

# 50 Years of Scientific Computing: from Floating Point to Integers

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50 years ago....

$$\frac{\pi}{4} = 1 - \frac{1}{3} + \frac{1}{5} - \frac{1}{7} + \frac{1}{9} - \frac{1}{11} + \frac{1}{13} \dots$$

This is a very poor algorithm.

**It is all about the algorithms.**

48 years ago....

The Perkin-Elmer Thermal Analysis

Suite of Codes, including

Differential scanning calorimeter codes

- Purity detection
- Baseline correction

**It is all about code correctness.**

Some years later .... Worked with Bill Pritchard and Simon Tavener [5]

Used Crouzeix-Raviart nonconforming piecewise linear element

Coercive for the gradient formulation

Not coercive for the strain formulation

**Check your math carefully  
before designing the code**

Thirty years ago .... Fusions

$$x@p = y@q$$

Implementation: the Golden Rule

- First see if you should send data to someone else; if so, do so
- Then receive any data that this statement implies

**Deterministic: avoids race conditions**

L. R. Scott, J. M. Boyle, and B. Bagheri. Distributed data structures for scientific computation. In *Hypercube Multiprocessors 1987*, M. T. Heath, ed., pages 55–66. Philadelphia: SIAM, 1987.

PC and Pfortran were used for many projects

Molecular Dynamics code GROMOS  
parallelized with Pfortran by Terry Clark

However there were less than 20 parallel lines  
of code in a 70K deck

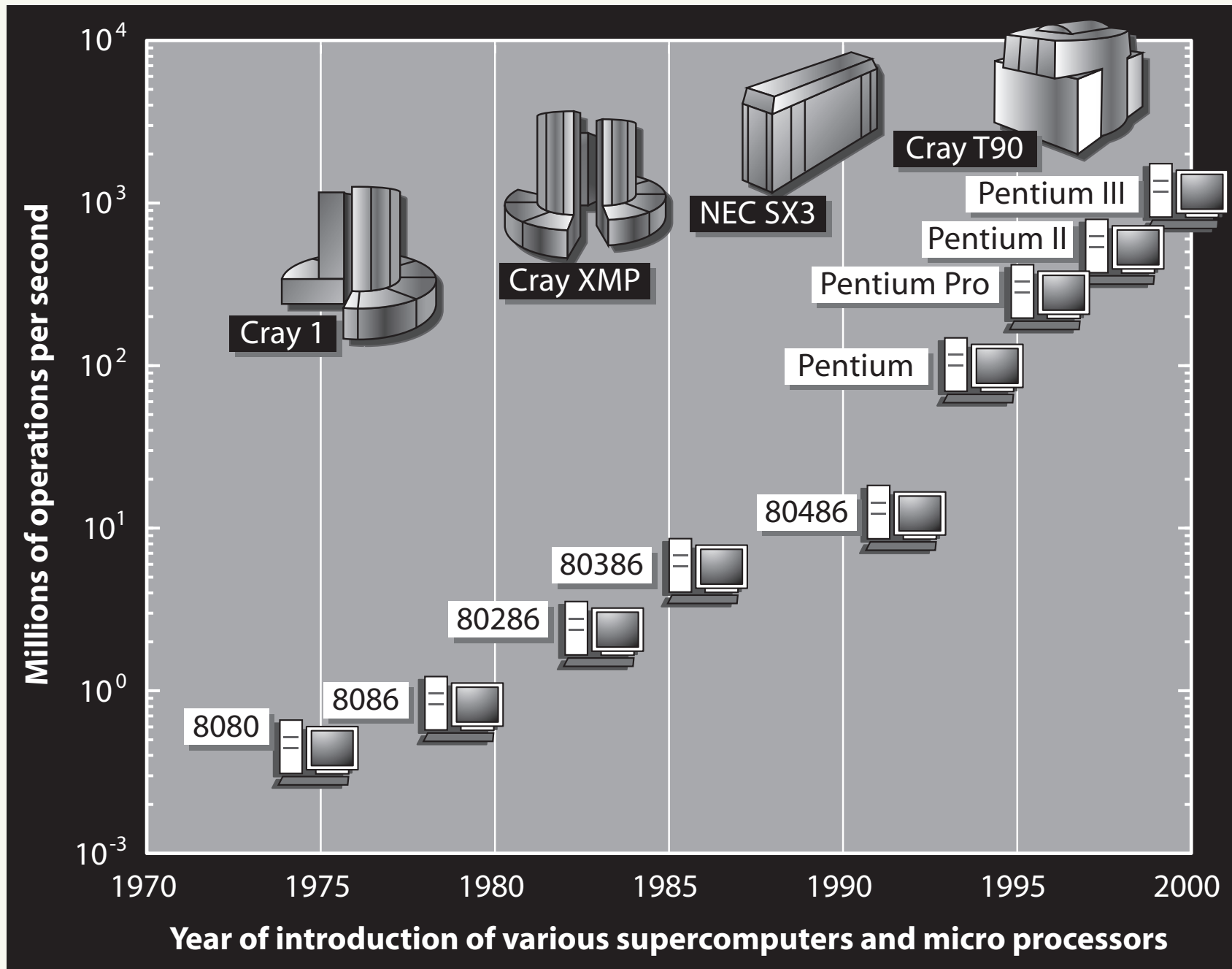
**The algorithms are more important than  
the parallel programming language**

