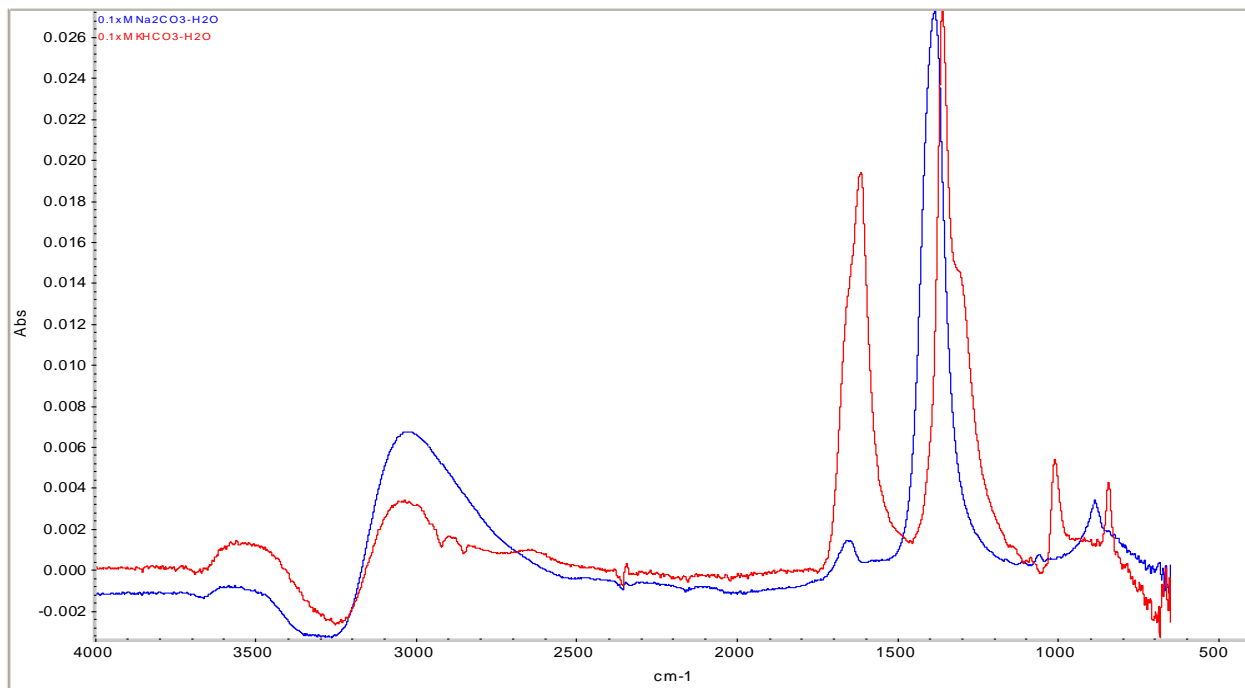




# HCO<sub>3</sub><sup>-</sup>- ReaxFF-DIC



# Comparing theory and experiments



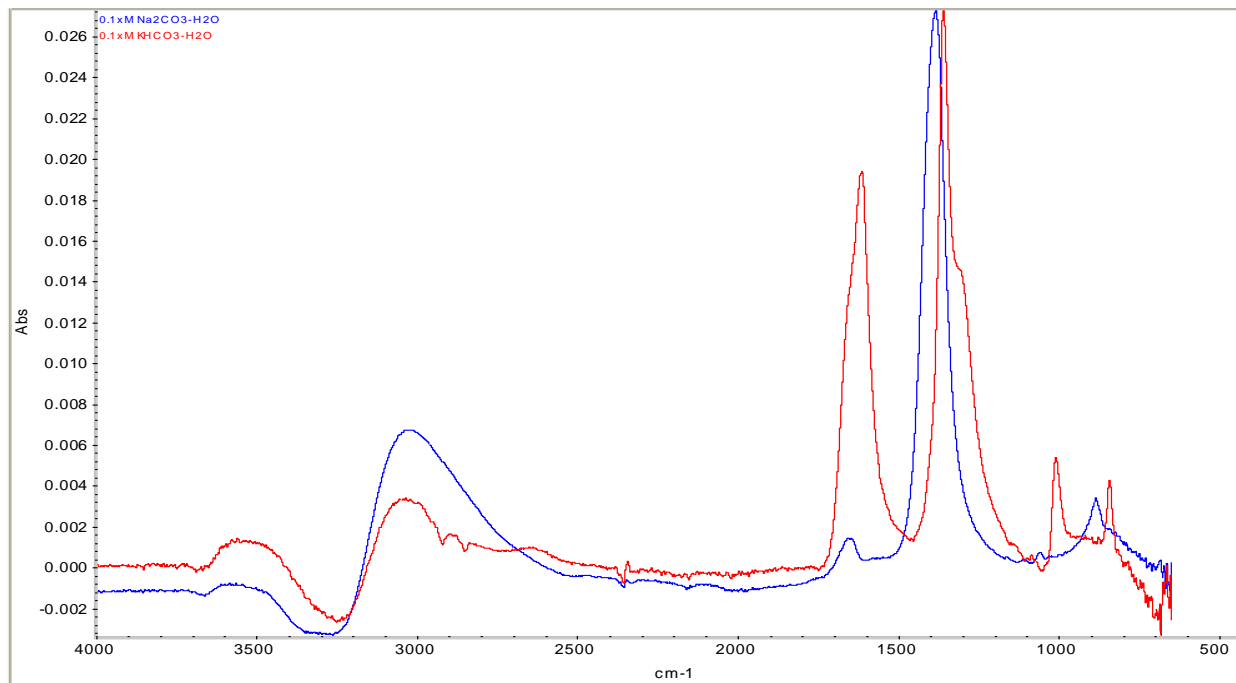
ATR module for experimental FTIR spectra measurements

Spectra of  $\sim 0.1\text{M Na}_2\text{CO}_3$  with H<sub>2</sub>O background subtracted --- Blue trace; Spectra of  $\sim 0.1\text{M KHCO}_3$  with H<sub>2</sub>O background subtracted --- Red trace.

	KHCO <sub>3</sub>					Na <sub>2</sub> CO <sub>3</sub>			
Mode	v <sub>8</sub>	v <sub>5</sub>	v <sub>4</sub>	v <sub>3</sub>	v <sub>2</sub> /H <sub>2</sub> O	v <sub>2</sub>	v <sub>1</sub>	v <sub>3</sub>	2x v <sub>2</sub>
Expt.	840	1010	1300	1360	1630	890	1060	1380	1680
Theory	878	1160	1260	1300	1588	900	1073	1290	1650

All spectra were collected with 32 averages at either 4cm<sup>-1</sup> resolution. The concentration of the HCO<sub>3</sub><sup>-</sup> and CO<sub>3</sub><sup>2-</sup> are prepared in test tube/vials, and then transferred to cotton ball tip, then acid is added to convert the HCO<sub>3</sub><sup>-</sup> and CO<sub>3</sub><sup>2-</sup> into CO<sub>2</sub>(aq) and H<sub>2</sub>CO<sub>3</sub>. So, the initial concentrations of HCO<sub>3</sub><sup>-</sup> and CO<sub>3</sub><sup>2-</sup> is accurate as prepared, while the concentration of HCO<sub>3</sub><sup>-</sup> and CO<sub>3</sub><sup>2-</sup> along with CO<sub>2</sub>(aq) and H<sub>2</sub>CO<sub>3</sub> are varying after HCl acid is applied.

We generated the spectra of ~0.1M Na<sub>2</sub>CO<sub>3</sub> with H<sub>2</sub>O background subtracted --- Blue trace; Spectra of ~0.1M KHCO<sub>3</sub> with H<sub>2</sub>O background subtracted --- Red trace (figure 5).



# Thermodynamics of liquid and super-critical Co<sub>2</sub>

Entropy, heat capacity and free energy over the phase diagram using 2PT molecular dynamics



