

small group group additivity

based on a presentation at GEOPIG meeting 2011-05-10

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- Additivity is useful for some tasks
 - Group contributions come from known properties of model compounds
 - Use them to estimate thermodynamic properties of compounds lacking experimental data
 - Can it be used for properties of interesting molecules, e.g. metabolites?
 - Challenge: Apply group additivity to highly substituted molecules

Scheme 1: Big Groups

ethane $2[-\text{CH}_3]$

propane $2[-\text{CH}_3] + [-\text{CH}_2-]$

ethanol $[-\text{CH}_3] + [-\text{CH}_2\text{OH}]$

acetic acid $[-\text{CH}_3] + [\text{COOH}]$

- These structural groups were used by Amend and Helgeson [1997] for predictions of properties of homologous series with carbon number ≥ 2 .

Equations = Unknowns (Determined System)

A	$[-CH_3]$	$[-CH_2-]$	$[-CH_2OH]$	$[-COOH]$	X	B
ethane	2				$X_{[-CH_3]}$	88.3
propane	2	1			$X_{[-CH_2-]}$	110.6
ethanol	1		1		$X_{[-CH_2OH]}$	62.2
acetic acid	1			1	$X_{[-COOH]}$	40.56

× =

- Matrix (A) represents a group contribution model.
- Vector of knowns (B) here contains values of C_p° (standard molal heat capacity in $\text{cal K}^{-1} \text{mol}^{-1}$) for aqueous species.
- Known values are based on experiments (those here are available in thermodynamic database of CHNOSZ).
- Solve for X (in $A \times X = B$) to get group contribution values.

Equations = Unknowns (Determined System)

- Solve the system in R:

```
> A <- matrix(c(2, 2, 1, 1, 0, 1, 0, 0, 0, 0, 1, 0,
               0, 0, 0, 1), 4)
> b <- c(88.3, 110.6, 62.2, 40.56)
> x <- solve(A, b)
> names(x) <- c("CH3", "CH2", "CH2OH", "COOH")
> x
```

```
CH3    CH2 CH2OH  COOH
44.15  22.30 18.05 -3.59
```

- Compare with literature values [Amend and Helgeson, 1997]
obtained from consideration of many more model compounds in
homologous series.

```
> Cp.AH97 <- c(CH3 = 47, CH2 = 20.7, CH2OH = 17.28,
               COOH = -5.94, CHCH3 = 39.92)
> Cp.AH97
```

```
CH3    CH2 CH2OH  COOH CHCH3
47.00  20.70 17.28 -5.94 39.92
```

Equations > Unknowns (Overdetermined System)

- Consider more species, as well as an additional group: ketone group, [-CO-].
- Heat capacities are reported values (mostly from experiments) in $\text{cal K}^{-1} \text{mol}^{-1}$.

	C_p	[-CH3]	[-CH2-]	[-CH2OH]	[-CO-]	[-COOH]
ethane	88.30	2				
propane	110.60	2	1			
butane	133.90	2	2			
ethanol	62.20	1		1		
1-propanol	84.30	1	1	1		
1-butanol	104.40	1	2	1		
1-pentanol	125.20	1	3	1		
acetone	57.70	2			1	
butanone	80.40	2	1		1	
3-pentanone	102.37	2	2		1	
2-heptanone	144.00	2	4		1	
acetic acid	40.56	1				1
propanoic acid	60.50	1	1			1
butanoic acid	80.50	1	2			1

Approximate Solutions for Overdetermined Systems

- Least-squares solution is possible with QR decomposition.
- Example below takes after help page for `qr.solve` in base R.
- Four equations, three unknowns

```
> set.seed(24)
> print(A <- matrix(runif(12), 4))
      [,1]      [,2]      [,3]
[1,] 0.2925740 0.6626196 0.8016306
[2,] 0.2248911 0.9204438 0.2547251
[3,] 0.7042230 0.2797356 0.6048889
[4,] 0.5188971 0.7638205 0.3707349
> b <- 1:4
> x <- qr.solve(A, b)
> as.numeric(A %*% x)
[1] 0.9023479 2.3515328 3.2438201 3.5718037
```

- $A \times X$ gives us an approximation of B .

