



# Estimation of Vapour Pressures of Organic Liquids using Group Contributions and Group Interactions

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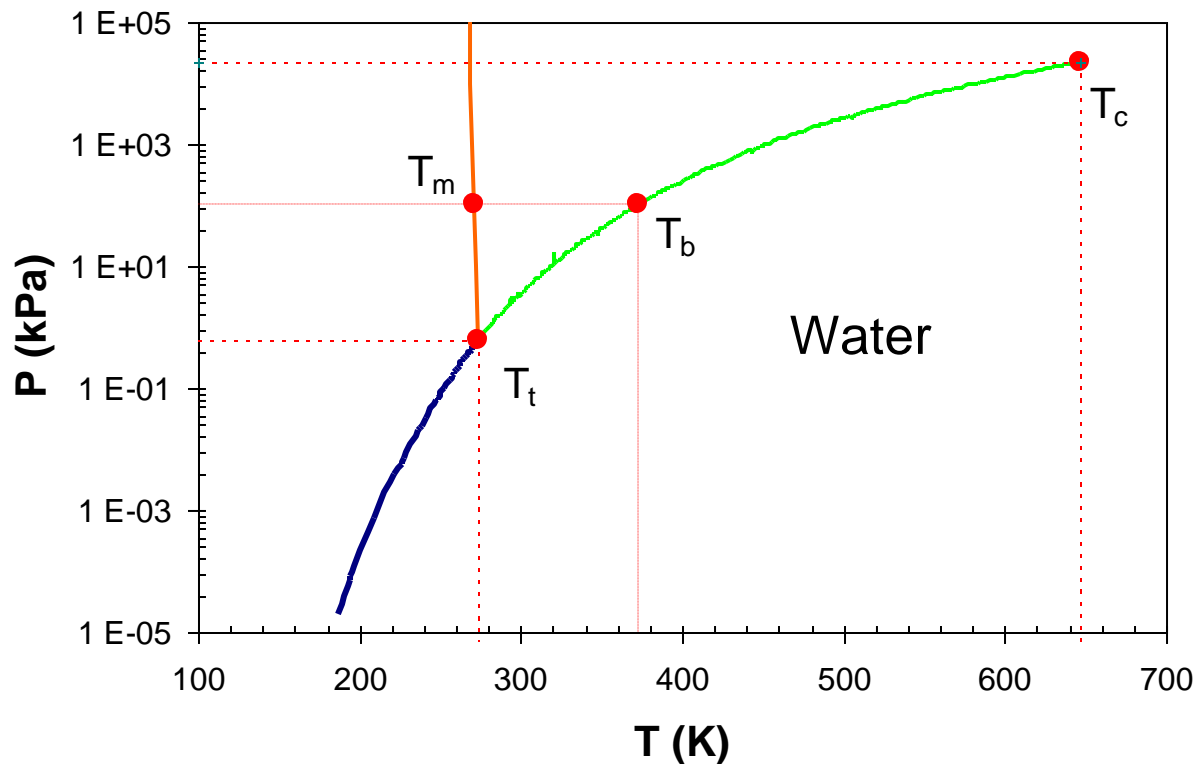
## Overview

- Motivation
- Project Timeline
- Properties of the Vapor Pressure Curve
- Performance of Different Equations
- Model Description
- Software Tools
- Results
- Future Work
- Acknowledgement

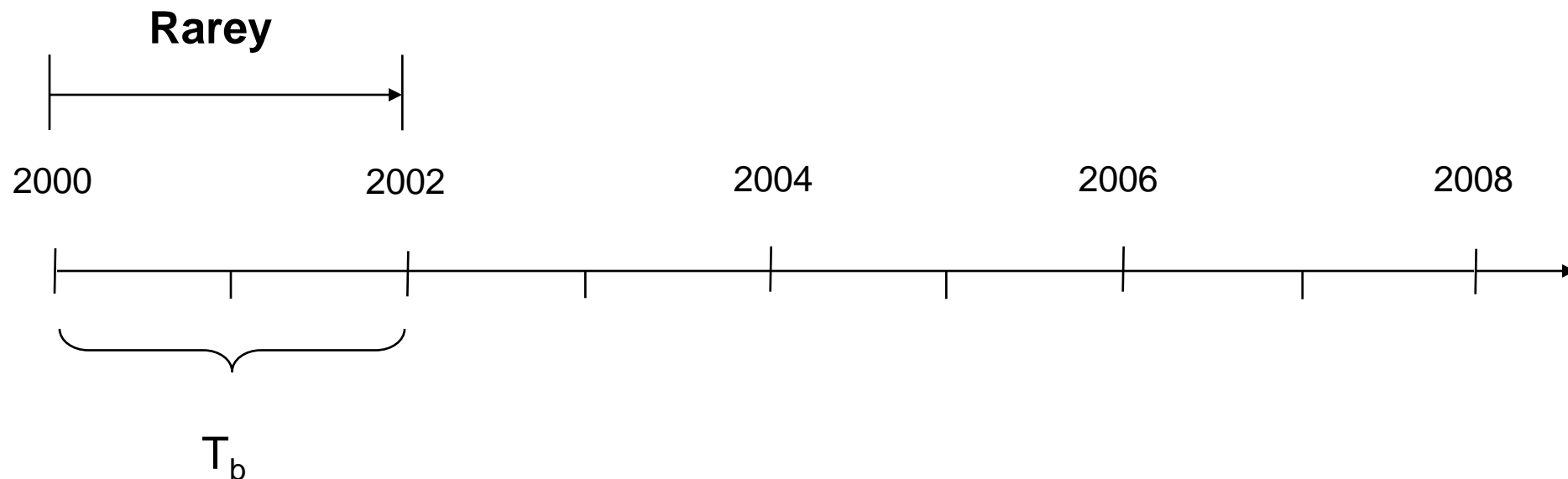


## What are Important Properties?

- Usually need to know information about the vapour-liquid boundary, useful for example in:
  - Distillation applications
  - Environmental applications

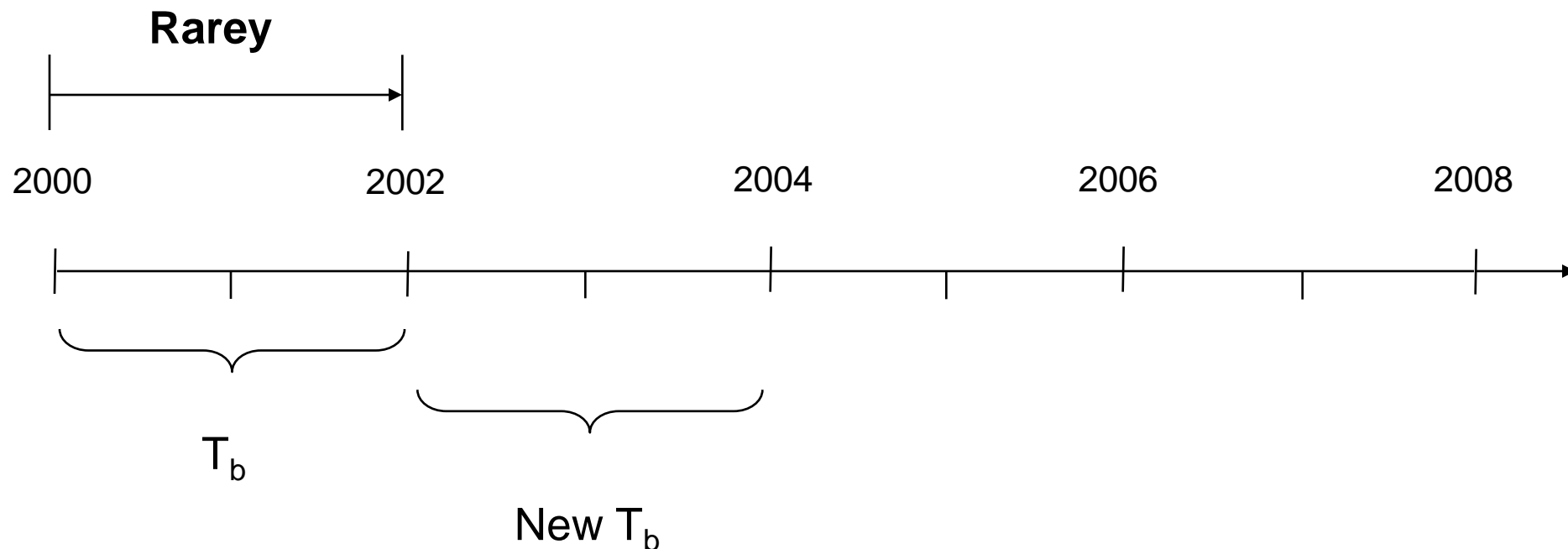


## Project Timeline



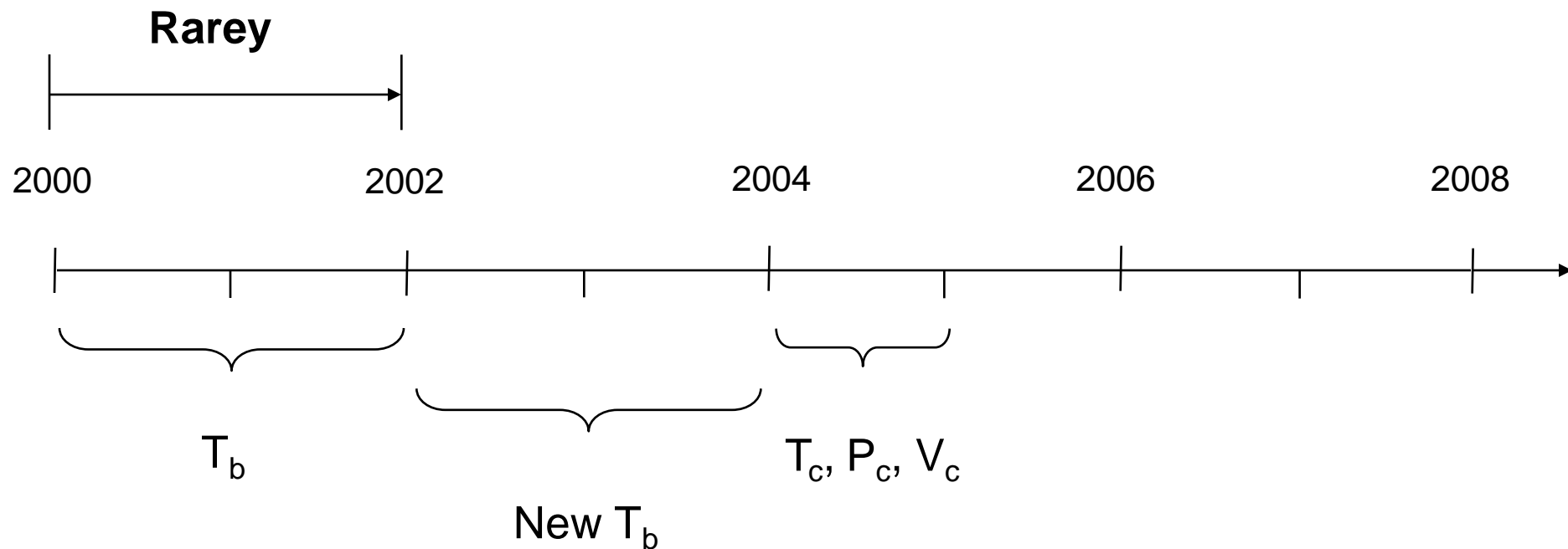
W. Cordes, J. Rarey, *A New Method for the Estimation of the **Normal Boiling Point** of Non-Electrolyte Organic Compounds*, Fluid Phase Equilibria, 201/2, 397-421 (2002).