MATERIALS AND PROCESS SIMULATION CENTER,  
CALIFORNIA INSTITUTE OF TECHNOLOGY, PASADENA, CA 91125

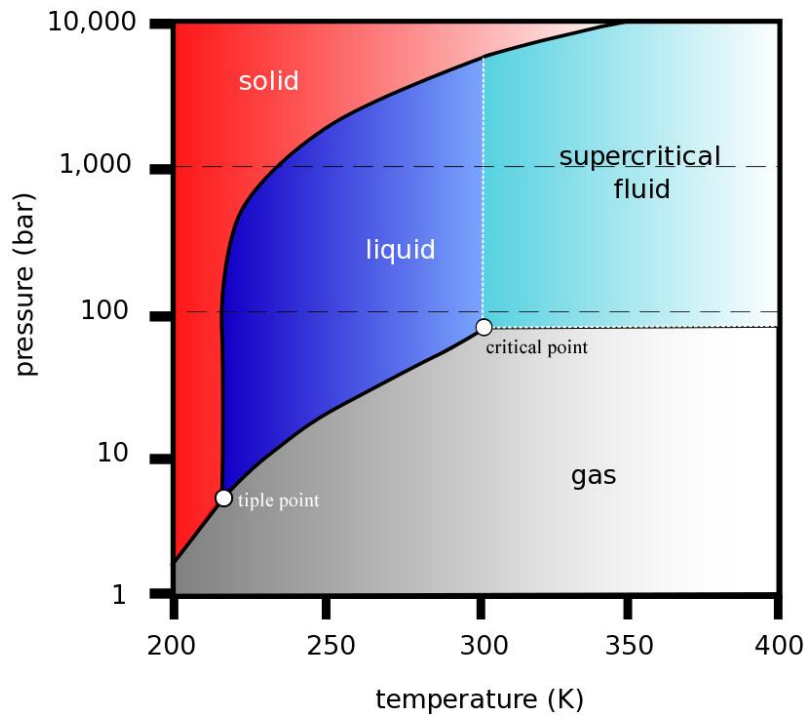




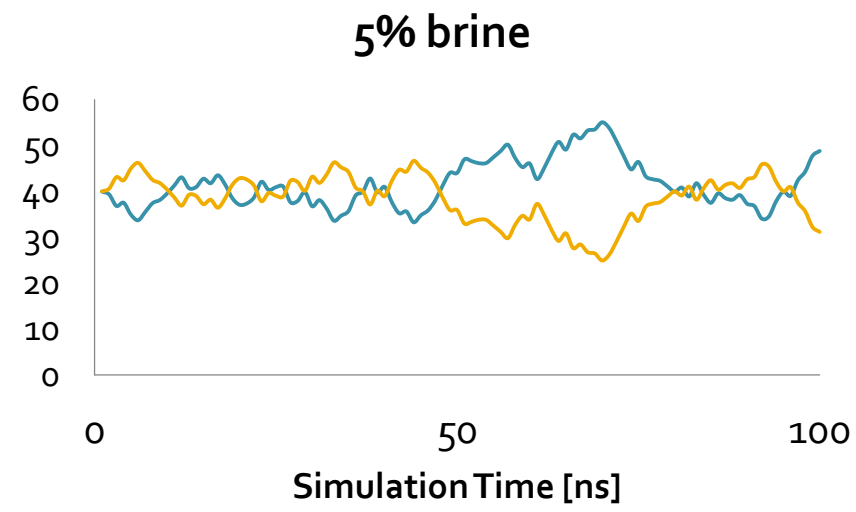
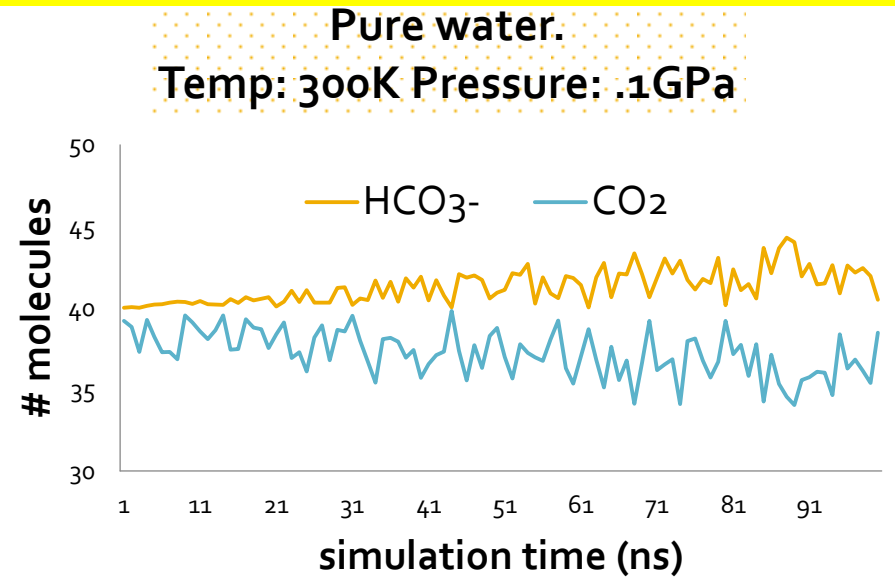
# Evolution of CO<sub>2</sub> species from ReaxFF-DIC MD

## Prediction of equilibrium constant

- Simulation setup
  - 40 CO<sub>2</sub>/HCO<sub>3</sub><sup>-</sup>
  - 2000 H<sub>2</sub>O
  - LAMMPS MD engine



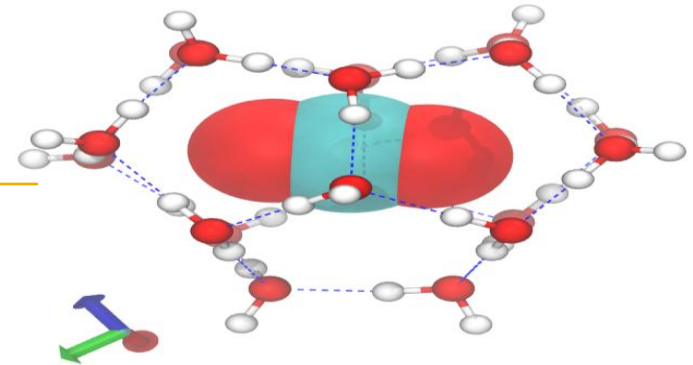
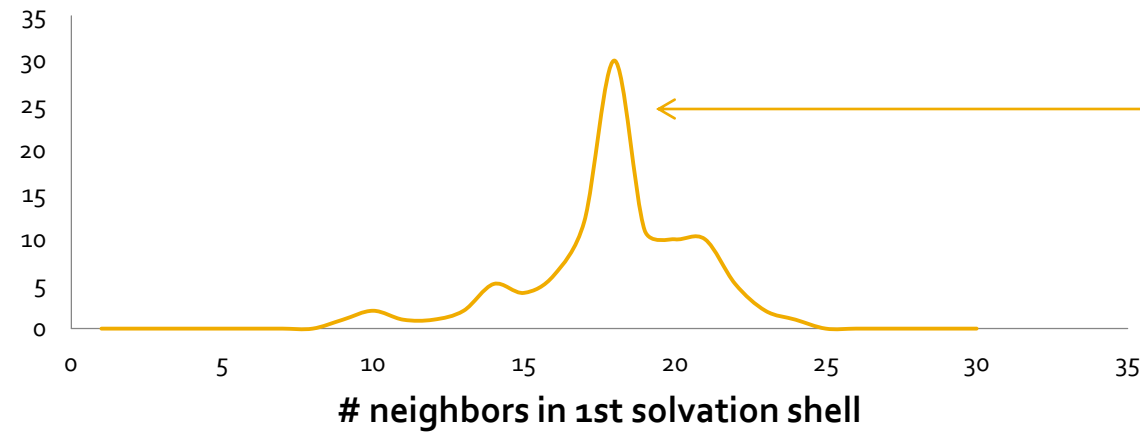
■ HCO<sub>3</sub><sup>-</sup> is stable species if injected as supercritical fluid





# Structural analysis of CO<sub>2</sub> species during MD

Average number of neighbors around CO<sub>2</sub>  
during dynamics



- “Clathrate” like CO<sub>2</sub>(H<sub>2</sub>O)<sub>18</sub> structure is most stable at 300K and 0.1GPa



# How much CO<sub>2</sub> can be stored in brine from theory?

## Methods of calculating partition coefficients

- Scatchard-Hildebrand theory

$$\ln K = \frac{V_i}{RT} [(\delta_a - \delta_i)^2 - (\delta_o - \delta_i)^2] + \ln \frac{V_a}{V_o}$$

solubility in solvent

partition coefficient

- **Limitation:** Unknown solubility parameters in brine/high T,P

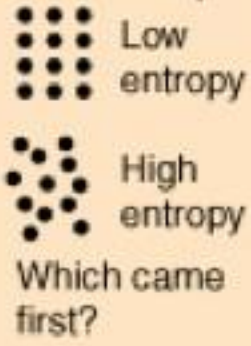
- Theory: Grand Canonical MD Simulations
- Theory New approach: Partition Coefficients from free energy extracted from short MD

$$\ln(K)_{P,T} = \Delta G/RT$$

# Calculations of free energy

$$\Delta G_t = \Delta H_t - T\Delta S_t$$

$\Delta H$  is straightforward from MD, how do we get  $\Delta S$ ?

<u>Entropy</u> :	a state variable whose change is defined for a reversible process at T where Q is the heat absorbed.	$\Delta S = \frac{Q}{T}$ 
Entropy:	a measure of the amount of energy which is unavailable to do work.	
<u>Entropy</u> :	a measure of the disorder of a system.	
<u>Entropy</u> :	a measure of the multiplicity of a system.	

All correct but how do we compute it?

# need to calculate free energies and entropy

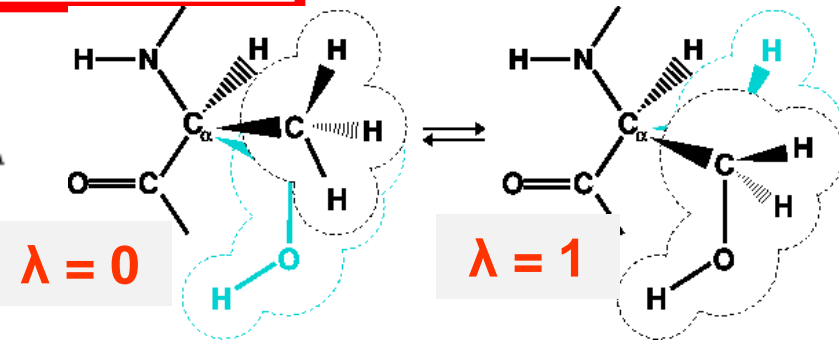
General approach to predict Entropy,  $S$ , and Free Energy

Free Energy,  $F = U - TS = -k_B T \ln Q(N, V, T)$

Tolman Kirkwood **thermodynamic integration**

$$F(\lambda = 1) - F(\lambda = 0) = \int_{\lambda=0}^{\lambda=1} d\lambda \left\langle \frac{\partial U(\lambda)}{\partial \lambda} \right\rangle_{\lambda}$$

J. G. Kirkwood. Statistical mechanics of fluid mixtures, J. Chem. Phys., 3:300-313, 1935



However enormous computational cost required for complete sampling of the thermally relevant configurations of the system often impractical for realistic systems.  
Additional complexities, choice of the appropriate approximation formalism or somewhat ad-hoc parameterization of the “reaction coordinate”

# Thermodynamic Integration

The reaction is divided into windows with a specific value  $\xi_i$  assigned to each window.

$$\Delta A_{a \rightarrow b} = \int_{\xi_a}^{\xi_b} \left\langle \frac{\partial E}{\partial \xi} \right\rangle_{\xi'} d\xi' = \int_{\xi_a}^{\xi_b} \langle F_c \rangle_{\xi'} d\xi'$$

with an additional term correcting for incomplete momentum sampling, the metric-tensor correction