Fitting 14 Species Using 5 Big Groups

- Read the group contribution matrix. Only take selected groups (iuse) at this time.

```
> file.big <- system.file("extdata/thermo/groups_big.csv",  
  package = "CHNOSZ")  
> A.big <- read.csv(file.big, check.names = FALSE,  
  row.names = 1)  
> iuse <- c("ethane", "propane", "butane", "ethanol",  
  "1-propanol", "1-butanol", "1-pentanol", "acetone",  
  "butanone", "3-pentanone", "2-heptanone", "acetic acid",  
  "propanoic acid", "butanoic acid")  
> A.big <- A.big[iuse, ]  
> A.big[is.na(A.big)] <- 0
```

- Get the values of heat capacity of the aqueous model species. CHNOSZ warns about some inconsistencies between heat capacities listed in the database and values calculated using equations-of-state parameters.

```
> ispecies <- info(rownames(A.big), quiet = TRUE)  
> cp.species <- info(ispecies)$Cp
```

```
checkEOS: Cp of ethane aq differs by -9.4 from tabulated value  
checkEOS: Cp of propane aq differs by -15.14 from tabulated value  
checkEOS: V of propane aq differs by -1.45 from tabulated value  
checkEOS: Cp of propanoic acid aq differs by 1.42 from tabulated value
```


Performance of “Big Groups” Model

- Calculate least-squares solution.

```
> cp.big <- qr.solve(A.big, cp.species)
> cp.big
```

[-CH3]	[-CH2-]	[-CH2OH]	[-CO-]	[-COOH]
44.807300	21.318732	17.239601	-30.804883	-5.606033

- What is the root mean square deviation (RMSD) between predicted and known values? (Note: rmsd used here is a simple function in CHNOSZ, not base R.)

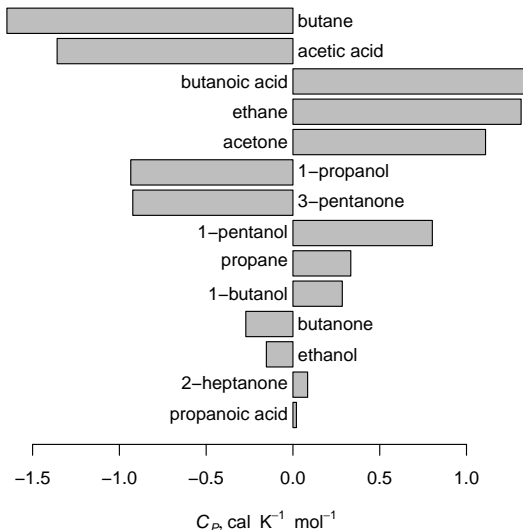
```
> pred.big <- as.matrix(A.big) %*% cp.big
> rmsd <- rmsd(pred.big, cp.species)
> rmsd
[1] 0.9250488
```

- We can also calculate and plot the residuals. residualsplot in CHNOSZ uses R's barchart function and adds labels and a title.

```
> residuals <- pred.big - cp.species
> names(residuals) <- rownames(A.big)
> residuals <- residuals
> residualsplot(residuals, "Cp", "big groups (added)")
```

Big Groups ... when added

residuals in Cp using big groups model



- Additivity is useful for some tasks
- Big groups have their place
 - Large structural groups; no nearest-neighbor effects
 - Can we apply them to a wider variety of compounds?

Equations > Unknowns (Overdetermined System)

- Now more species. For some of them we have to use negative group contributions.