## Project Timeline



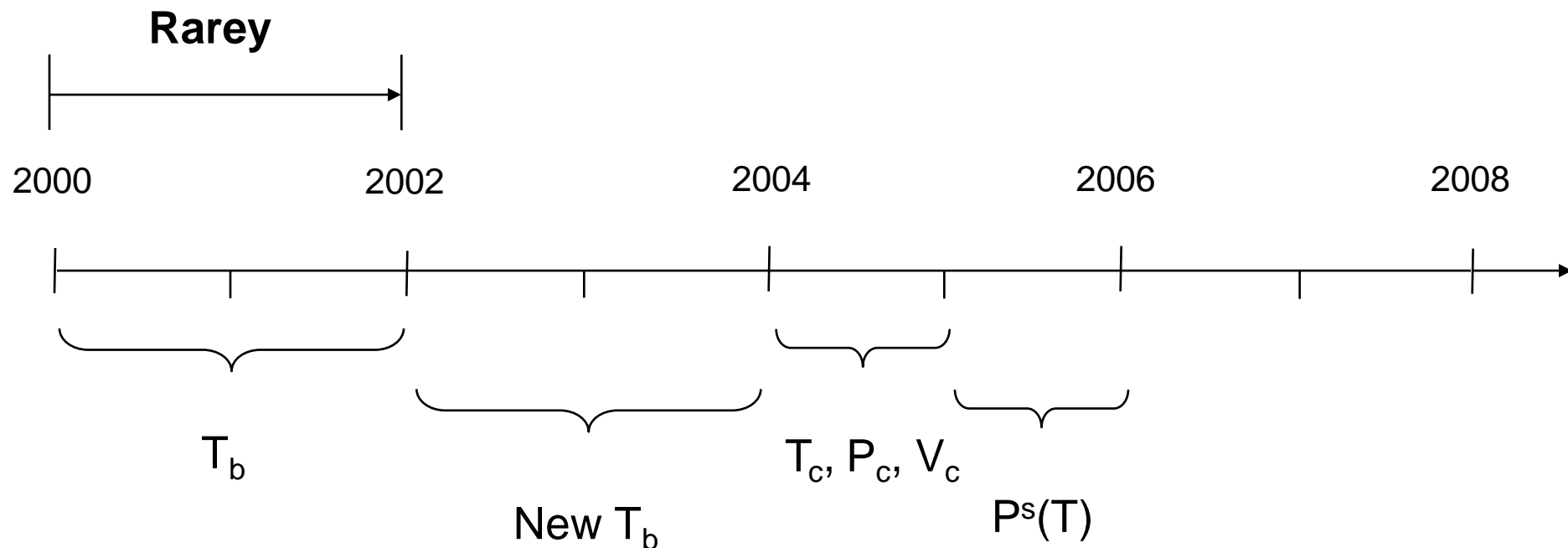
Y. Nannoolal, J. Rarey , D. Ramjugernath, W. Cordes, *Estimation of Pure Component Properties, Part 1: Estimation of the **Normal Boiling Point** of Non-Electrolyte Organic Compounds via Group Contributions and Group Interactions*, *Fluid Phase Equilibria*, 226, 45-63, 2005.

## Project Timeline



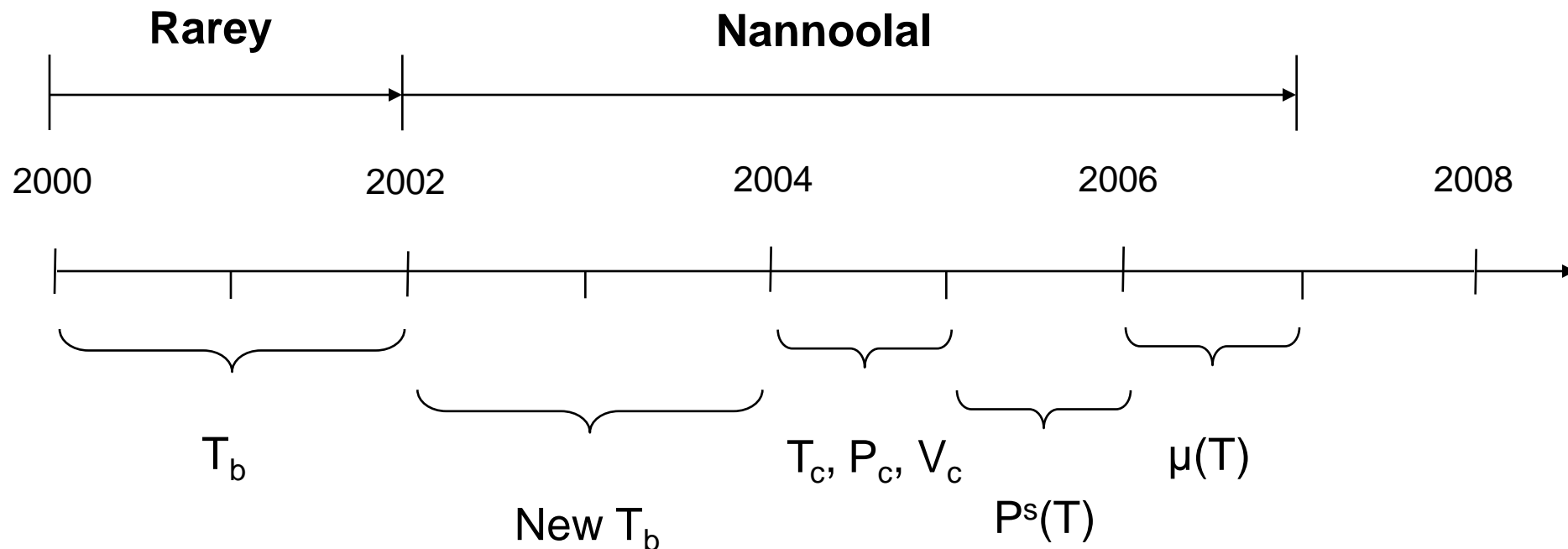
Nannoolal, Y., Rarey, J., Ramjugernath, D., Estimation of Pure Component Properties Part 2: Estimation of **Critical Data** by Group Contribution., *Fluid Phase Equilib.*, 252 (2007) 1.

## Project Timeline



Nannoolal, Y., Rarey, J., Ramjugernath, D., Estimation of Pure Component Properties Part 3: Estimation of the **Vapour Pressure** of Non-Electrolyte Organic Compounds via Group Contributions and Group Interactions., *Fluid Phase Equilib.* accepted for publication.

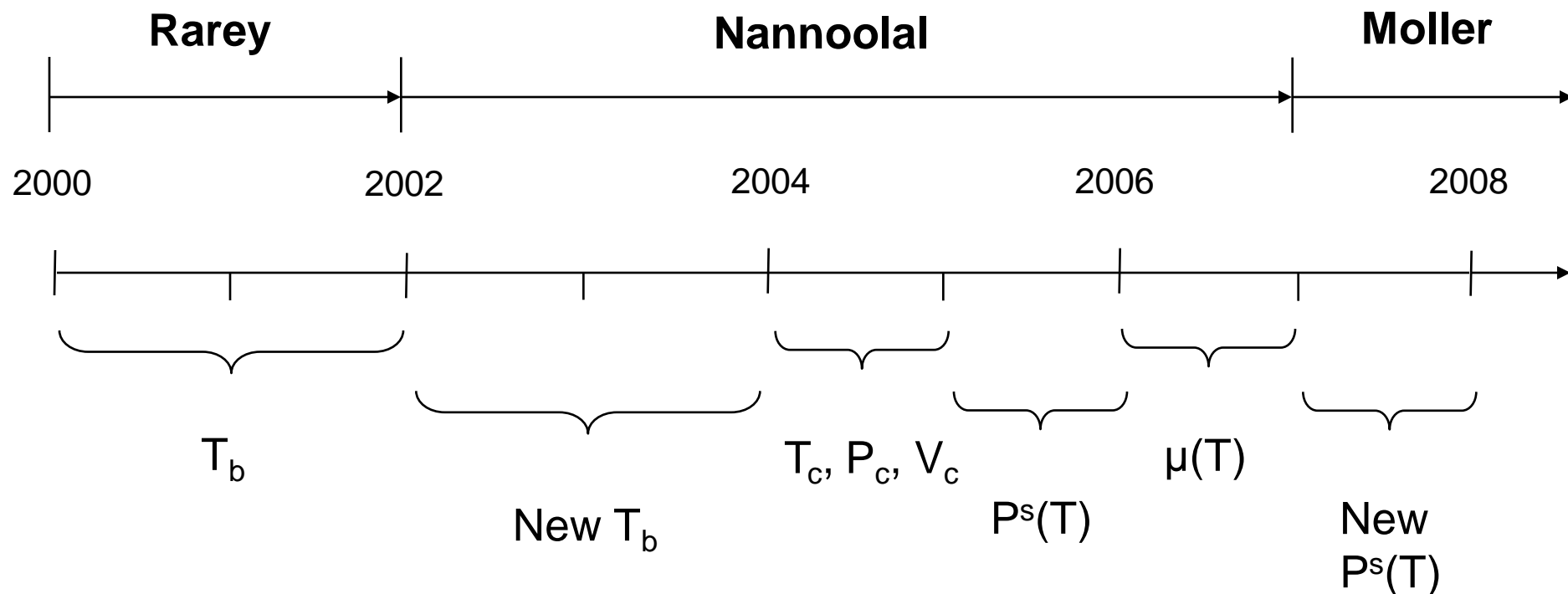
## Project Timeline



Nannoolal, Y., Rarey, J., Ramjugernath, D., Estimation of Pure Component Properties Part 4: Estimation of the **Liquid Viscosity** of Non-Electrolyte Organic Compounds via Group Contributions and Group Interactions., *Fluid Phase Equilib.* in preparation.