Not practical for brine solutions

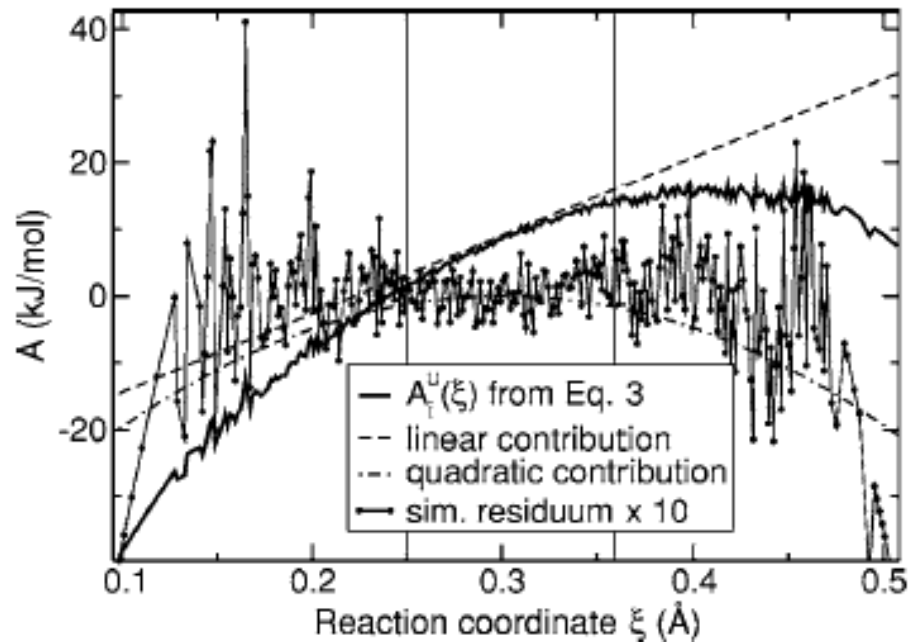


FIG. 2. The first terms of the power series of  $A_i^u(\xi)$  obtained from one window of the biological example PHBH (Sec. III). For details see Fig. 1.

# New approach: Get Density of states from the Velocity autocorrelation function

## Velocity autocorrelation function

$$C(t) = \sum_{j=1}^N \sum_{k=1}^3 m_j \left[ \lim_{\tau \rightarrow \infty} \frac{1}{2\tau} \int_{-\tau}^{\tau} v_j^k(t' + t) v_j^k(t') dt' \right]$$

## DoS( $\nu$ ) is the vibrational density of States

$$\text{DoS}(\nu) = \frac{2}{kT} \sum_{j=1}^N \sum_{k=1}^3 m_j s_j^k(\nu) = \frac{2}{kT} \lim_{\tau \rightarrow \infty} \int_{-\tau}^{\tau} C(t) e^{-i2\pi\nu t} dt.$$

## Calculate entropy from DoS( $\nu$ )

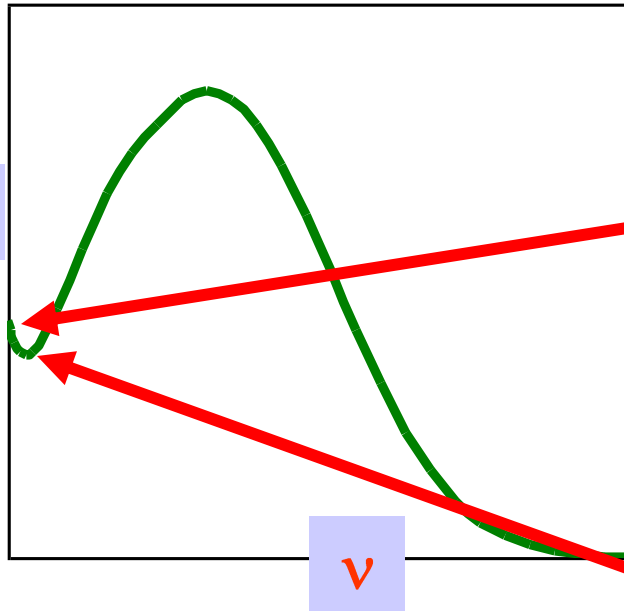
$$S = k \ln Q + \beta^{-1} \left( \frac{\partial \ln Q}{\partial T} \right)_{N,V} = k \int_0^{\infty} d\nu S(\nu) \underbrace{\frac{\beta h \nu}{\exp(\beta h \nu) - 1}}_{\text{zero}} - \ln \underbrace{[1 - \exp(-\beta h \nu)]}_{\text{zero}}$$

**zero**
**zero**

**Problem: as  $\nu \rightarrow 0$  get  $S \rightarrow \infty$  unless  $\text{DoS}(0) = 0$**

# Problem with Liquids: $S(0) \neq 0$

DoS( $\nu$ )



Finite density of states at  $\nu = 0$

Proportional to diffusion coefficient

$$S(0) = \frac{2}{kT} \int_{-\infty}^{\infty} C(t) dt = \frac{12mND}{kT}$$

where  $D$  is the diffusion coefficient

$N$  = number of particles

$M$  = mass

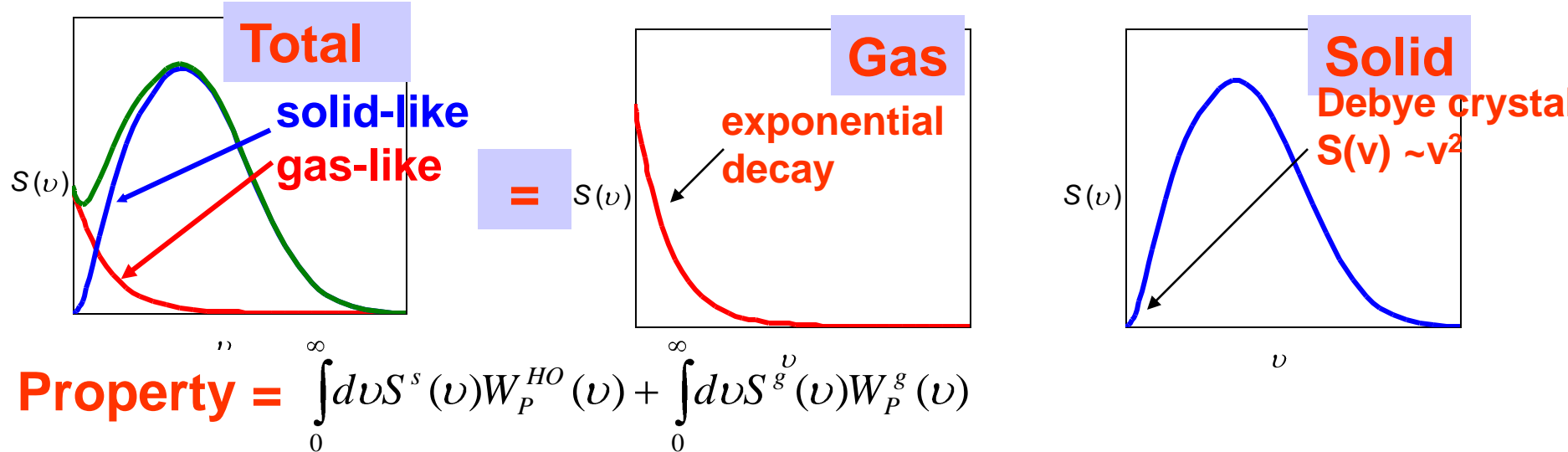
Also strong anharmonicity at low frequencies

The two-phase model for calculating thermodynamic properties of liquids from molecular dynamics: Validation for the phase diagram of Lennard-Jones fluids; Lin, Blanco, Goddard; JCP, 119:11792(2003)



# New method Two-Phase Thermodynamics Model (2PT)

- Decompose liquid DoS( $\nu$ ) to a gas and a solid contribution
- **DoS( $\nu$ )<sub>total</sub> = DoS( $\nu$ )<sub>gas</sub> + DoS( $\nu$ )<sub>solid</sub>**
- S(0) attributed to gas phase diffusion
- Gas component contains small  $\nu$  anharmonic effects
- Solid component contains quantum effects



The two-phase model for calculating thermodynamic properties of liquids from molecular dynamics: Validation for the phase diagram of Lennard-Jones fluids; Lin, Blanco, Goddard; JCP, 119:11792(2003)

# Diffusional gas-like phase

Describe diffusional gas-like component as hard sphere fluid.  
velocity autocorrelation function of hard sphere gas decays exponentially

$$c^{HS}(t) = c^{HS}(0) \exp(-\alpha t) = \frac{3kT}{m} \exp(-\alpha t)$$

$\alpha$  is Enskog friction constant  $\sim$  collisions between hard sphere

$$S^{HS}(\nu) = \frac{4}{kT} \int_0^\infty \sum_{j=1}^{N^g} \sum_{k=1}^3 m_j c_j^k(t) \cos(2\pi\nu t) dt = \frac{4}{kT} \int_0^\infty 3N^g kT \exp(-\alpha t) \cos(2\pi\nu t) dt$$

$$S^{HS}(\nu) = \frac{12N^g \alpha}{\alpha^2 + 4\pi^2 \nu^2}$$

$Ng = fN$  is number effective hard sphere particles in system

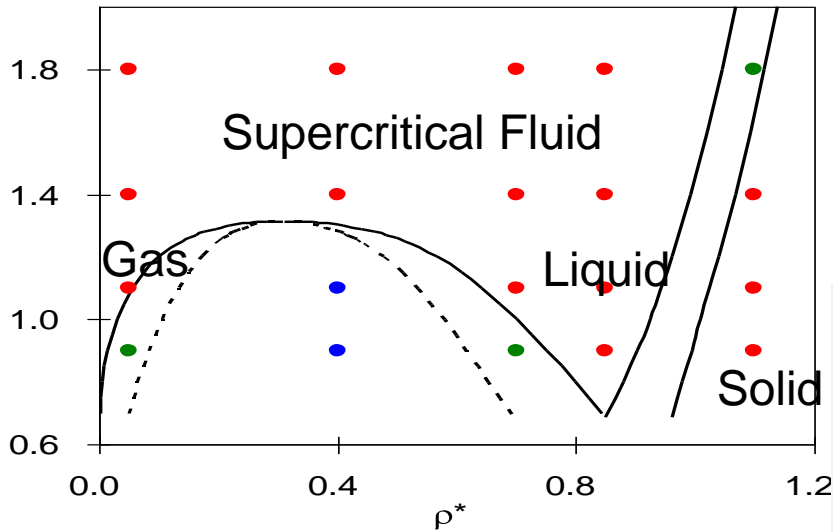
$f$  = fractional hard sphere component in overall system.