But fusions could augment message passing  
providing deadlock-free code

# Depiction of a critical section.

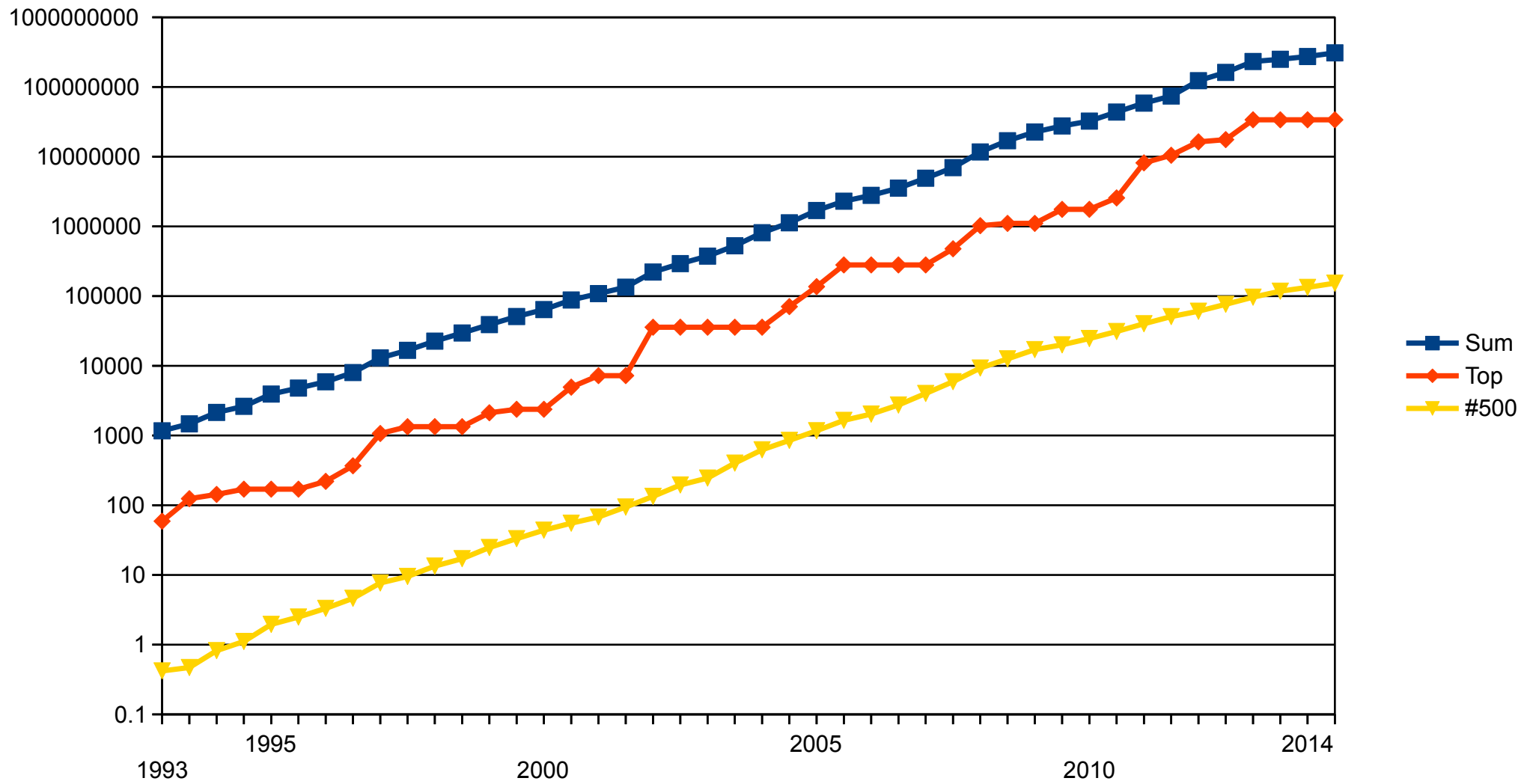


# Scientific Parallel Computing; Scott, Clark & Bagheri, Princeton 2005





# Top 500 supercomputers, Moore's Law



We solved 6-D Schrödinger equations with a finite difference method using tensor contraction techniques