## Project Timeline



Moller, B., Rarey, J., Ramjugernath, D., Estimation of the **Vapour Pressure** of Non-Electrolyte Organic Compounds via Group Contributions and Group Interactions., *J. Mol. Liq.* accepted for publication.

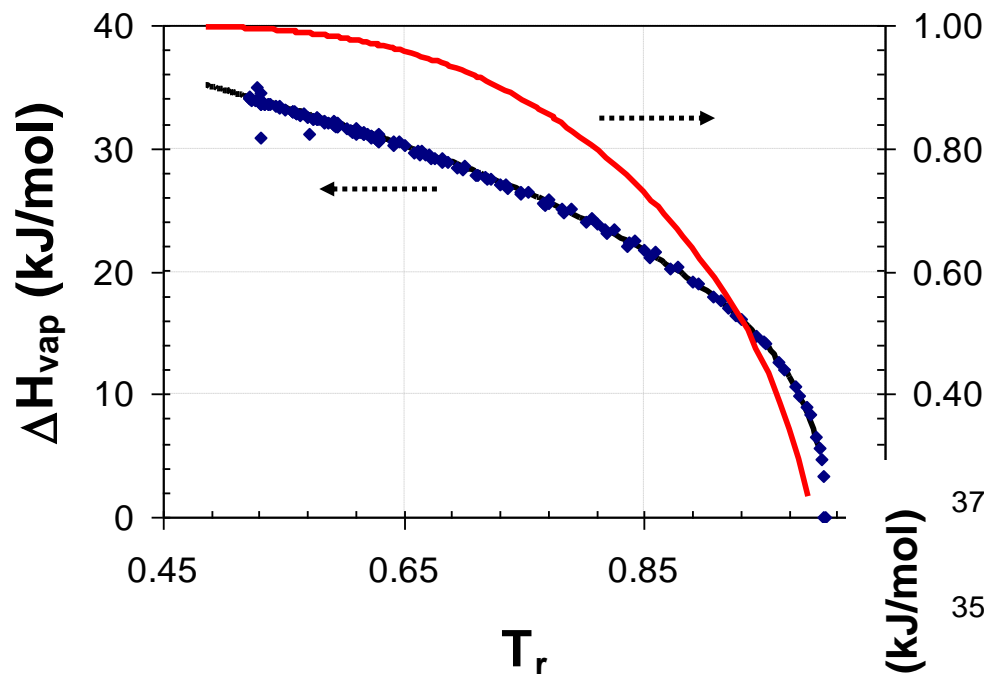
# Methods for Predicting Physical Properties

- Group contribution methods
  - Fairly simple
  - Good accuracy
  - Need groups to make predictions
  
- Quantum chemistry (COSMO-RS, COSMO-SAC ... )
  - Great potential but not at the required level of accuracy
  
- Statistical thermodynamics (molecular simulations ... )
  - Can get good results when fitted to some reference data points

## Purpose of this Work

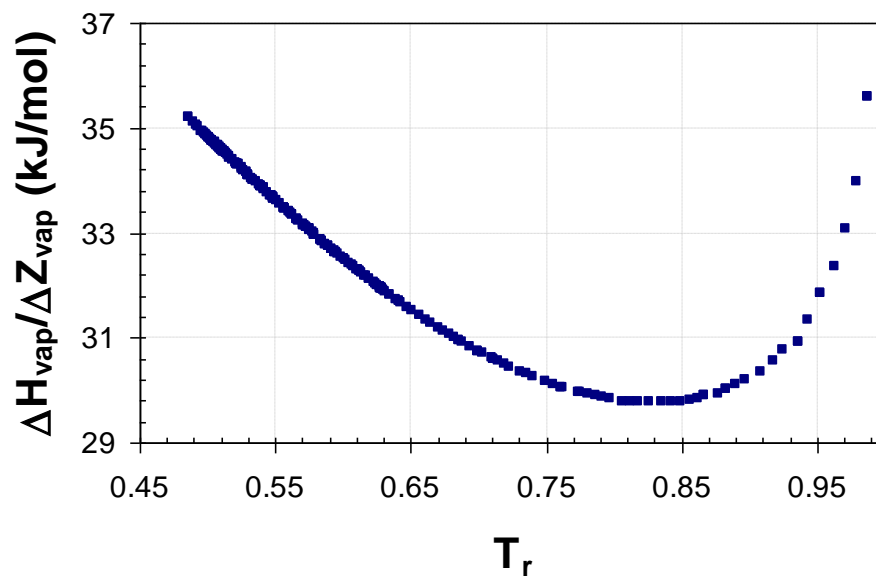
- A large number of good group contribution methods already developed
- Objective of this work was to rework the vapour pressure method
- Nannoolal based his vapour pressure method on the Antoine equation, the first step was therefore to review this decision ...

# The Slope of the Vapor Pressure Curve

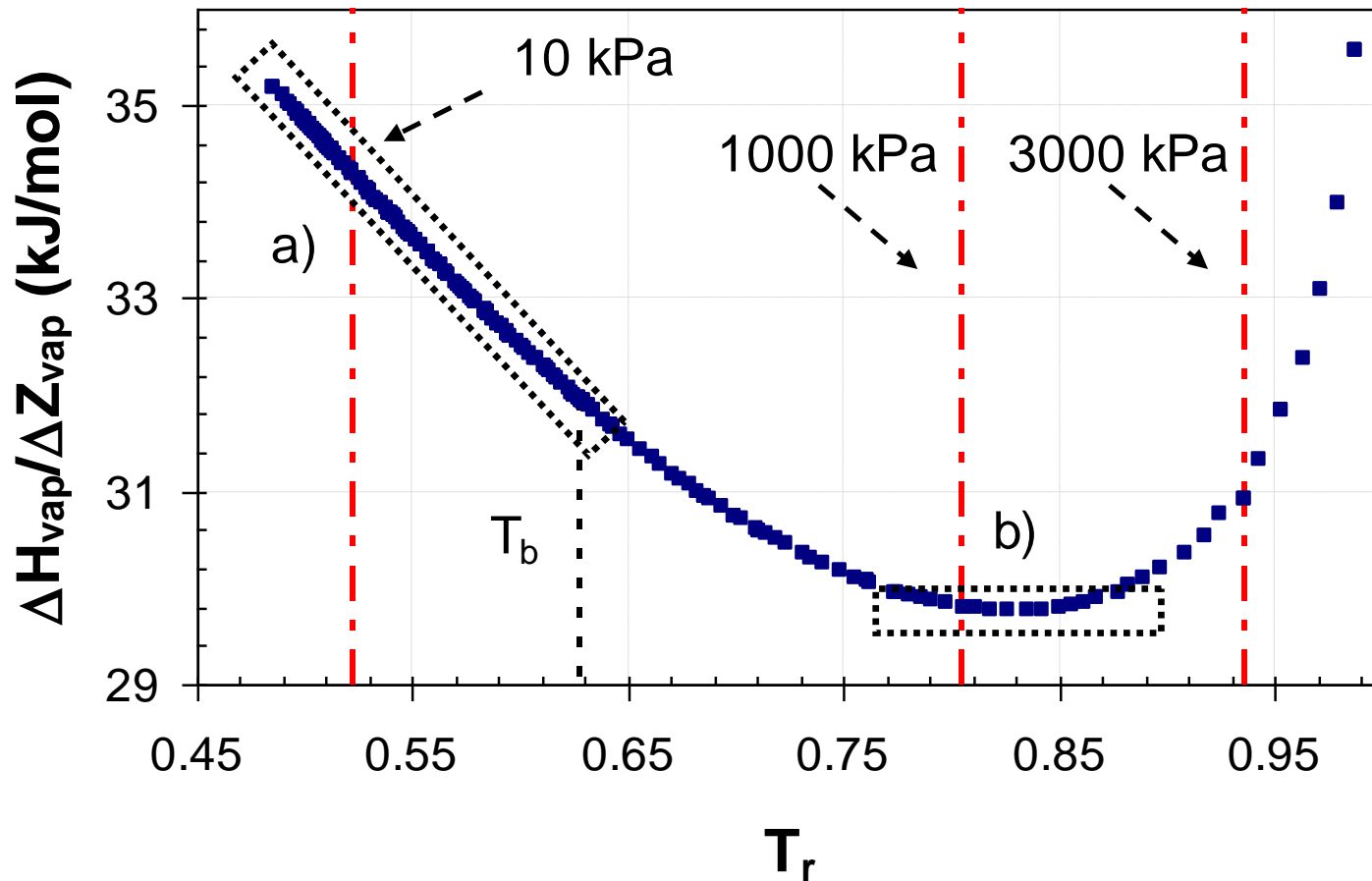


Component:  
Benzene

$$\frac{d \ln P^s}{d \left( \frac{1}{T} \right)} = \left( -\frac{1}{R} \right) \times \frac{\Delta H_{vap}}{\Delta Z_{vap}}$$