Measures “fluidicity” of the system (depends on both temperature and density).

From MD, fit small  $n$  to Hard Sphere model  $\rightarrow S(0)$  and  $f$

# Validation of 2PT Using Lennard-Jones Fluids

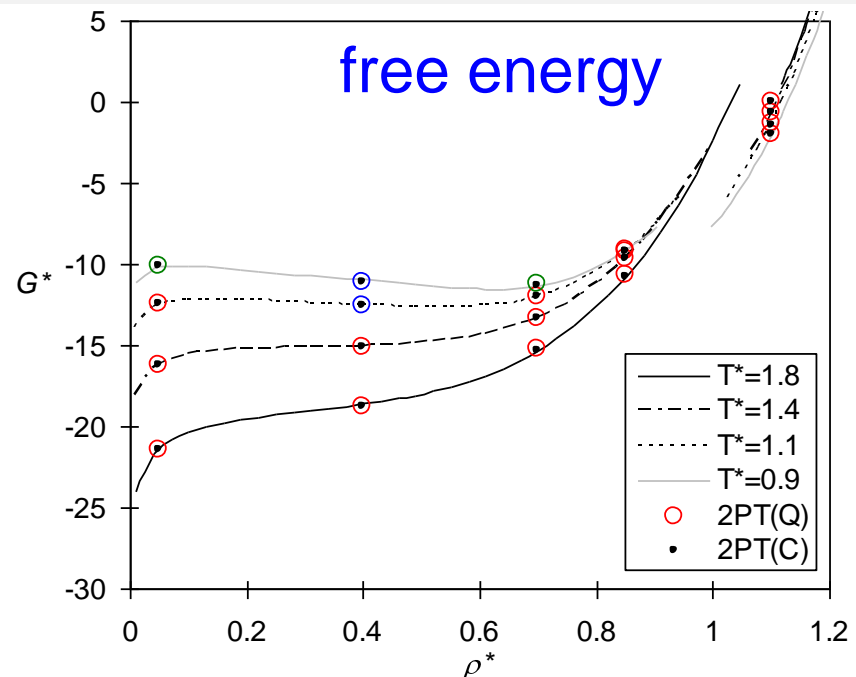
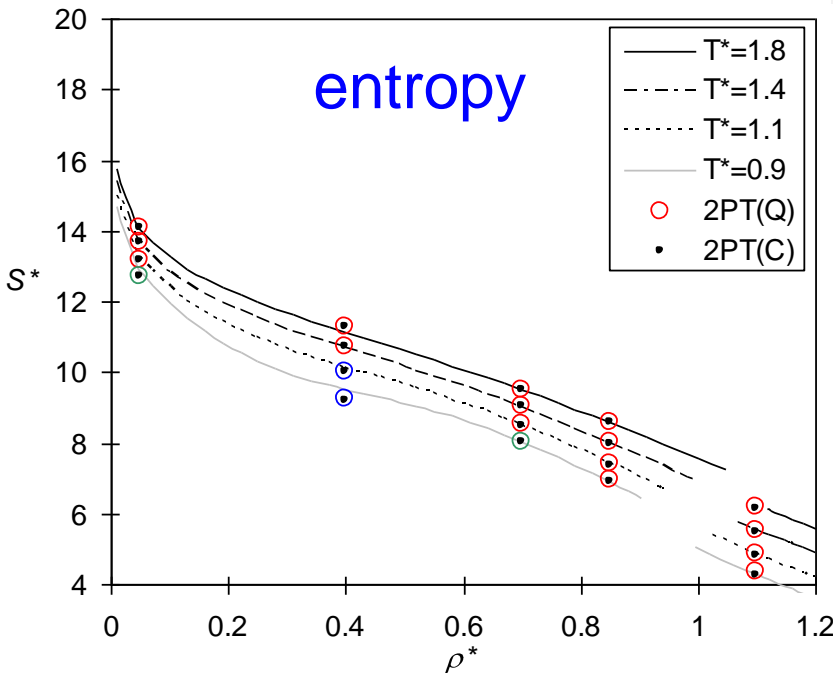
T -  $\rho$  diagram for Lennard Jones Fluid



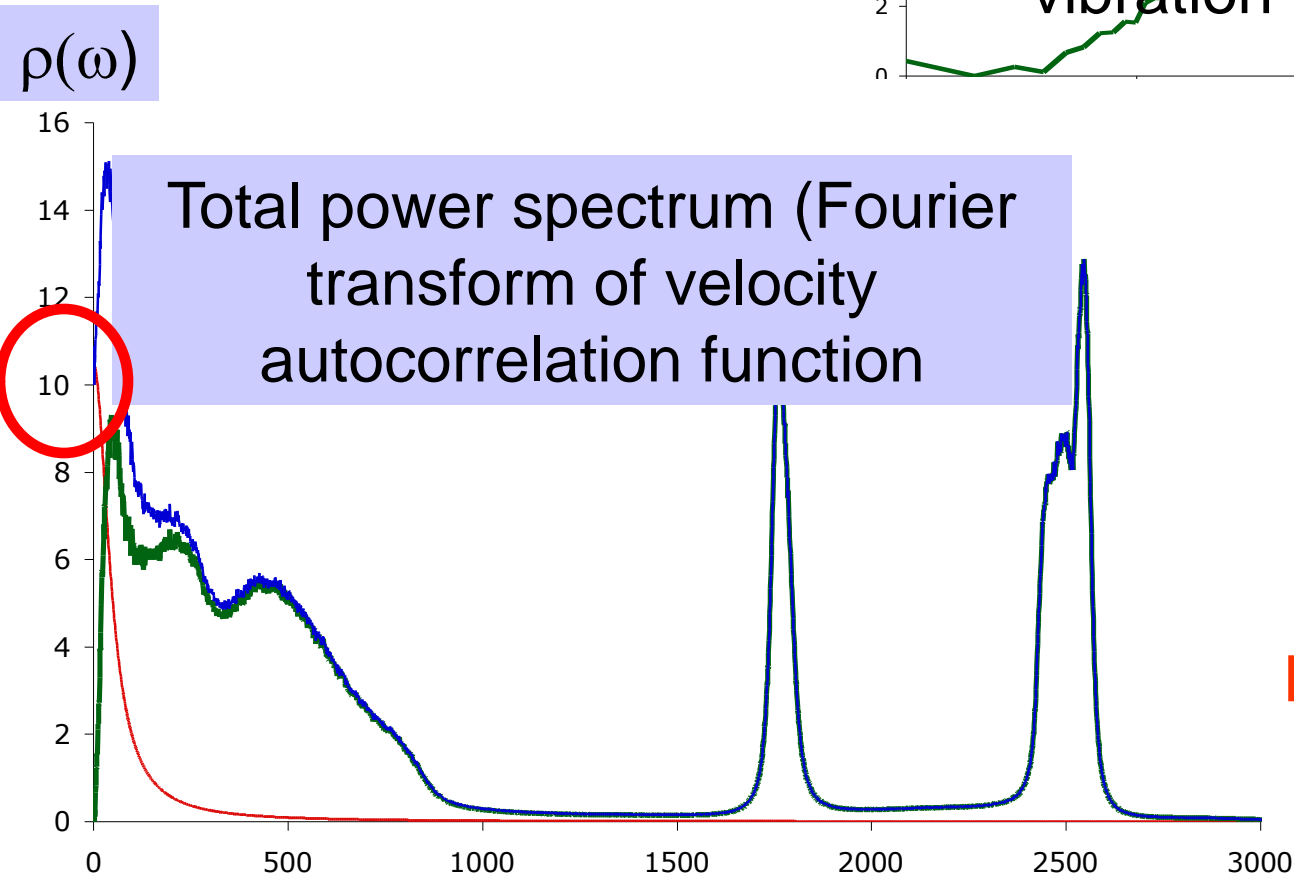
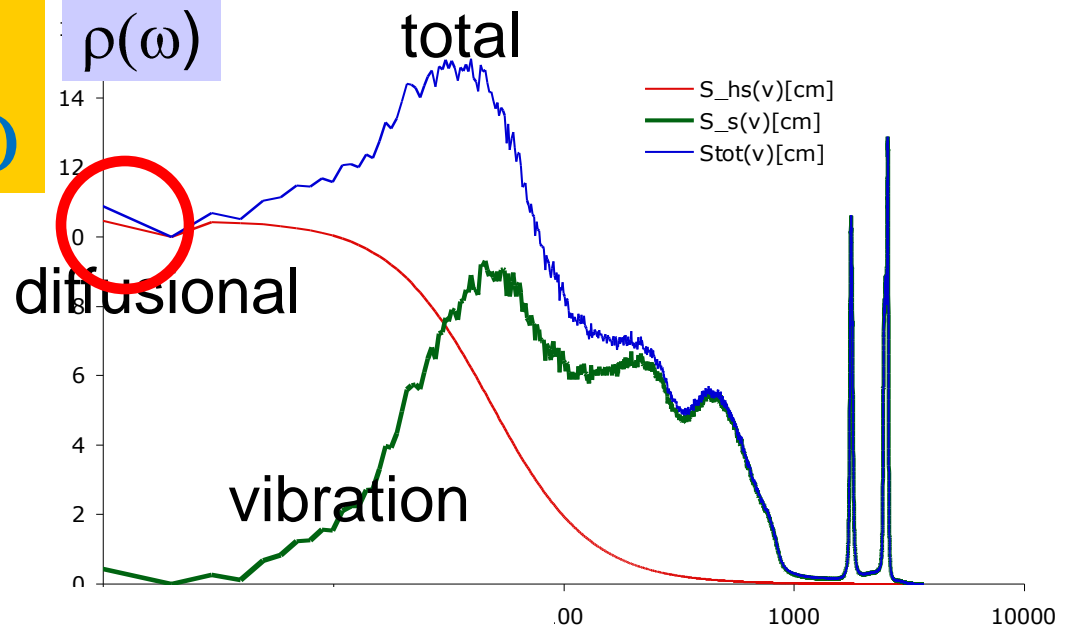
- stable
- metastable
- unstable