For a given positive integer  $r$ , the (simplified) rank- $r$  Tensor-Train format contains all elements  $\mathbf{A}$  such that

$$A_{i_1, \dots, i_d} = A_{i_1}^{(1)} A_{i_2}^{(2)} \cdots A_{i_d}^{(d)},$$

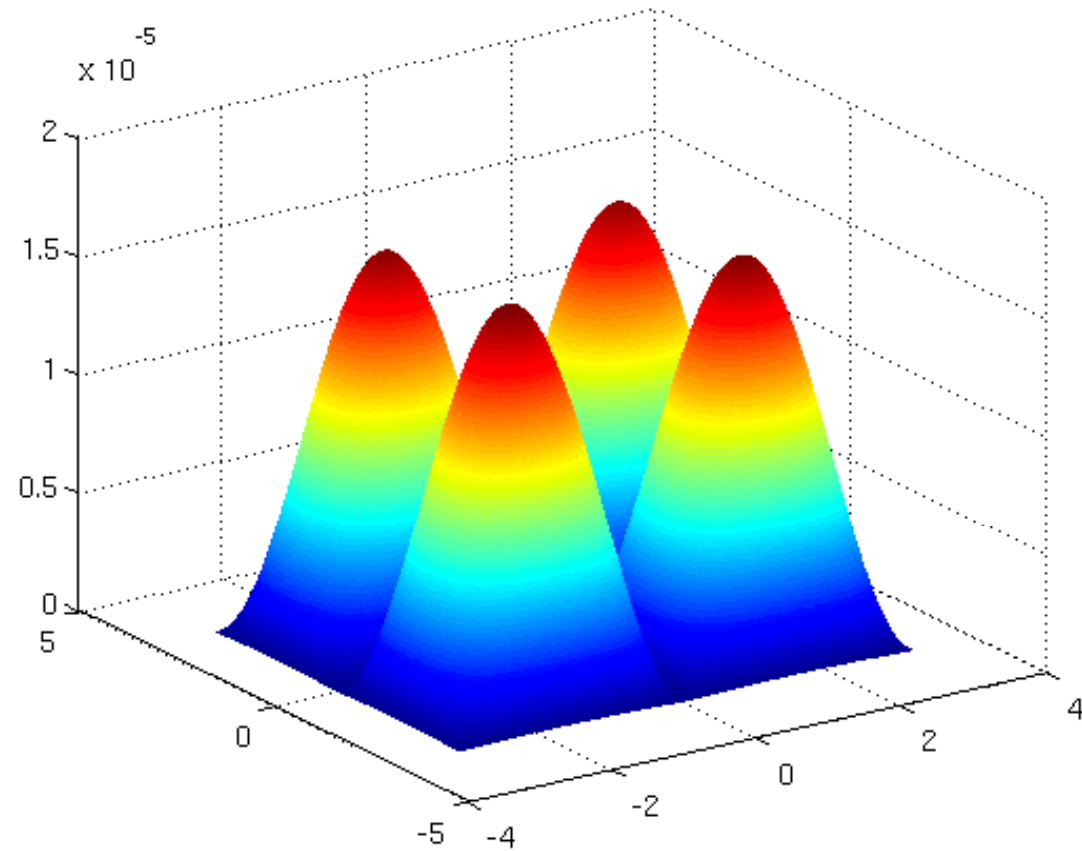
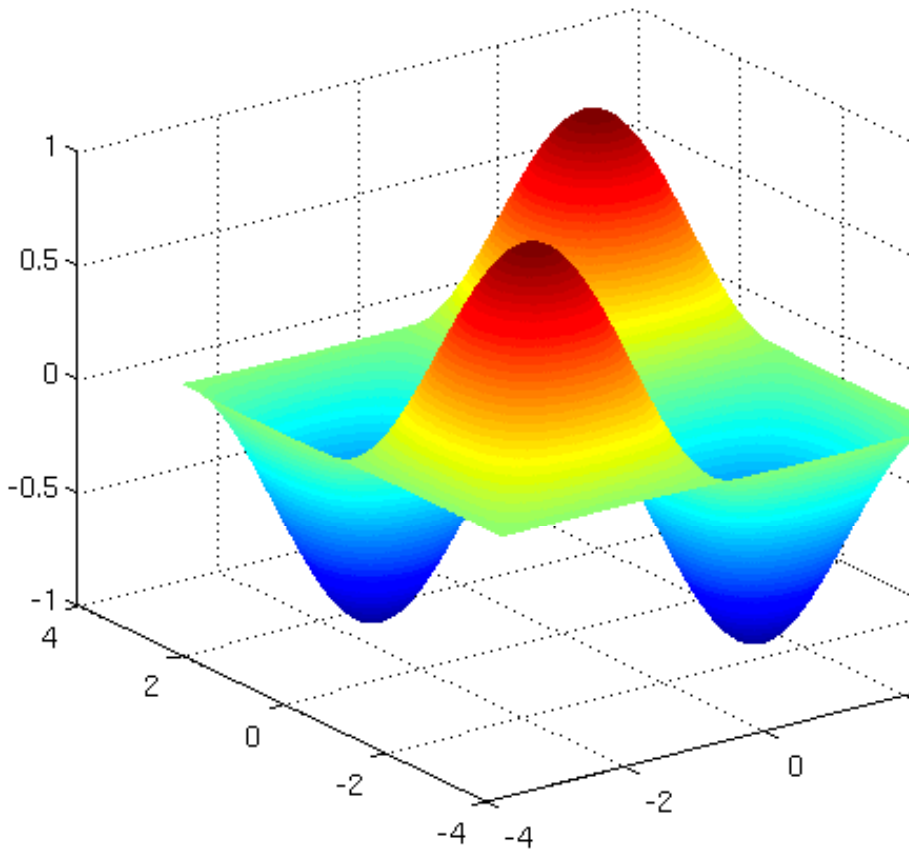
where each  $A_{i_k}^{(k)}$  are  $r \times r$  matrices.