# Approximate Modeling of the Slope



Benzene

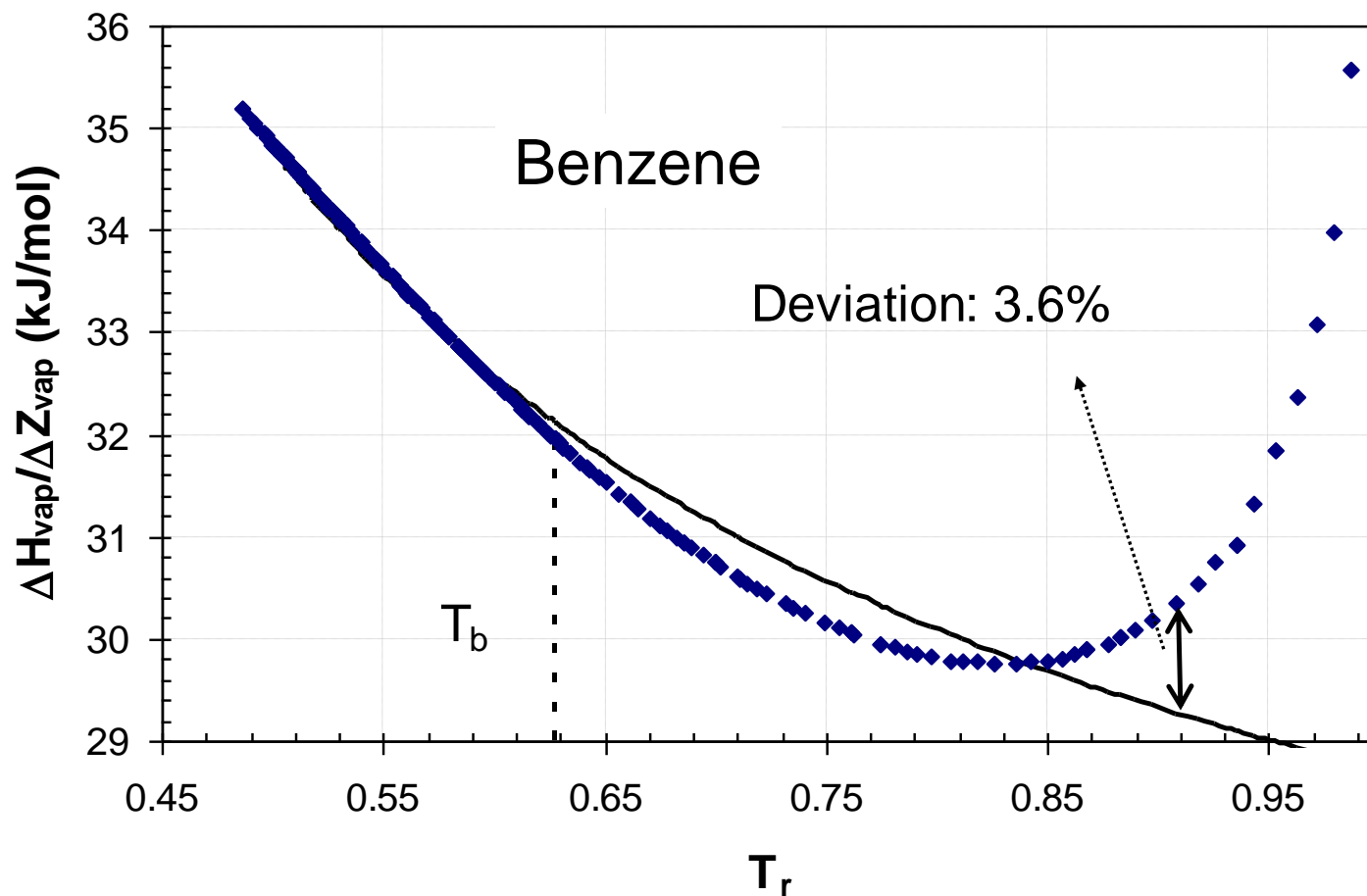
$$\frac{\Delta H_{vap}}{\Delta Z_{vap}}$$

$$T_r = \frac{T}{T_c}$$

a) Linear with respect to: 1/T b) Constant

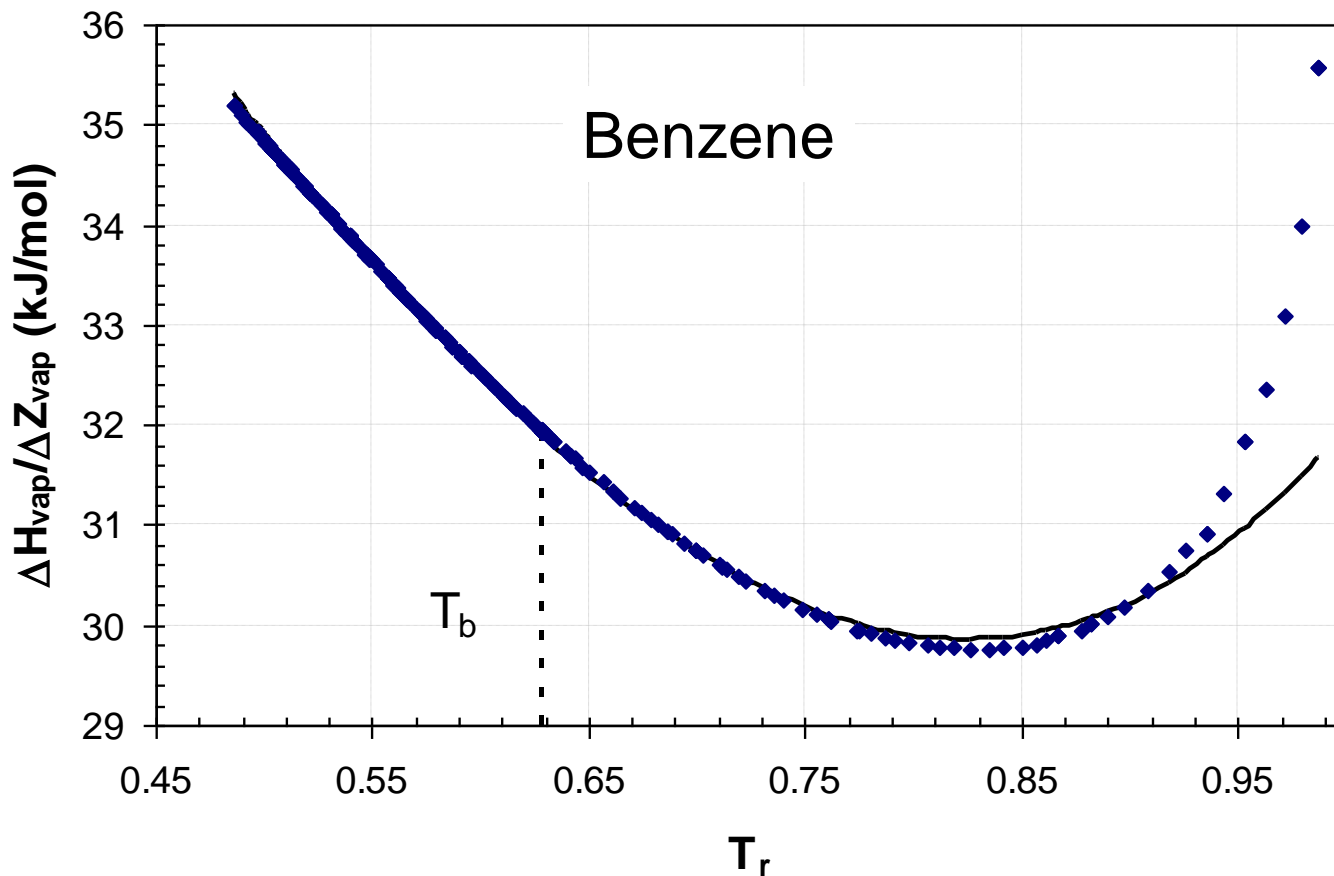
# The Antoine Equation

$$\log P^s = A + \frac{B}{T - C}$$



# The Cox Equation

$$\log\left(\frac{P^s}{P^{atm}}\right) = A' \left(1 - \frac{T_b}{T}\right) \quad \log A' = \log A_c + E(1 - T_r)(F - T_r)$$



$$T_r = \frac{T}{T_c}$$

# Kinetic Theory of Vaporization

$$\ln P = A + \frac{B}{T} + C \ln T + DT + ET^2$$

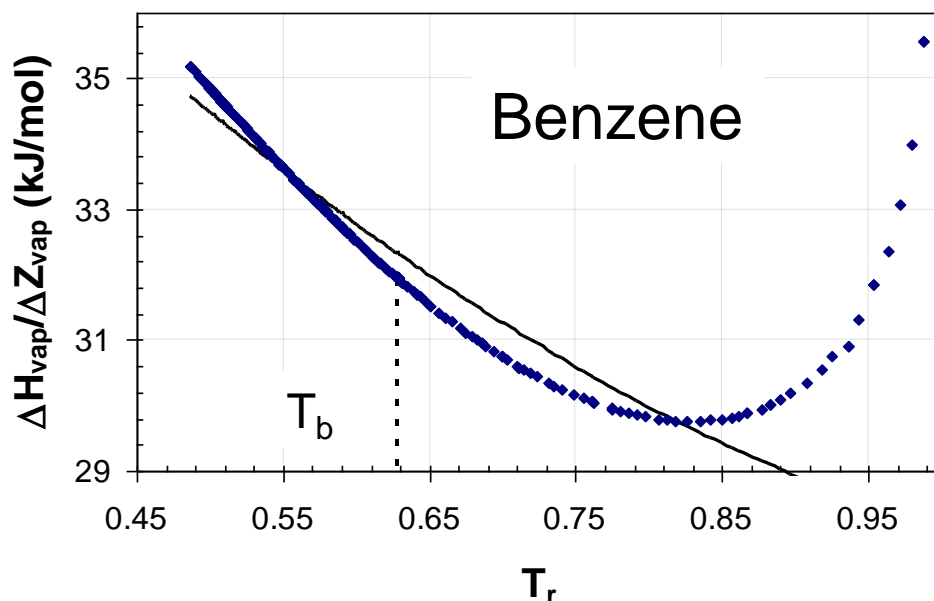
$$A = \ln\left(\frac{R}{V_w}\right) + (s - 0.5) \ln\left(\frac{E_0}{R}\right) - \ln[\Gamma(s)] + \ln \alpha$$

$$B = -\frac{E_0}{R} \quad C = 1.5 - s \quad D = \frac{s - 1}{E_0/R}$$

$$E = \frac{2(s - 3)(s - 1)}{(E_0/R)^2}$$

- $E_0$  - Characteristic energy
- $s$  - Number of loosely coupled harmonic oscillators

Applicable to pressures lower than  $\approx 200$  kPa



Abrams, D. S., Massaldi, H. A., Prausnitz J. M., Vapor Pressures of Liquids as a Function of Temperature. Two-Parameter Equation Based on Kinetic Theory of Fluids., *Ind. Eng. Chem. Fundam.* 13(3) (1974) 259.

Moelwyn-Hughes, E. A., *The Chemical Statics and Kinetics of Solutions*, Academic Press, London (1971).