Get essentially exact  $G$  and  $S$  for all phases (liquid, gas, solid, supercritical, unstable)

The two-phase model calculating thermodynamic properties of liquids from MD: Validation for phase diagram of Lennard-Jones fluids; Lin, Blanco, Goddard; JCP, **119**:11792(2003)



# Example 2PT decomposition for H<sub>2</sub>O



# Entropy of water box (F3C water)

Iteration	s_solid	s_liquid	s_total	sq/molecule	Volume	Density
1	26306.42	29263.86	55570.29	69.46285763	24504.28	0.975681
2	29171.87	26448.94	55620.8	69.52600088	23907.47	1.000037
3	28149.65	27416.01	55565.66	69.45707063	24350.23	0.981853
4	27695.09	28090.08	55785.18	69.73146913	24708.74	0.967607
5	28518.58	27110.11	55628.69	69.53585838	24546.61	0.973998
6	27281.02	28656.05	55937.07	69.92133425	24536.97	0.974381
7	25557.95	29920.17	55478.12	69.347647	24771.36	0.965161
8	28725.58	27031.59	55757.17	69.69646113	24393.49	0.980112
9	28970.64	26858.49	55829.14	69.786419	24647.06	0.970028
10	27409.63	28214.45	55624.08	69.53010463	24353.55	0.981719
Average	27778.64	27900.98	55679.62	69.59952226	24471.98	0.977058
Std Dev	1175.371	1127.951	141.6069	0.177008662	245.1435	0.009893

- Theory: 69.6 +/- 0.2 J/K\* $\text{mol}$
- Experimental Entropy: 69.9 J/K\* $\text{mol}$  (NIST)

Statistics collected over 20ps of MD , no additional cost

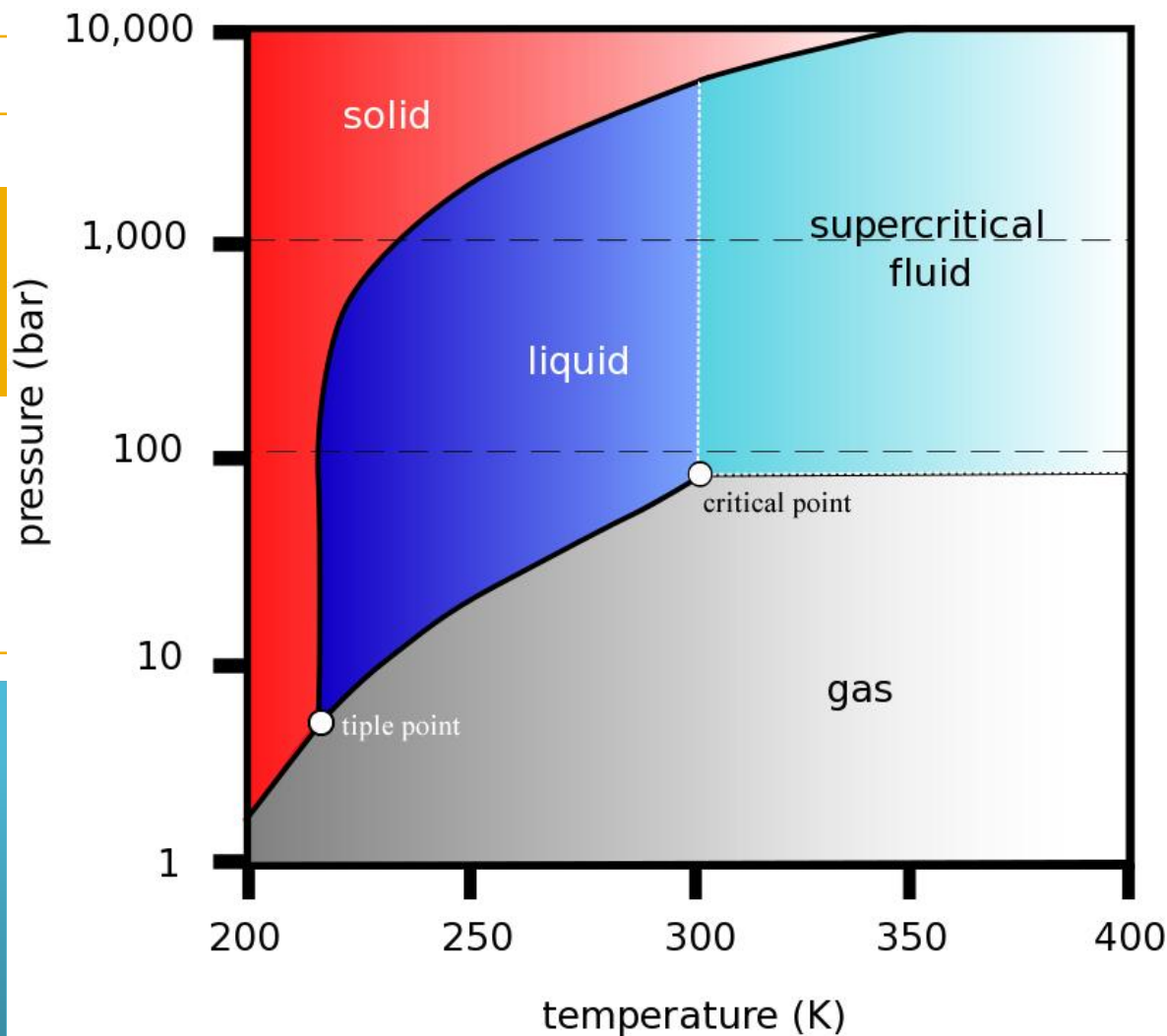
# CO<sub>2</sub> Phase Diagram

## Physical Properties

Molar mass	44.010 g/mol
Appearance	colorless, odorless gas
Density	1.562 g/mL (solid/1 atm/195K) 0.770 g/mL (liquid/56 atm/293K) 1.977 g/L (gas /1 atm/273K) 849.6 g/L (supercritical/150 atm/305K)
Melting point	194.7 K
Boiling point	216.6 K (at 5.185 bar)
Solubility in water	1.45 g/L at 300K/1 bar
Acidity (pKa)	6.35, 10.33
Viscosity	0.07 cP/195K
Dipole moment	0

### Issues with current approaches

- CPMD simulations (32 molecules) too small to describe phase behavior
- Rigid empirical models give inaccurate super-critical behavior
- Flexible empirical model not fit to thermodynamic properties

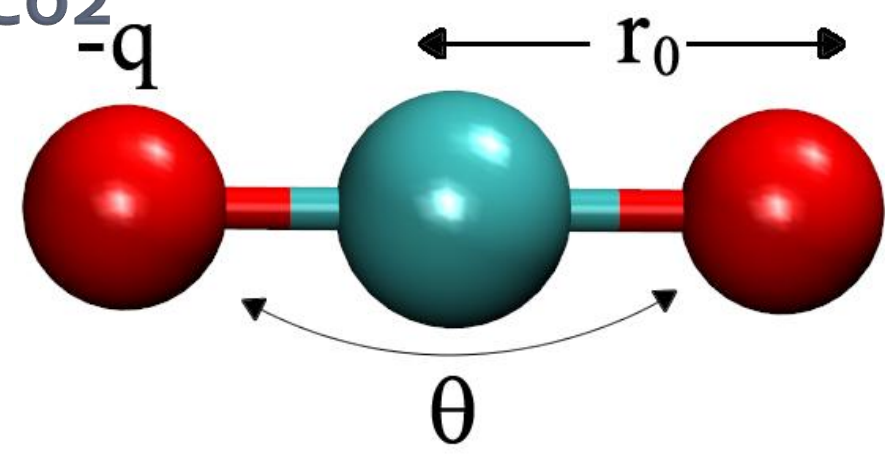
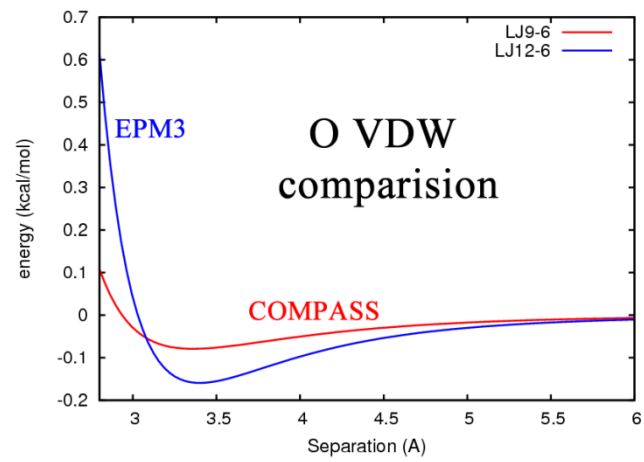


Needs accurate forcefields that accounts for physical and thermodynamic properties