	Cp	[-CH3]	[-CH2-]	[-CH2OH]	[-CO-]	[-COOH]
(1) ethane	88.30	2				
(2) propane	110.60	2	1			
(3) butane	133.90	2	2			
(4) methanol	37.80	1	-1	1		
(5) ethanol	62.20	1		1		
(6) 1-propanol	84.30	1	1	1		
(7) 1-butanol	104.40	1	2	1		
(8) 1-pentanol	125.20	1	3	1		
(9) 3-pentanol	130.21	1	3	1		
(10) 2-propanol	86.28	1	1	1		
(11) 2-butanol	107.34	1	2	1		
(12) 2-pentanol	131.17	1	3	1		
(13) acetone	57.70	2			1	
(14) butanone	80.40	2	1		1	
(15) 3-pentanone	102.37	2	2		1	
(16) 2-heptanone	144.00	2	4		1	
(17) acetaldehyde	34.90	2	-1		1	
(18) acetic acid	40.56	1				1
(19) propanoic acid	60.50	1	1			1
(20) butanoic acid	80.50	1	2			1
(21) 2-methylpropanoic acid	79.83	3	-1			1
(22) 2,4-dimethyl-3-pentanone	100.86	6	-2		1	
(23) lactic acid	66.70		1	1		1
(24) citric acid	73.47	-2	4	1		3

Fitting 24 Species Using 5 Big Groups

- Read the group contribution matrix.

```
> file.big <- system.file("extdata/thermo/groups_big.csv",  
  package = "CHNOSZ")  
> A.big <- read.csv(file.big, check.names = FALSE,  
  row.names = 1)  
> A.big[is.na(A.big)] <- 0
```

- Get the values of heat capacity of the aqueous model species.

```
> ispecies <- info(rownames(A.big), quiet = TRUE)  
> cp.species <- info(ispecies, quiet = TRUE)$Cp
```

- Calculate least-squares solution.

```
> i.big <- 1:24  
> cp.big <- qr.solve(A.big[i.big, ], cp.species[i.big])  
> cp.big  
      [-CH3]      [-CH2-]      [-CH2OH]      [-CO-]      [-COOH]  
32.924314  25.624264  24.839122 -18.176013   4.627111
```

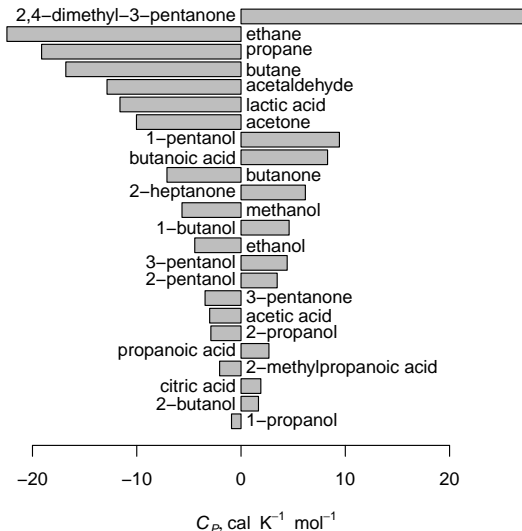
- Calculate the RMSD

```
> pred.big <- as.matrix(A.big) %*% cp.big  
> rmsd <- rmsd(pred.big[i.big], cp.species[i.big])  
> rmsd  
[1] 10.59658
```

- Plot the residuals.

Big Groups ... when added and subtracted

residuals in Cp using big groups model



- Additivity is useful for some tasks
- Big groups have their place
 - Large structural groups; no nearest-neighbor effects
 - Can we apply them to a wider variety of compounds?
 - Have negative group contributions for some compounds of interest (e.g. citric acid)
 - Large error for this type of calculation. Keep experimental error in mind too!

scheme 2: small groups

ethane	$2 \times \text{C}-(\text{H})_3(\text{C})$
propane	$2 \times \text{C}-(\text{H})_3(\text{C}) + \text{C}-(\text{H})_2(\text{C})_2$
ethanol	$\text{C}-(\text{H})_3(\text{C}) + \text{C}-(\text{H})_2(\text{O})(\text{C}) + \text{O}-(\text{H})(\text{C})$
acetic acid	$\text{C}-(\text{H})_3(\text{C}) + \text{CO}-(\text{O})(\text{C}) + \text{O}-(\text{H})(\text{CO})$