## Model Derivation

- The A parameter in the Antoine equation is substituted by using the normal boiling point as a reference point:

$$\ln P - \ln P_{atm} = \frac{B}{T - C} - \frac{B}{T_b - C}$$

- In order to further reduce the number of model parameters it is assumed that C is a function of the normal boiling point:

$$\ln \left( \frac{P}{P_{atm}} \right) = B' \frac{T - T_b}{T - C(T_b)}$$

- For aliphatic alcohols and carboxylic acids the new form is:

$$\ln \left( \frac{P}{P_{atm}} \right) = B' \frac{T - T_b}{T - C(T_b)} + D' \ln \left( \frac{T}{T_b} \right)$$

# Model Equations

$$\ln\left(\frac{P}{P_{atm}}\right) = B' \frac{T - T_b}{T - C(T_b)} + D' \ln\left(\frac{T}{T_b}\right)$$

(55 Gl's)

$$B' = A + dB + \frac{1}{2} \sum_{i=1}^n \sum_{j=1}^n GI_{i-j}$$

$$C(T_b) = -2.65 + \frac{T_b^{1.485}}{135}$$

Aliphatic alcohols & carboxylic acids

$$D' = D + \frac{1}{n_a} \sum_{i=1}^m v_i dE_i$$

(5 Groups)

(158 Groups)

$$dB = \sum_i v_i dB_i + \left( n_a \sum_j v_j dB_j + \sum_k dB_k \right)$$

Group interactions (H-bonding groups)

Frequency

Existence

Size

	OH <sup>(1)</sup>	OH <sup>(2)</sup>	NH <sub>2</sub>
OH <sup>(1)</sup>	0	1	1
OH <sup>(2)</sup>	1	0	1
NH <sub>2</sub>	1	1	0

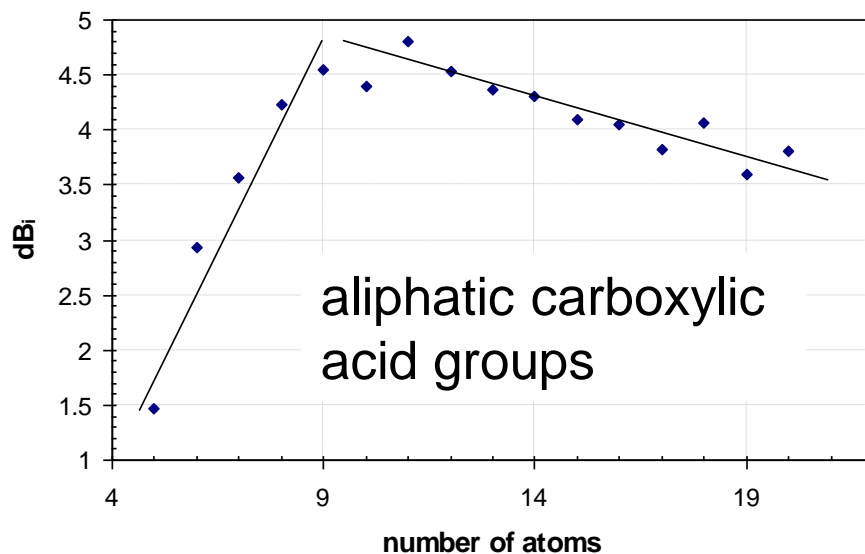
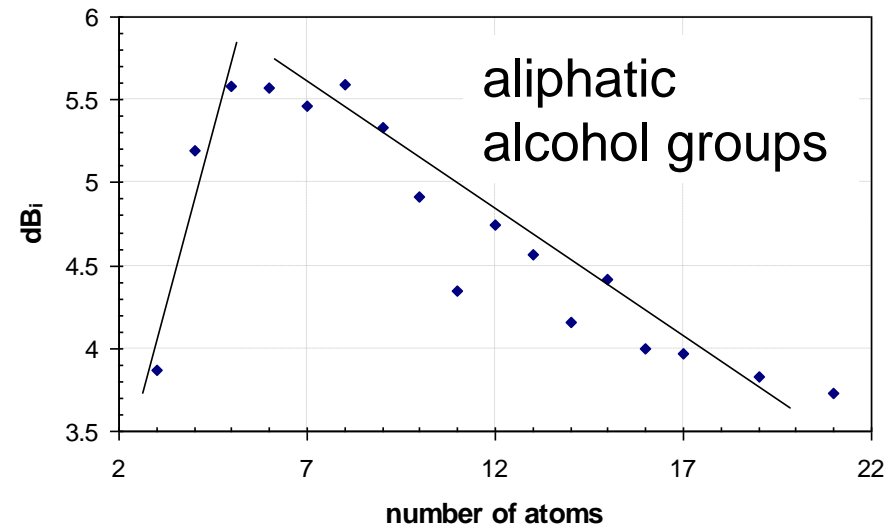
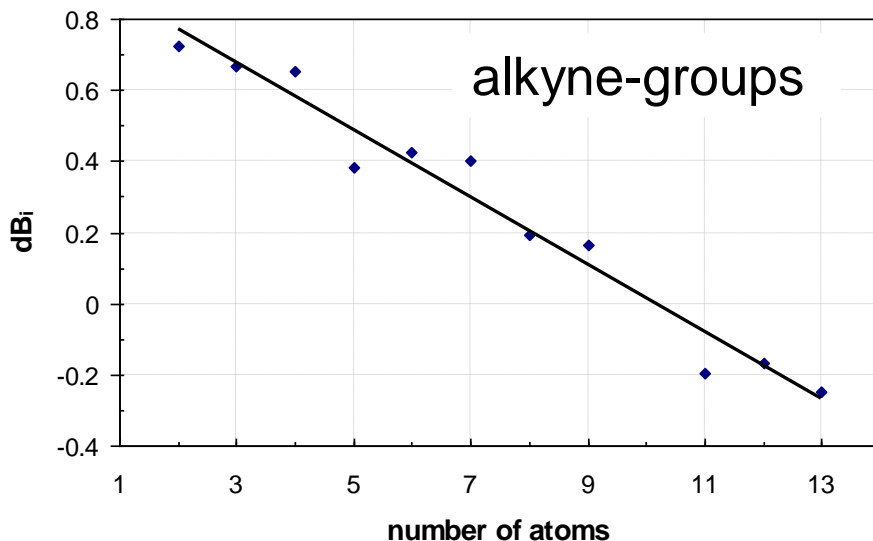
$n_a$

- number of atoms except H

$v$

- frequency of a group

# Group Contributions - $dB_i$ as Function of the Number of Heavy Atoms

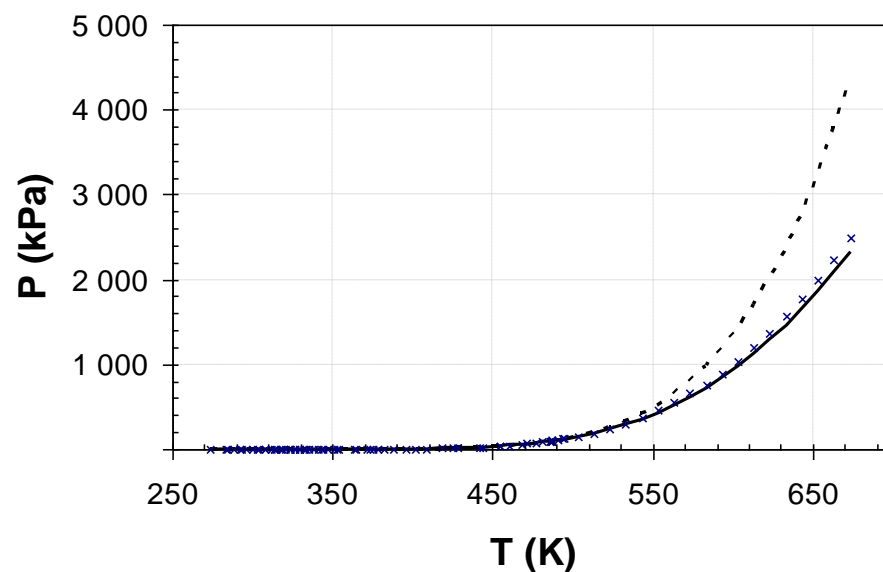
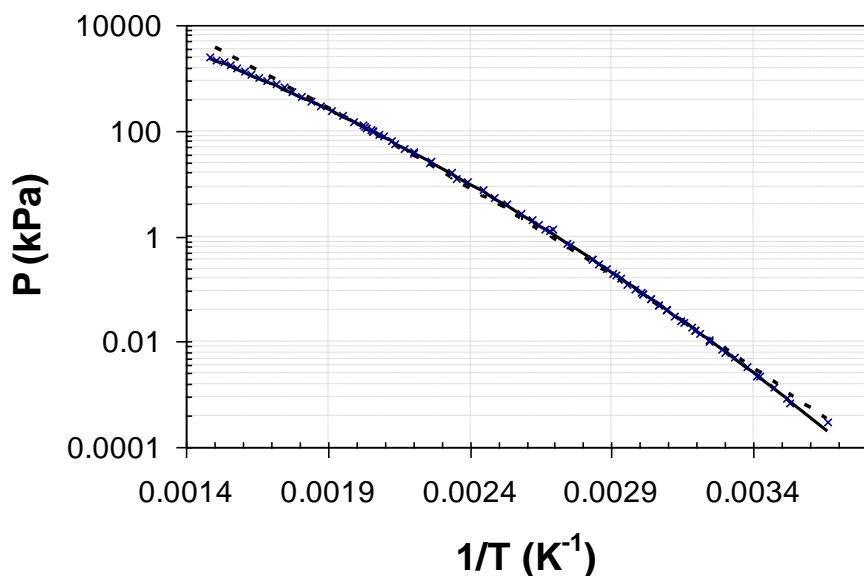


Short and longer chain alcohols and carboxylic acids require separate groups

# Model Improvements

- Alcohol and carboxylic acid representation
- Smaller and larger molecules
- Low pressure data

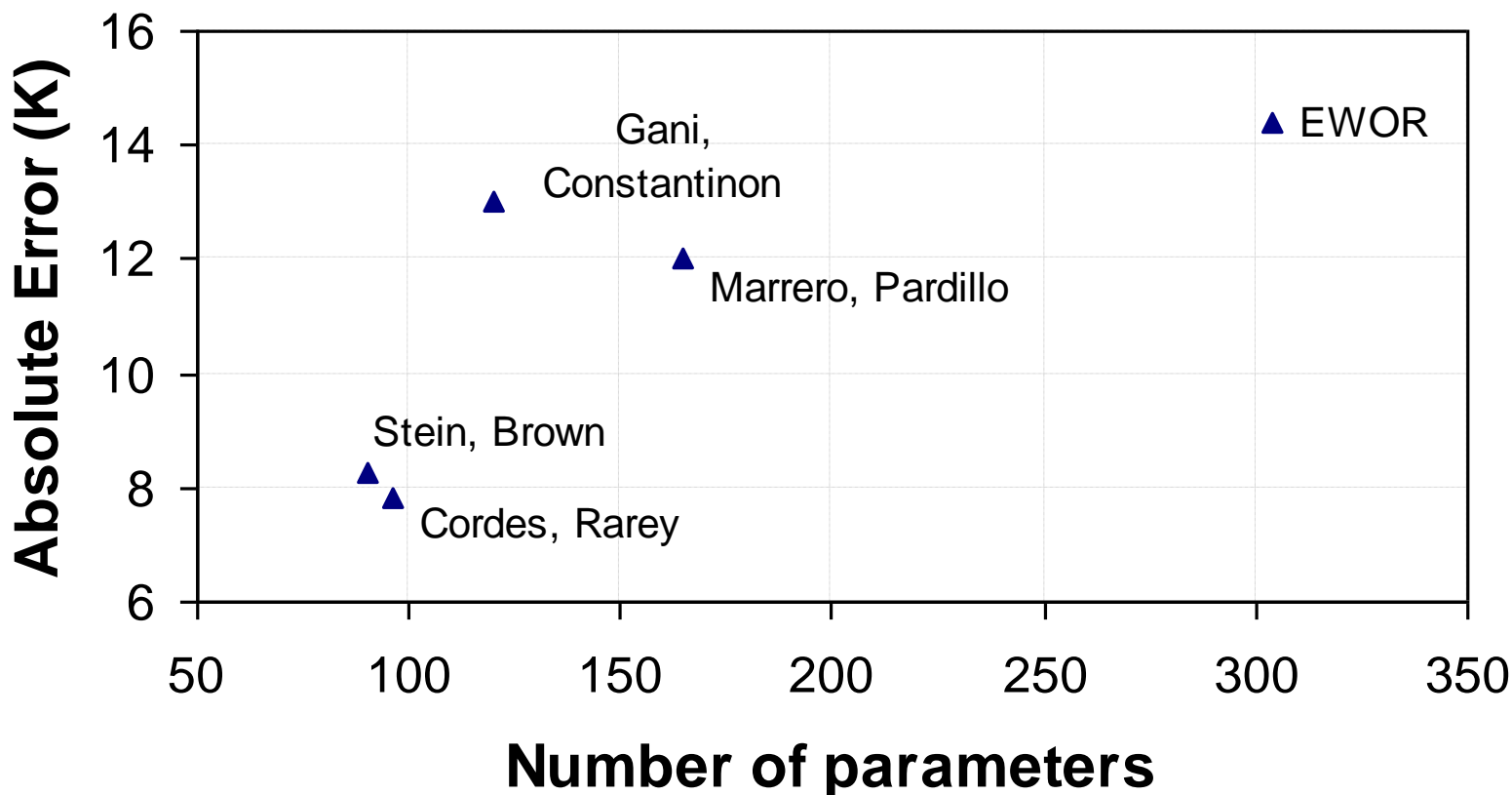
— Current work  
 - - - Nannoolal



1-Nonanol (data from the DDB)