# Empirical forcefields for Co<sub>2</sub>



## Critical Properties

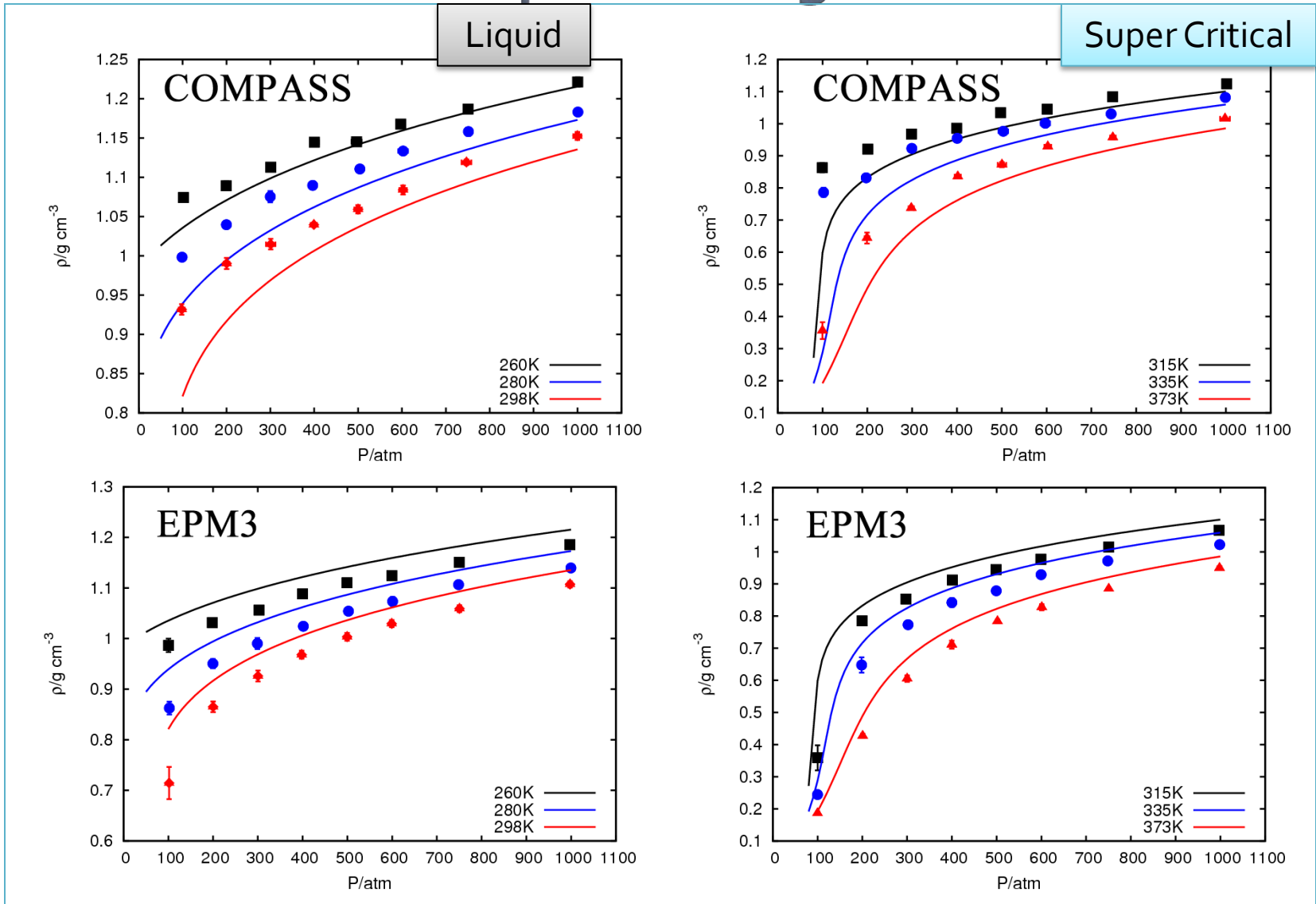
	$\epsilon_C$	$\sigma_C$	$\epsilon_O$	$\sigma_O$	$\alpha$	$q_C$	$r_0$	$T_c$ (K)	$\rho_c$ (g/cm <sup>3</sup> )	$P_c$ (MPa)
<sup>1</sup> MSM	0.058	2.785	0.165	3.01	-	0.596	1.160	304.9	0.4642	7.17
<sup>2</sup> EPM <sub>2</sub>	0.056	2.757	0.160	3.03	-	0.651	1.149	303.2	0.4664	7.07
<sup>3</sup> EPM <sub>3</sub>	0.056	2.800	0.160	3.03	-	0.652	1.162	304.0	0.4679	7.39
<sup>4</sup> TraPPE	0.054	2.800	0.157	3.05	-	0.700	1.160	309.1	0.462	7.2
<sup>5</sup> Errington*	0.058	2.753	0.165	3.03	14	0.647	1.143	302.5	0.4728	7.31
<sup>6</sup> Zhang	0.057	2.792	0.164	3.00	-	0.589	1.163	304.0	0.467	7.23
<sup>7</sup> COMPASS*	0.136	3.420	0.134	2.94	-	0.800	1.160	316.1	0.4621	6.92
Exp								304.1	0.4676	7.377

- Errington uses Exponential-6 for VDW
- COMPASS uses Bond-Bond stretch term to match vib. frequencies
- Models optimized to reproduce experimental physical properties

How well do they reproduce experimental thermodynamics?



# Predict EoS over phase diagram



- COMPASS has reasonable description of liquid, poor description of Sc-Co<sub>2</sub> at low pressures
- EPM<sub>3</sub> more accurate for both liquid and Sc-Co<sub>2</sub>

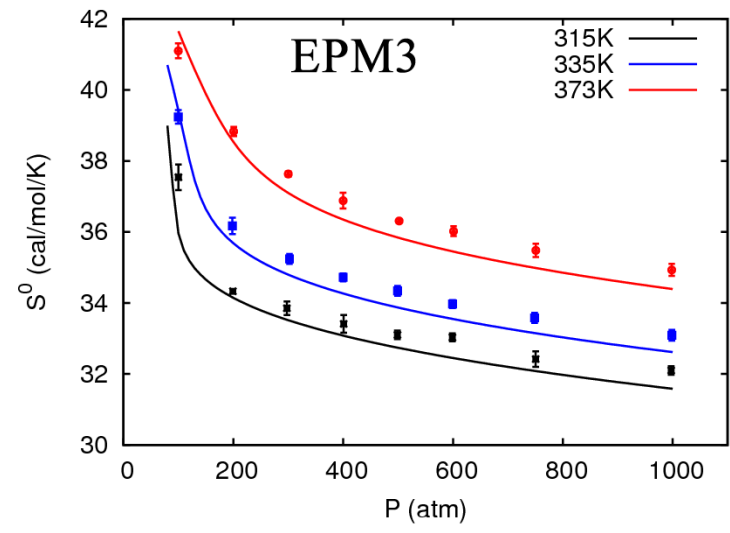
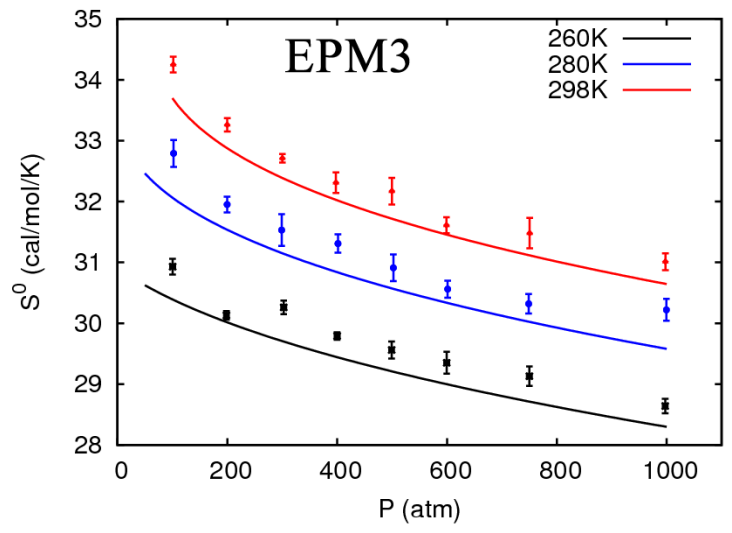
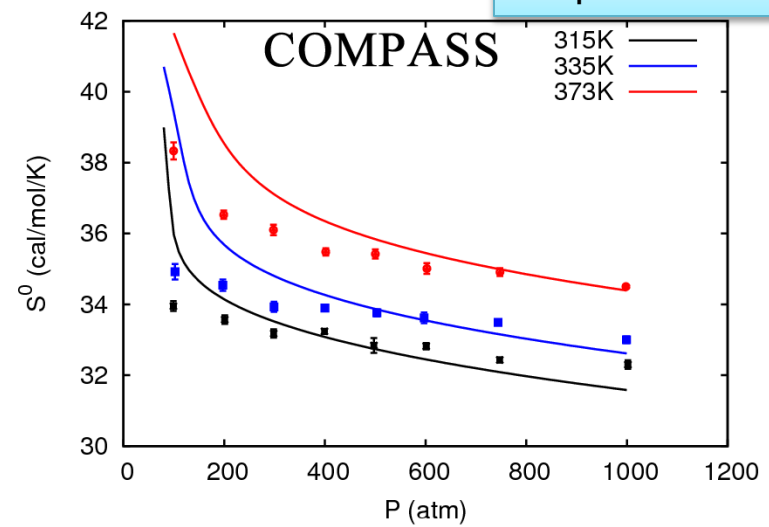
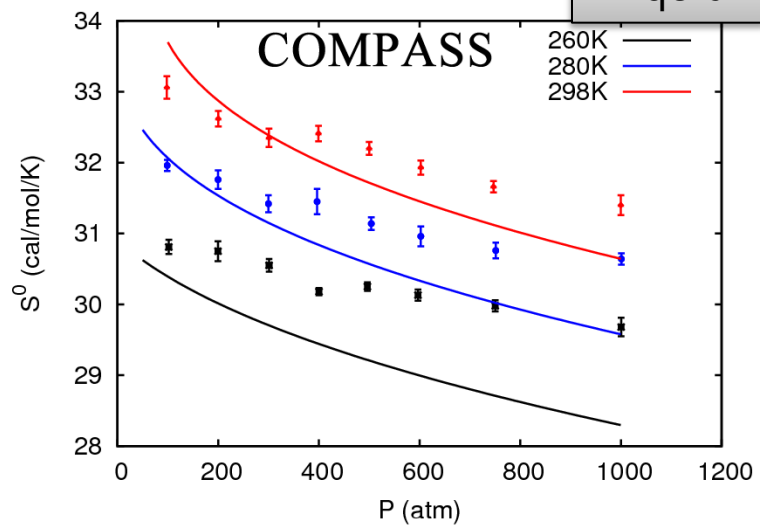