- 4 equations (model compounds), 6 unknowns (groups)
- The system above is underdetermined.

small groups definitions

group	class	group	class
C-(H)3C	methyl	CO-(HorO)(C)	acid, ester, aldehyde
C-(H)2(C)2	methylene	C-(H)3(CO)	ketone
CH3corr(tert)	tertiary	CO-(C)2	ketone
O-(H)(C)	alcohol	C-(HorO)(H)(CO)(C)	ketone, acid, alcohol
C-(H)2(O)(C)	alcohol, ester	O-(H)(CO)	acid
C-(H)(O)(C)2	alcohol, peroxide	C-(H)(CO)(C)2	acid

- Additivity scheme is adapted from Benson and Buss [1958] and Domalski and Hearing [1993]
 - CO-(HorO)(C) is merged from CO-(O)(C) [acids, esters] and CO-(H)(C) [aldehydes] (e.g., acetaldehyde).
 - C-(HorO)(H)(CO)(C) is merged from C-(H)2(CO)(C) [ketones, acids] and C-(H)(O)(CO)(C) [alcohols] (e.g., citric acid).
- These adaptations are necessary because for this example we are using a limited set of model compounds.
- Asterisks on next page indicate species added to database in CHNOSZ for this example, needed to make a non-singular matrix of group contributions.

small groups matrix (partially overdetermined)

	$C_1(H)_3C$	$C_1(H)_2(C)_2$	$O_1(H)(C)$	$C_1(H)_2(O)(C)$	$C_1(H)(O)(C)_2$	$CH_3COH(tert)$	$C_1(H)_3(CO)$	$CO_1(C)_2$	$C_1(H_6O)(H)(CO)(C)$	$CO_1(H_6O)(C)$	$O_1(H)(CO)$	$C_1(H)(CO)(C)_2$
ethane	2											
propane	2	1										
butane	2	2										
methanol	1		1									
ethanol	1		1	1								
1-propanol	1	1	1	1								
1-butanol	1	2	1	1								
1-pentanol	1	3	1	1								
3-pentanol *	2	2	1		1							
2-propanol *	2		1		1	2						
2-butanol *	2	1	1		1	1						
2-pentanol *	2	2	1		1	1						
acetone							2	1				
butanone	2							1	1			
3-pentanone *	2							1	2			
2-heptanone	2	2						1	2			
acetaldehyde	1									1		
acetic acid	1									1	1	
propanoic acid	1								1	1	1	
butanoic acid	1	1							1	1	1	
2-methylpropanoic acid *	2				2					1	1	1
2,4-dimethyl-3-pentanone *	4				4		1					2
lactic acid	1		1		1				1	1		
citric acid			1			1			3	3	2	
isocitric acid			1						2	3	3	1

fitting 24 species using 12 small groups

- Read the group contribution matrix.

```
> file.small <- system.file("extdata/thermo/groups_small.csv",  
  package = "CHNOSZ")  
> A.small <- read.csv(file.small, check.names = FALSE,  
  row.names = 1)  
> A.small[is.na(A.small)] <- 0
```

- The small groups matrix has an additional row for isocitrate, but its heat capacity is not available in the database.

```
> ispecies <- info(head(rownames(A.small), -1), quiet = TRUE)  
> cp.species <- info(ispecies, quiet = TRUE)$Cp  
> cp.species <- c(cp.species, NA)
```

- Calculate least-squares solution.

```
> i.small <- 1:24  
> cp.small <- qr.solve(A.small[i.small, ], cp.species[i.small])  
> cp.small
```

C-(H)3C	C-(H)2(C)2	O-(H)(C)
42.752115	20.740304	3.299958
C-(H)2(O)(C)	C-(H)(O)(C)2	CH3corr(tert)
16.862471	8.544542	-9.524111
C-(H)3(CO)	CO-(C)2	C-(HorO)(H)(CO)(C)
47.185790	-34.186490	24.205239
CO-(HorO)(C)	O-(H)(CO)	C-(H)(CO)(C)2
-7.852115	10.537020	4.979678

performance of “small groups” model

- Calculate predicted values and RMSD.