## Model Parameters – Error Relationship

Error for the prediction of the boiling point increases with number of model parameters!



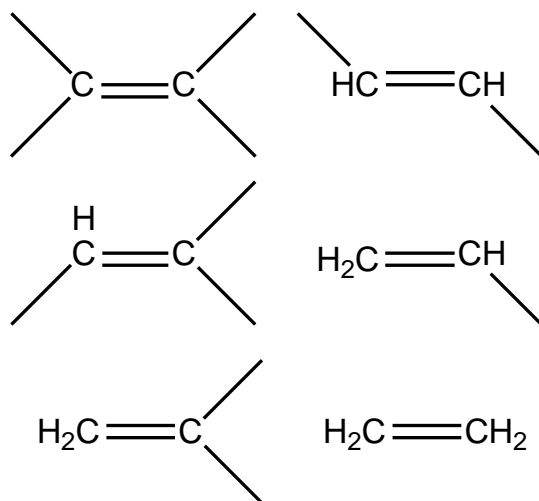
EWOR = Ericksen, Wilding, Oscarson, Rowley

## Simplification of Group Definitions

Replace specific groups with more widely applicable groups:

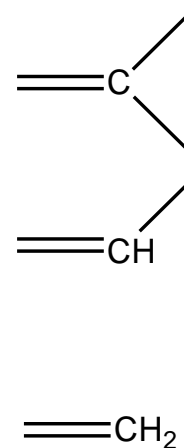
Example: double bonded carbon group:

Previously (Nannoolal et al.)



6 groups to describe all combinations

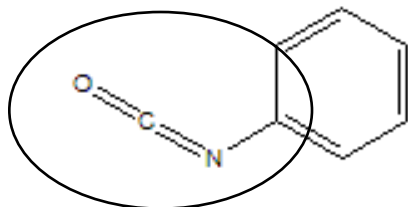
New method



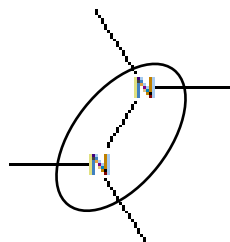
Only 3 groups required to describe all combinations

**These simplifications may not be applicable to the estimation of other properties!**

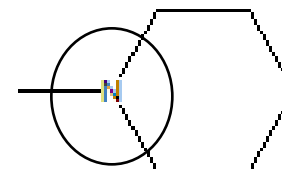
# Introduction of New Structural Groups



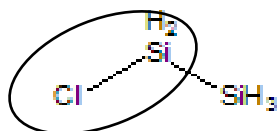
aromatic iso-cyanate



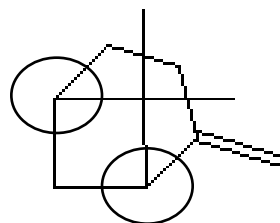
hydrazine



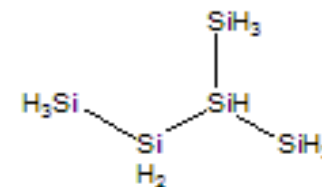
cyclic tertiary amines



halo-silicon groups (F,Cl,Br,I)



fused ring carbon (and other structural groups)



silicon group expanded

# Software Tools for Group Analysis

Artist - The Structure Editor

File Edit View Window Calculate ?

#DDB=11302 2-(2-Pyridyl)indole

Bonds: 17 Atoms: 15 Formula: C13H10N2 Mol.Weight:

Group Assignment Result

Close Copy Print

Molecule Description  
#DDB=11302 2-(2-Pyridyl)indole

Comment:

Group Assignment  
Method: TB-METHOD.INK

Group assignment was successful and complete

Subgroup number: 88 Maingroup number: 88 Groupname:  
aromatic nitrogen in a six-membered ring\$aN\_6memr\$  
Atoms: 13 in 1 Group

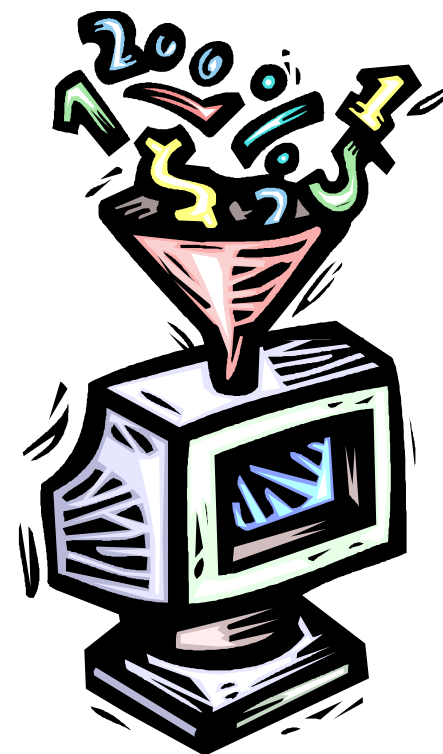
Subgroup number: 87 Maingroup number: 87 Groupname:  
aromatic nitrogen in a five-membered ring\$aN\_5memr\$  
Atoms: 7 in 1 Group

Subgroup number: 19 Maingroup number: 19 Groupname:  
aromatic carbon attached to three aromatic  
neighbors\$ACH\_3an\$  
Atoms: 4 5 in 2 Groups



## Vapour Pressure Data

- Dortmund Data Bank (DDB)
- VAP data for 6000+ compounds
- 180000+ VAP points
- Data needed to be validated
- Used VBA to streamline the process



# Data Validation

Validation Plotter

**Load/Save Progress**

Clear Progress    Save Progress

---

**Sequential Verification**

Component Number:

Number Plotted:

Goto Comp Number:

Next Plot    Random

InP	1/T	Flag
3.60E+00	1.61E-03	0
3.59E+00	1.62E-03	0
3.58E+00	1.62E-03	2
3.58E+00	1.62E-03	2
3.57E+00	1.62E-03	0
3.57E+00	1.62E-03	2
3.56E+00	1.62E-03	0
3.55E+00	1.62E-03	2
3.55E+00	1.63E-03	0
3.54E+00	1.63E-03	0
3.52E+00	1.63E-03	0
3.52E+00	1.63E-03	2
3.52E+00	1.63E-03	2
3.50E+00	1.64E-03	0
3.49E+00	1.64E-03	2
3.47E+00	1.64E-03	0
3.44E+00	1.65E-03	0
3.41E+00	1.66E-03	0
3.36E+00	1.67E-03	0
3.35E+00	1.67E-03	2
3.35E+00	1.67E-03	0
3.30E+00	1.68E-03	0
3.30E+00	1.68E-03	2

Flag All

Remove Flags

Flag Component

Update Changes

Remove New

**Duplicates**

x - tolerance:

y - tolerance:

Flag Duplicates

**Method/Property**

My Method    Na Method

Property To validate:

Select

## Results for All Available Data

Relative mean deviations (%) for the different vapour pressure ranges

$$RMD(\%) = \frac{|P^{\text{exp}} - P|}{P^{\text{exp}}} \times 100\%$$

	<b>This work (NC = 2332)</b>	<b>Nannoolal et al. (NC = 2207)</b>
<b>Average (All Pressures)</b>	5.0 <sup>113887</sup>	6.6 <sup>111757</sup>
<b>HP (&gt;500 kPa)</b>	5.0 <sup>14678</sup>	5.7 <sup>14310</sup>
<b>MP (10 kPa - 500 kPa)</b>	2.3 <sup>68729</sup>	2.6 <sup>67518</sup>
<b>LP (10 Pa - 10 kPa)</b>	9.8 <sup>28232</sup>	13.1 <sup>27687</sup>
<b>ELP (&lt;10 Pa)</b>	25.7 <sup>2211</sup>	55.2 <sup>2205</sup>