# Predict Standard Molar entropy over phase diagram

Liquid

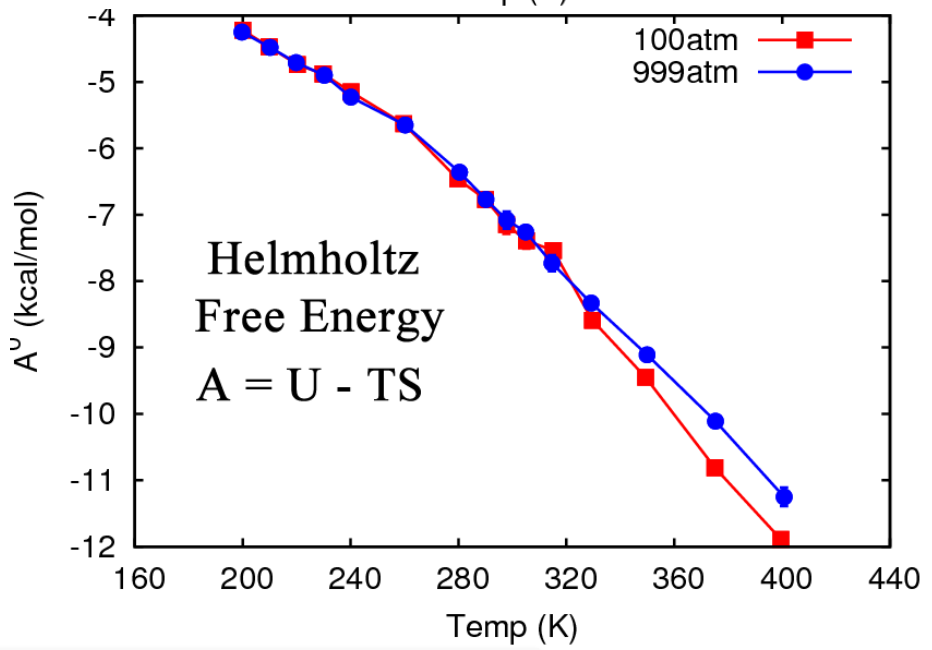
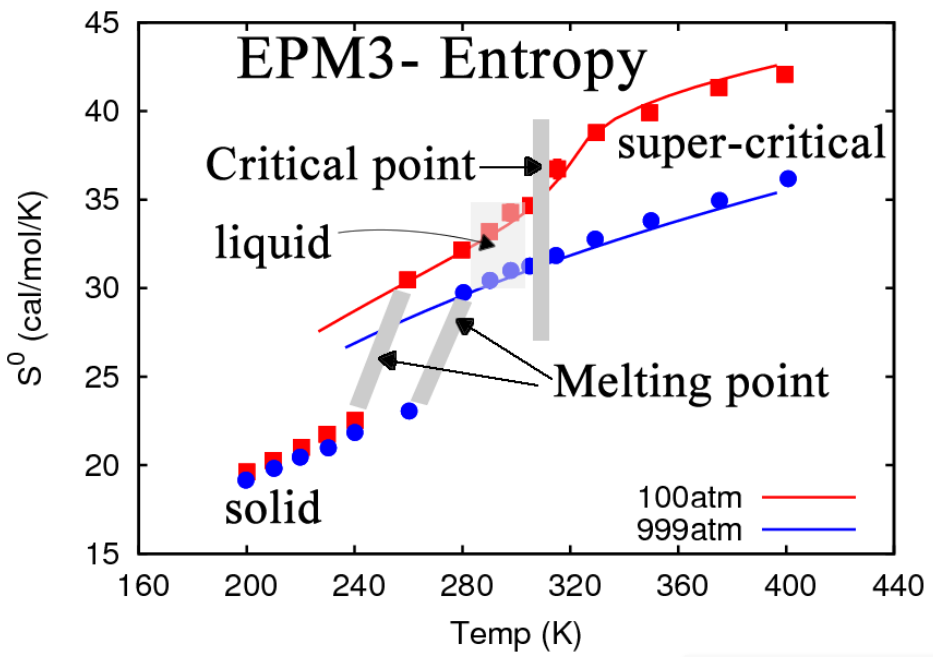
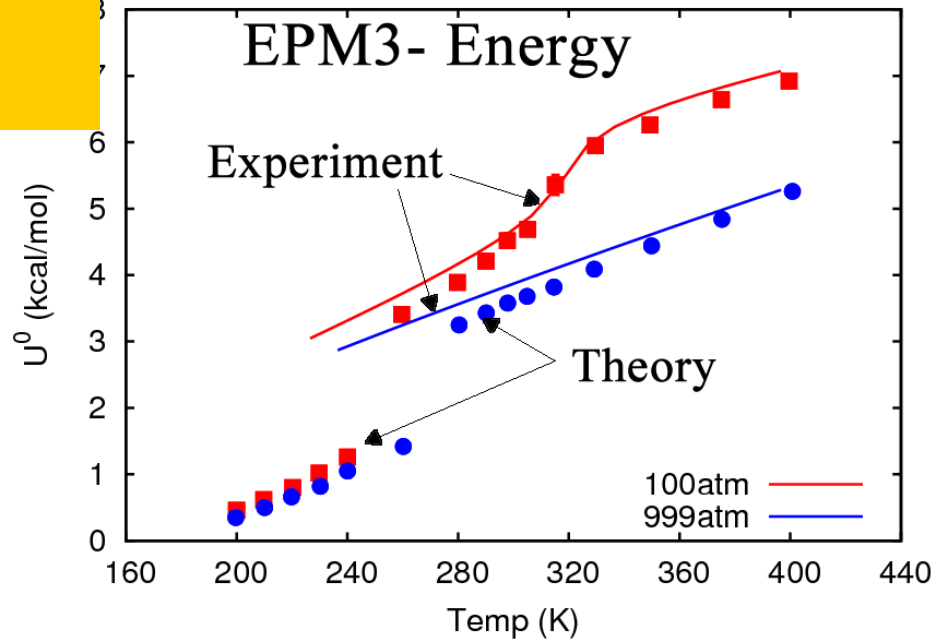
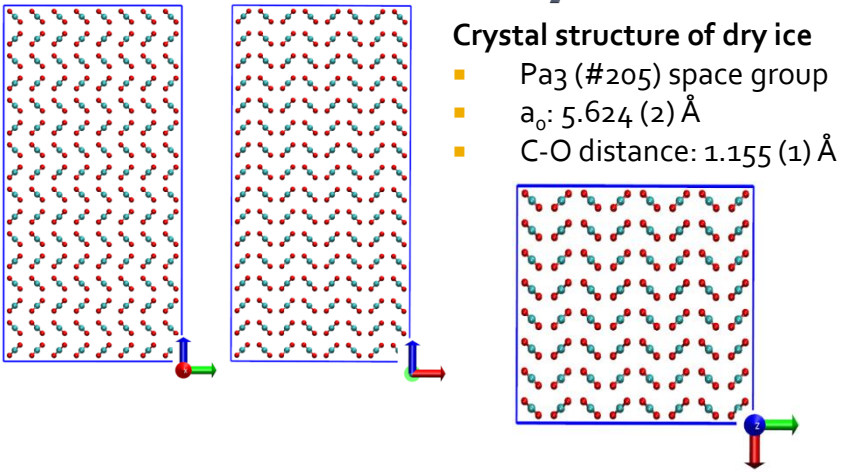
Super Critical



- COMPASS has large errors at high pressure liquid phase
- EPM3 superior for both liquid and Sc-CO<sub>2</sub>



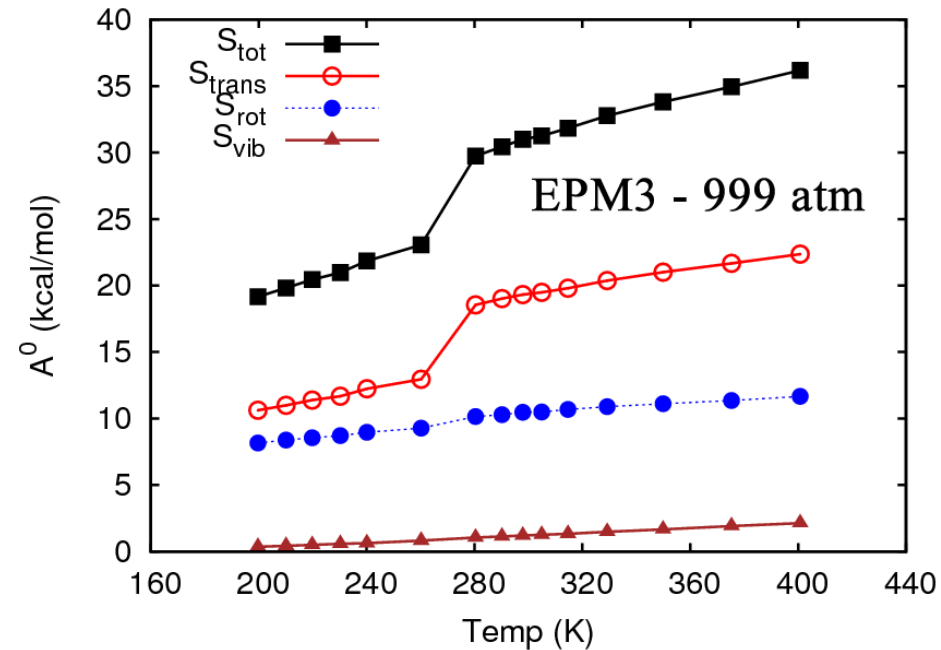
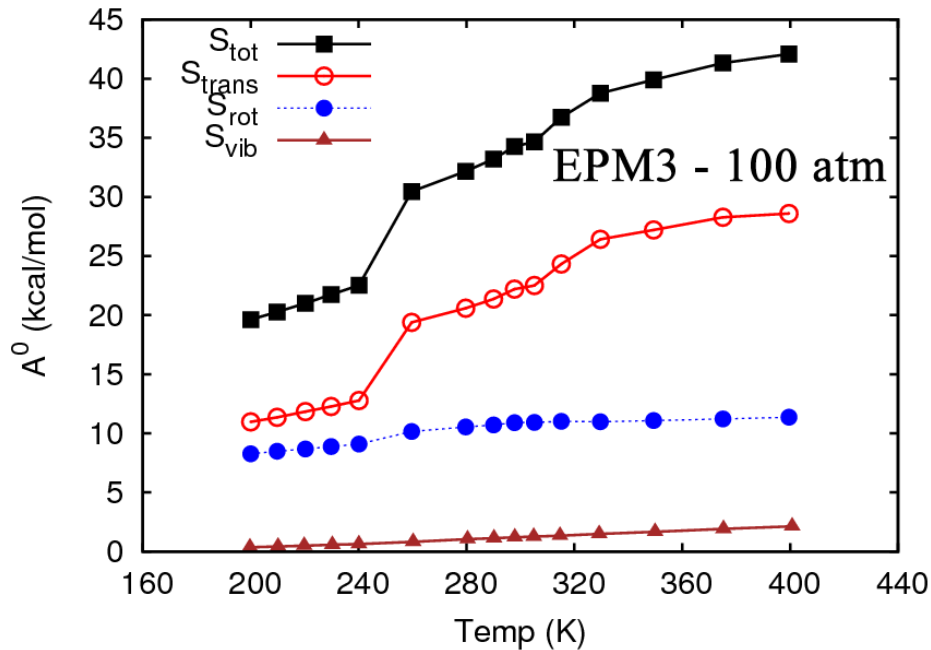
# Validation for water Melting of dry ice