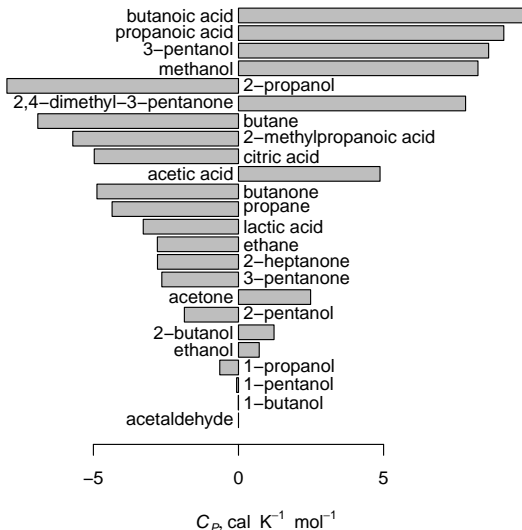
```
> pred.small <- as.matrix(A.small) %*% cp.small  
> rmsd <- rmsd(pred.small[i.small], cp.species[i.small])  
> rmsd  
[1] 5.266396
```

- It's smaller than what we got using the big groups!
- Plot the residuals.

```
> residuals <- pred.small - cp.species  
> names(residuals) <- rownames(A.small)  
> residuals <- residuals[i.small]  
> residualsplot(residuals, "Cp", "small groups")
```

- Residuals of 0 are where the system is not overdetermined (acetaldehyde in this model has its “own” group).

residuals in Cp using small groups model



- Additivity is useful for some tasks
- Big groups have their place
- small groups aren't perfect either
 - More detail about molecular structures – bond information
 - Improved overall fit compared to large groups
 - Does it help us get closer to lactic and citric acids, or others?

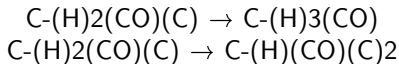
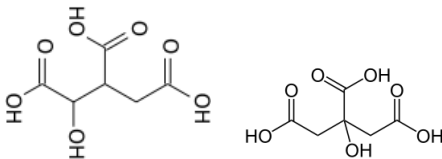
Lactic and Citric and Isocitric

- Heat capacities of the aqueous species ($\text{cal K}^{-1} \text{mol}^{-1}$)

	database	big groups	small groups
lactic acid	66.7	55.09	63.42
citric acid	73.47	75.37	68.5
isocitric acid	NA	NA	64.74

- Big groups actually get pretty close to citric acid, but they give no hint about the properties of isomerization.
- We are modeling isomerization as disproportionation. In the pictures, the second carbon gains a hydrogen and the third carbon loses one.

Isocitric Acid \rightarrow Citric Acid



- Additivity is useful for some tasks
- Big groups have their place
- small groups aren't perfect either
- Extend to other properties ... find more model compounds ...

- J. P. Amend and H. C. Helgeson. Group additivity equations of state for calculating the standard molal thermodynamic properties of aqueous organic species at elevated temperatures and pressures. *Geochim. Cosmochim. Acta*, 61:11 – 46, 1997. doi: 10.1016/S0016-7037(96)00306-7.
- S. W. Benson and J. H. Buss. Additivity rules for the estimation of molecular properties. Thermodynamic properties. *J. Chem. Phys.*, 29: 546 – 572, 1958. doi: 10.1063/1.1744539.
- E. S. Domalski and E. D. Hearing. Estimation of the thermodynamic properties of C-H-N-O-S-Halogen compounds at 298.15 K. *J. Phys. Chem. Ref. Data*, 22:805 – 1159, 1993. doi: 10.1063/1.555927.