NC – number of compounds

## Detailed Results (Relative Mean Deviation (%))

Group	NC	ELP	LP	MP	HP	total
All oxygen compounds	638	27.3 <sup>882</sup>	12.4 <sup>10919</sup>	2.9 <sup>22708</sup>	6.3 <sup>2175</sup>	6.5 <sup>36701</sup>
Carboxylic acids	35	23.9 <sup>116</sup>	12.2 <sup>1823</sup>	3.8 <sup>1106</sup>	13.8 <sup>10</sup>	9.6 <sup>3056</sup>
Aromatic carboxylic acids	1	-	1.6 <sup>111</sup>	2.7 <sup>22</sup>	-	1.8 <sup>133</sup>
Aliphatic carboxylic acids	34	23.9 <sup>116</sup>	12.8 <sup>1712</sup>	3.8 <sup>1084</sup>	13.8 <sup>10</sup>	9.9 <sup>2923</sup>
Alcohols	167	28.3 <sup>312</sup>	17.2 <sup>3761</sup>	4.1 <sup>7186</sup>	10.8 <sup>626</sup>	9.2 <sup>11886</sup>
Aromatic alcohols	55	39.9 <sup>26</sup>	25.1 <sup>678</sup>	3.1 <sup>1277</sup>	6.9 <sup>69</sup>	11.0 <sup>2050</sup>
Aliphatic alcohols	112	27.3 <sup>286</sup>	15.5 <sup>3083</sup>	4.3 <sup>5909</sup>	11.3 <sup>557</sup>	8.8 <sup>9836</sup>
Ethers	92	23.7 <sup>17</sup>	6.5 <sup>771</sup>	1.8 <sup>3743</sup>	3.4 <sup>738</sup>	2.8 <sup>5269</sup>
Esters	158	29.0 <sup>326</sup>	8.4 <sup>2445</sup>	2.2 <sup>5622</sup>	5.6 <sup>403</sup>	5.1 <sup>8809</sup>
Ketones	64	19.0 <sup>75</sup>	8.9 <sup>886</sup>	1.9 <sup>2637</sup>	4.4 <sup>271</sup>	4.0 <sup>3869</sup>
Aldehydes	30	6.1 <sup>4</sup>	12.1 <sup>393</sup>	2.4 <sup>736</sup>	5.1 <sup>19</sup>	5.7 <sup>1153</sup>
Carbonate diesters	3	-	1.8 <sup>30</sup>	0.8 <sup>289</sup>	-	0.9 <sup>319</sup>
Anhydrides	6	-	14.9 <sup>54</sup>	4.4 <sup>81</sup>	-	8.6 <sup>135</sup>
Epoxides	11	-	2.9 <sup>33</sup>	1.8 <sup>280</sup>	2.3 <sup>43</sup>	1.9 <sup>356</sup>
Carbonates	3	38.7 <sup>3</sup>	9.1 <sup>150</sup>	3.2 <sup>92</sup>	4.4 <sup>10</sup>	7.2 <sup>255</sup>
Ureas	5	14.8 <sup>3</sup>	10.5 <sup>59</sup>	2.2 <sup>40</sup>	-	7.4 <sup>102</sup>

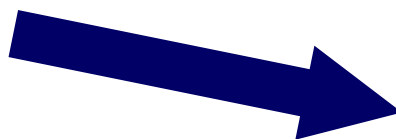
NC – number of compounds  
 LP – low pressure 10 Pa < P < 10 kPa  
 HP – high pressure P > 500 kPa

ELP – extremely low pressure P < 10 Pa  
 MP – medium pressure 10 kPa < P < 500 kPa  
 total – whole vapour pressure range

## Quality Analysis

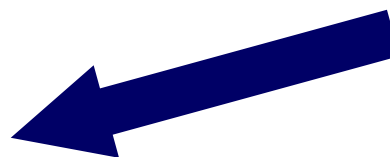
- Can use the error tables to give an approximate quality of prediction:

Compound to be predicted

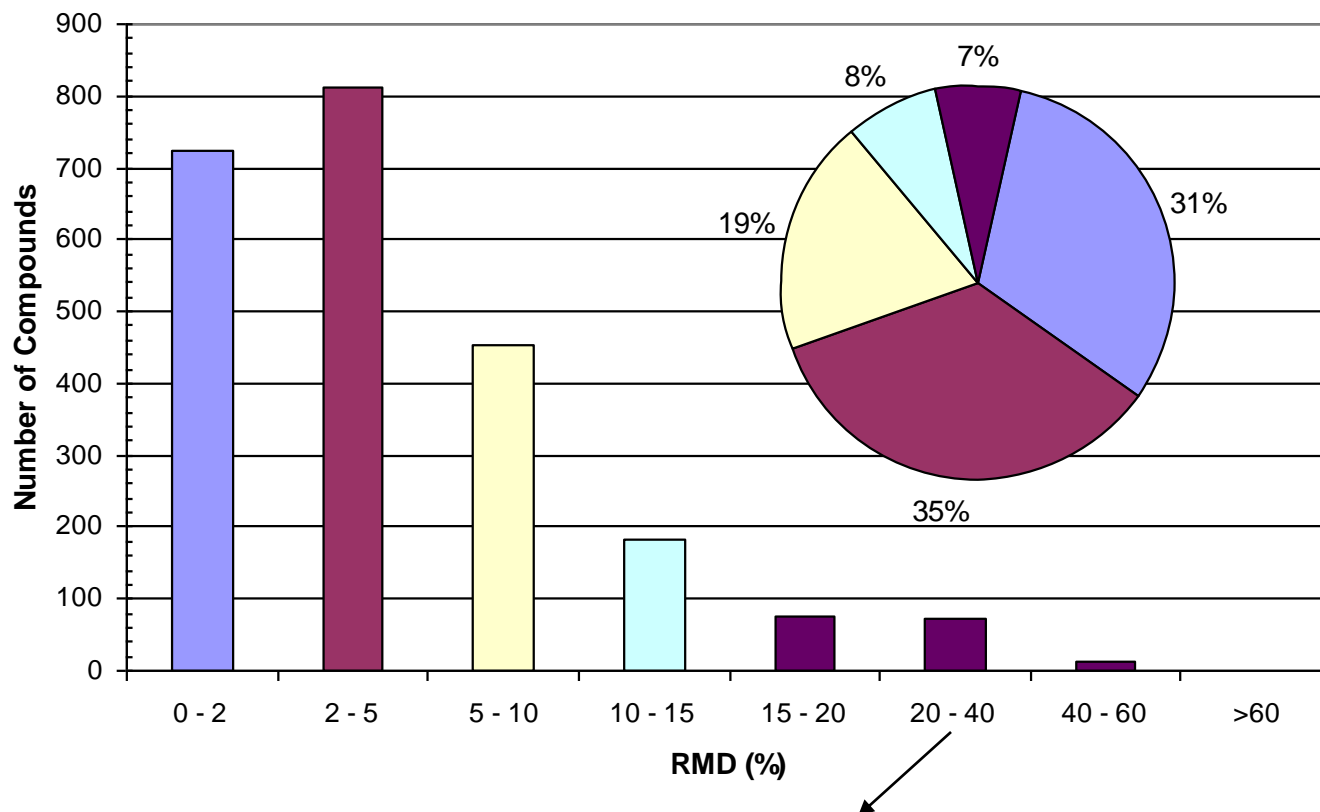


Select most specific group which the compound falls into (e.g. n-alcohols)

Give quality analysis based on training set errors



# RMD(%) Histogram for the Data in the Training Set



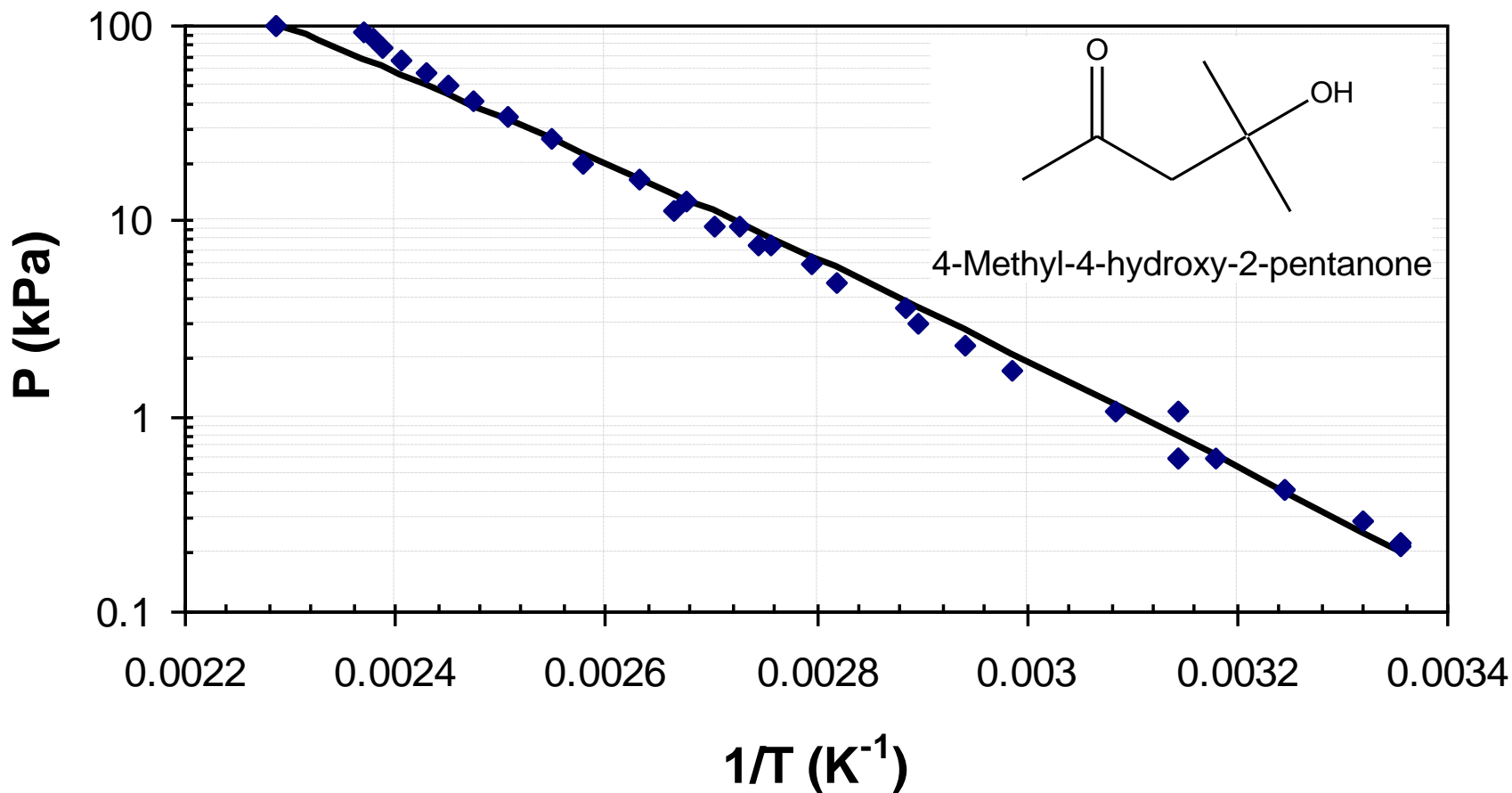
Typically compounds with large amounts of low vapour pressure data for example squalane (C<sub>30</sub>H<sub>62</sub>)

## Results for a Test Set not Used in the Regression

Compound Class	New Method		Nannoolal et al.	
	NC	RMD%	NC	RMD%
Hydrocarbons	59	6.5 <sup>486</sup>	59	7.5 <sup>486</sup>
Halogen compounds	14	7.0 <sup>73</sup>	14	7.1 <sup>73</sup>
Oxygen compounds	46	7.1 <sup>1952</sup>	44	8.5 <sup>1938</sup>
Nitrogen compounds	19	7.3 <sup>172</sup>	18	8.9 <sup>169</sup>
Sulfur compounds	3	5.6 <sup>24</sup>	3	11.0 <sup>24</sup>
All compounds	157	7.1 <sup>2879</sup>	154	8.2 <sup>2859</sup>