Free Energy is dominated by entropy

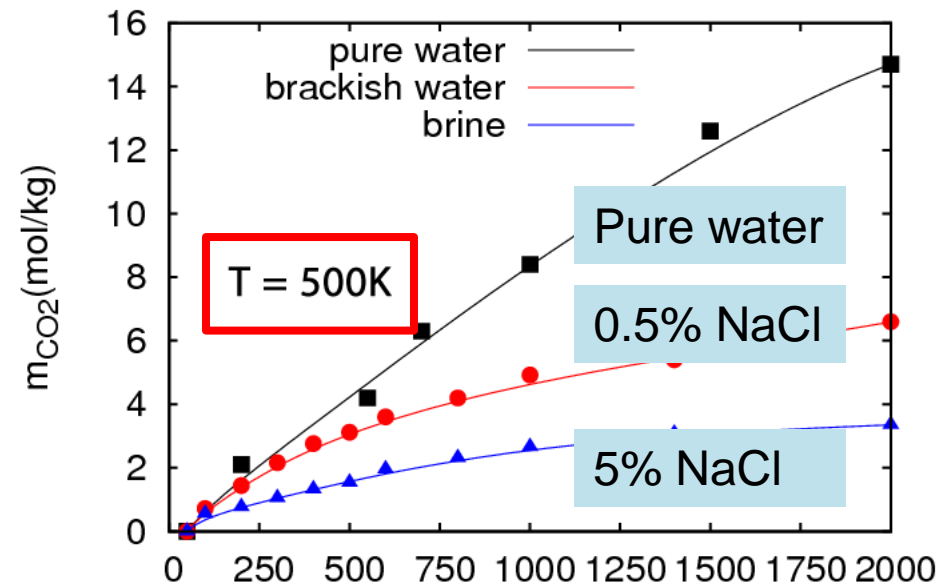
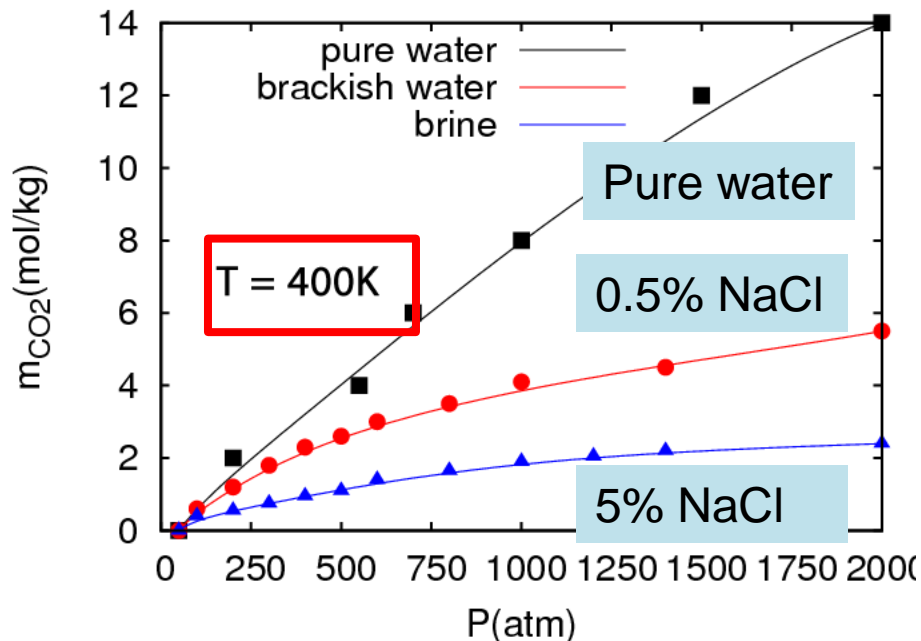


# Components of entropy

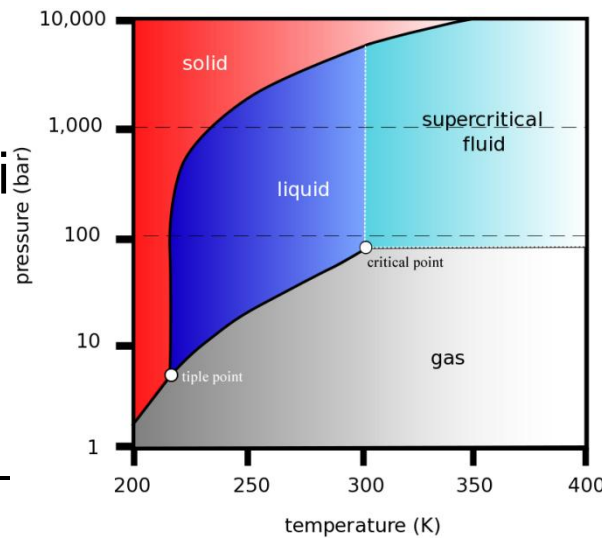


- Entropy dominated by diffusion (50 % - solid, 55% liquid, 66% super critical)
- Melting of  $\text{CO}_2$  corresponding to dramatic increase in diffusional entropy
- Small increase in rotational entropy:  $\text{CO}_2$  not a free rotor in liquid phase
- Monotonic increase in vibrational entropy from solid  $\rightarrow$  liquid  $\rightarrow$  super critical

# Grand Canonical Monte Carlo calculation of CO<sub>2</sub> storage in brine Assuming no conversion of CO<sub>2</sub> to HCO<sub>3</sub><sup>-</sup>



- Can store large amount of dissolved super-critical in underground brine
- Storage capacity increases with increasing temperature
- Does not account for conversion of CO<sub>2</sub> into**

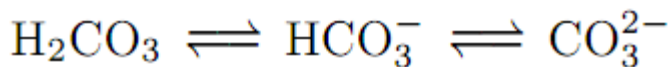




# Stability of DIC species in Underground Brine calculated as a function of %salt, pressure, temperature

5% brine at 0.2GPa and 350K

Species	$\Delta G$ (kcal/mol)	$\Delta H$ (kcal/mol)	$T\Delta S$ (kcal/mol)	ratio
CO <sub>2</sub>	-43.23±1.67	-30.81±1.24	12.42±3.52	1.0
HCO <sub>3</sub> <sup>-</sup>	-45.52±1.34	-31.29±2.45	14.23±1.74	13.33
H <sub>2</sub> CO <sub>3</sub>	-42.23±2.46	-30.21±1.98	12.02±1.32	0.061
CO <sub>3</sub> <sup>2-</sup>	-43.10±1.92	-32.63±2.12	10.47±2.99	0.785



pure water at 0.2GPa and 350K

Predict that ratio of HCO<sub>3</sub><sup>-</sup> to CO<sub>2</sub> is 13.3  
 Thus 92.5% of injected CO<sub>2</sub> is converted to HCO<sub>3</sub><sup>-</sup>  
 Conversion to CO<sub>2</sub> to HCO<sub>3</sub><sup>-</sup> by itself does not dramatically increase the amount that can be stored, but HCO<sub>3</sub><sup>-</sup> can be stabilized by interacting with the rock (not included in this project)  
 Also partial pressure of CO<sub>2</sub> that can leak out is dramatically reduced

- Can store 93% of injected CO<sub>2</sub> as HCO<sub>3</sub><sup>-</sup>
- HCO<sub>3</sub><sup>-</sup> is entropically stabilized
  - Favorable entropy of release 2 water molecules in solvation shell
  - Does not form any "clathrate" water structure as in CO<sub>2</sub>

# Conclusion

Predict that ratio of  $\text{HCO}_3^-$  to  $\text{CO}_2$  is 13.3  
Thus 92.5% of injected  $\text{CO}_2$  is converted to  $\text{HCO}_3^-$   
Conversion to  $\text{CO}_2$  to  $\text{HCO}_3^-$  by itself does not dramatically increase the amount that can be stored, but  $\text{HCO}_3^-$  can be stabilized by interacting with the rock (not included in this project)  
Also partial pressure of  $\text{CO}_2$  that can leak out is dramatically reduced

**Thus storing  $\text{CO}_2$  in underground brine reservoirs is feasible**

Thanks to DOE-NETL for funding and Robert Noll for monitoring program