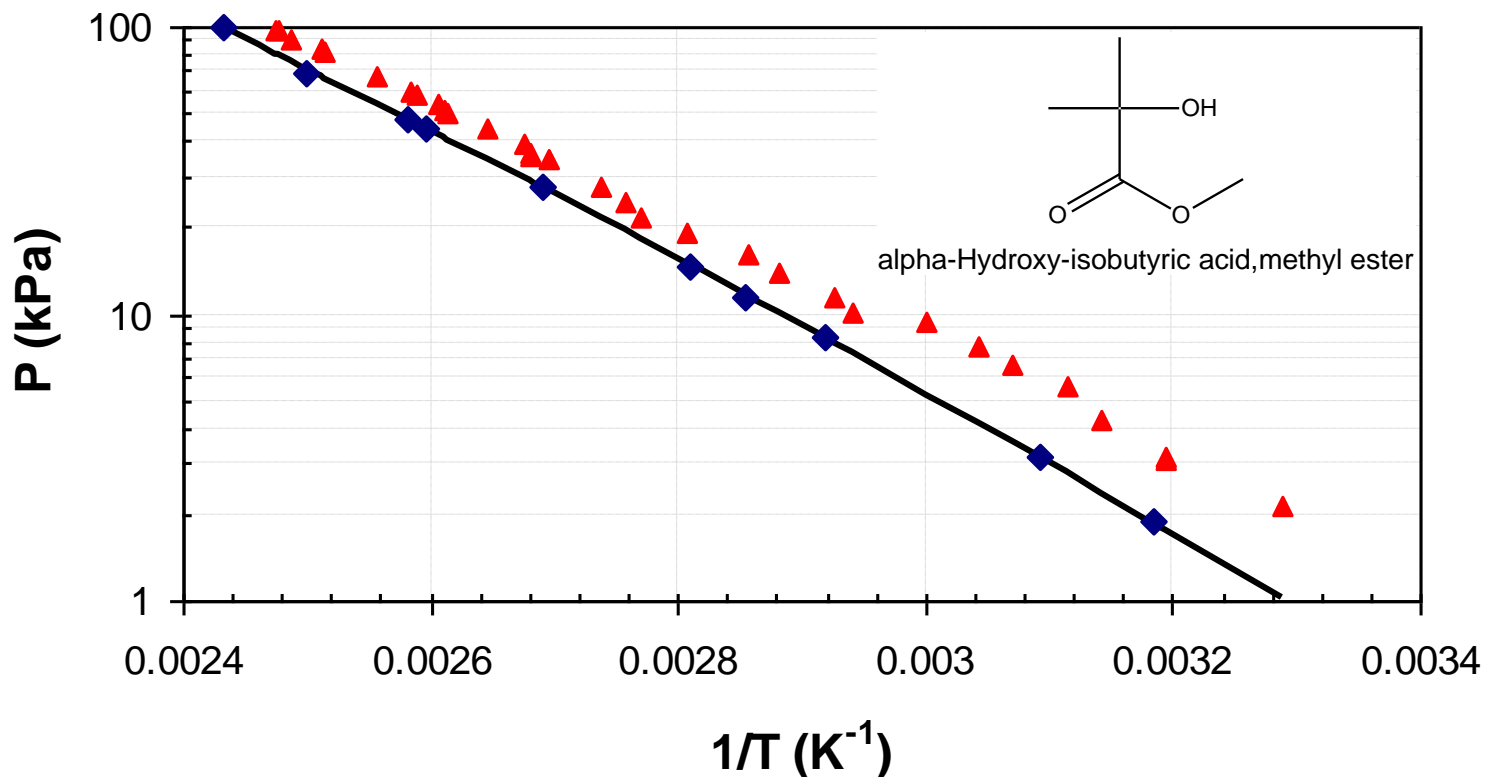
Test set contains data with higher scatter or where the reliability could not be verified (only one author, ...)

# Specific Test Set Examples





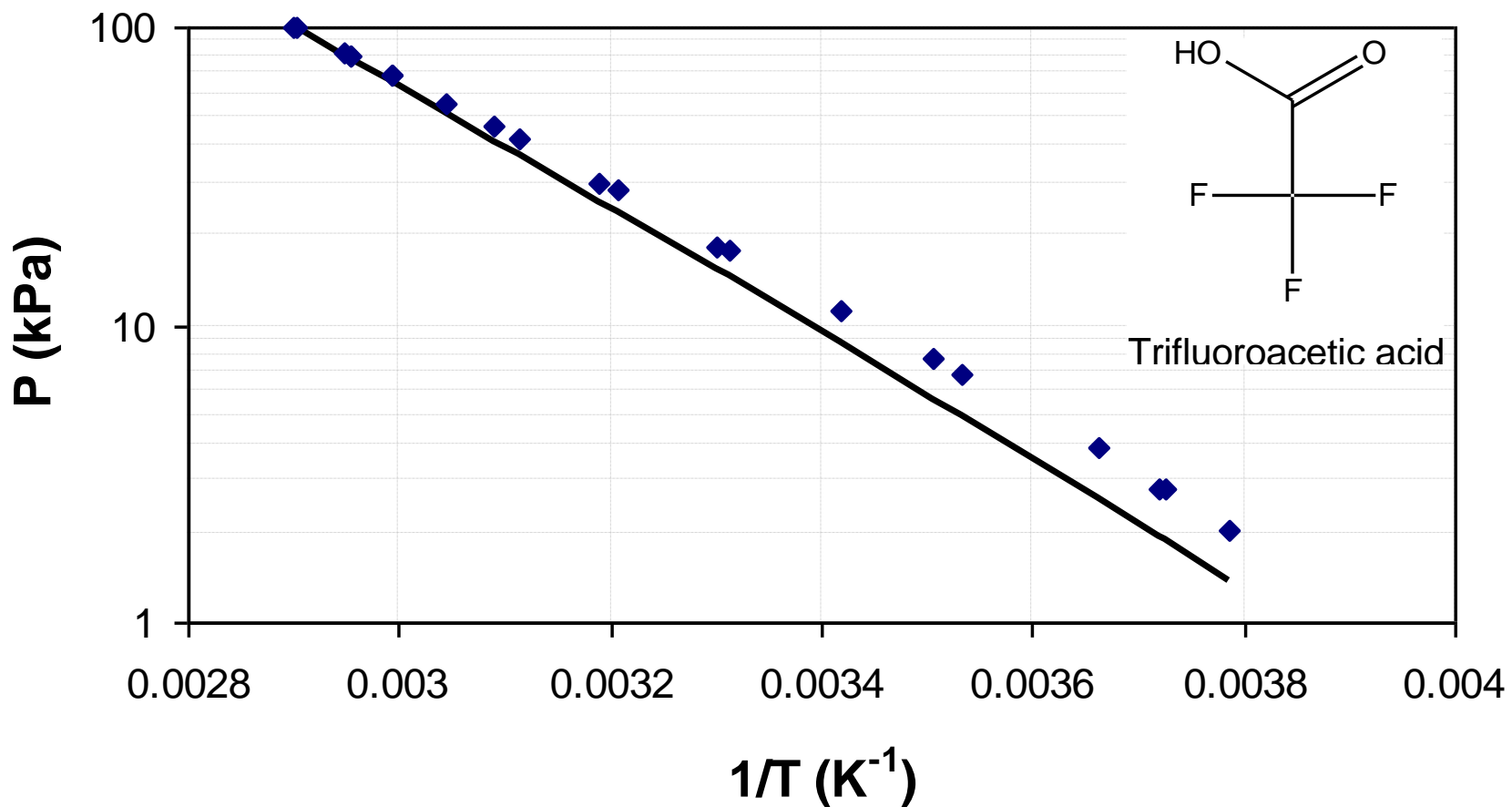
## Specific Test Set Examples



◆ Danov S.M., Obmelyukhina T.N., Chubarov G.A., Balashov A.L., Dolgoplov A.A.,  
J.Appl.Chem.USSR, 63(3), 566-568, 1990

▲ Matin N.B., Khitrin S.V., Spasskaya R.I., Trachenko V.I., Zilberman E.N., Soluyanova T.F.,  
Zh.Prikl.Khim.(Leningrad), 53(9), 1999-2003, 1980

# Specific Test Set Examples





## Heat of Vaporization at 298.15 K

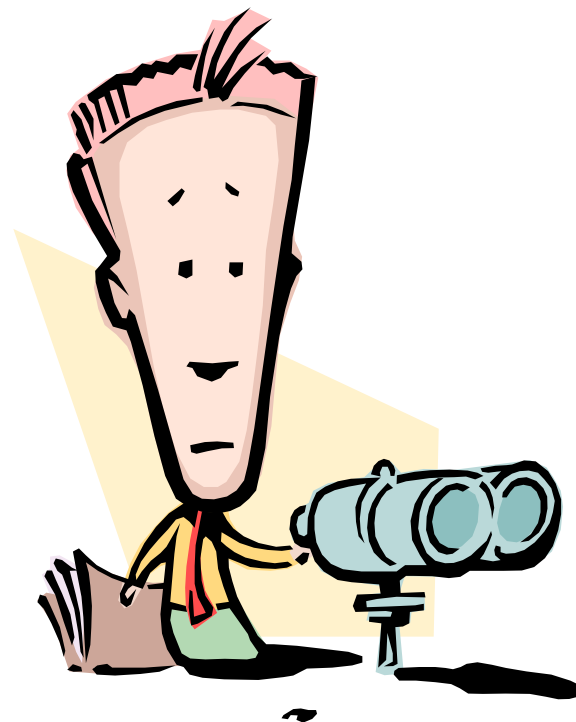
$$\Delta H_{vap} = -R\Delta Z_{vap} \left[ B' \frac{(C(T_b) - T_b)}{\left(1 - \frac{C(T_b)}{T}\right)^2} - D'T \right]$$

Compound Class	This Work		Kolská et al.*	
	NC	RMD(%)	NC	RMD(%)
Hydrocarbons	197	2.9	236	2.0
Halogen Compounds	89	2.1	103	2.0
Oxygen Compounds	224	4.2	262	2.3
Nitrogen Compounds	101	2.9	104	2.4
Phosphorous Compounds	1	6.9	-	-
Sulphur Compounds	38	2.6	52	2.2
Metals	4	5.6	-	-
Other Compounds	1	7.4	-	-
Silicon Compounds	12	9.2	11	3.1
All Compounds	718	3.5	831	2.2

\*Kolská Z., Růžička V., Gani R., Ind. Eng. Chem. Res., 44, 8436-8454, 2005

## Future Work

- Prediction of further properties
  - Ground work has been done
  - Overlap project so there is a transfer of knowledge
- Prediction of mixture properties



## Acknowledgements

### Supervisor:

- Prof. J. Rarey

### Project Leaders:

- Prof. D. Ramjugernath
- Prof. J. Gmehling

### Software:

- DDBST GmbH