The  $A^{(k)}$  can be considered as three-dimensional arrays of size  $r^2 \times n$  and are called *cores* of the TT-tensor  $\mathbf{A}$ .

More generally,  $r$ 's can be different for each  $i$  and we define an effective rank based on an average.

We used the TT-toolbox 2.2 by I. Oseledets  
`spring.inm.ras.ru/osel`

# Test problem



Test solution  $Z$  (left) and pointwise error  $Z - Z_h$  (right) evaluated at  $(\cdot, \frac{\pi}{2}, \frac{\pi}{2}, \cdot, \frac{\pi}{2}, \frac{\pi}{2})$  for  $n = 2^{10}$  in each direction of 6 dimensions.

$$(H_0 - \lambda_0)Z = \left(4 - \frac{1}{|x|} - \frac{1}{|y|}\right) \prod_{i=1}^3 \sin(x_i) \prod_{j=1}^3 \sin(y_j).$$

Real problem:  $n = 2^{12}$

$R$	$\lambda_R - \lambda_0$	“exact”	rank
$R = 10.0$	$-8.9520 \cdot 10^{-6}$	$-8.754 \cdot 10^{-6}$	27.7
$R = 12.0$	$-2.3335 \cdot 10^{-6}$	$-2.546 \cdot 10^{-6}$	49.5
$R = 14.0$	$-9.5037 \cdot 10^{-7}$		37.4
$R = 16.0$	$-4.1749 \cdot 10^{-7}$		20.8
$R = 18.0$	$-2.0325 \cdot 10^{-7}$		39.2
$R = 20.0$	$-1.0673 \cdot 10^{-7}$		38.7
$R = 22.0$	$-5.9265 \cdot 10^{-8}$		40.4
$R = 24.0$	$-3.5191 \cdot 10^{-8}$		39.7
$R = 26.0$	$-2.1657 \cdot 10^{-8}$		40.7

Number of grid points approaches Avogadro's Number.

Exact values from TABLE II, Relativistic energies of the ground state of the hydrogen molecule, L. Wolniewicz, J. Chem. Phys. 99, 1851 (1993).

### First steps towards automation

#### A finite element code in Ada

- most errors caught at compile time due to type mismatch

#### fec: C++ library (Babak Bagheri)

- used in theses by several students and post-docs at the U. Houston [2, 3, 4, 6, 7]

L. R. Scott and B. Bagheri. Software environments for the parallel solution of partial differential equations. In *Computing Methods in Applied Sciences and Engineering IX*, R. Glowinski and A. Lichniewsky, eds., pages 378-392. Philadelphia: SIAM, 1990.

# Automation provides higher-level opportunities for optimization

- Variational formulation provides a language for PDE's
- Finite element simulation can be further automated (fiat, FErari, finat)

## Implementations:

- Analysa was written by Babak Bagheri
- FEniCS Project: too many contributors here to list everyone

# Models provide abstractions

## Two aspects to implementation

- Need to translate correctly to appropriate (e.g., machine) language
- Opportunity to perform optimizations

Optimization involves algorithmic challenges

# NIC versus DIC

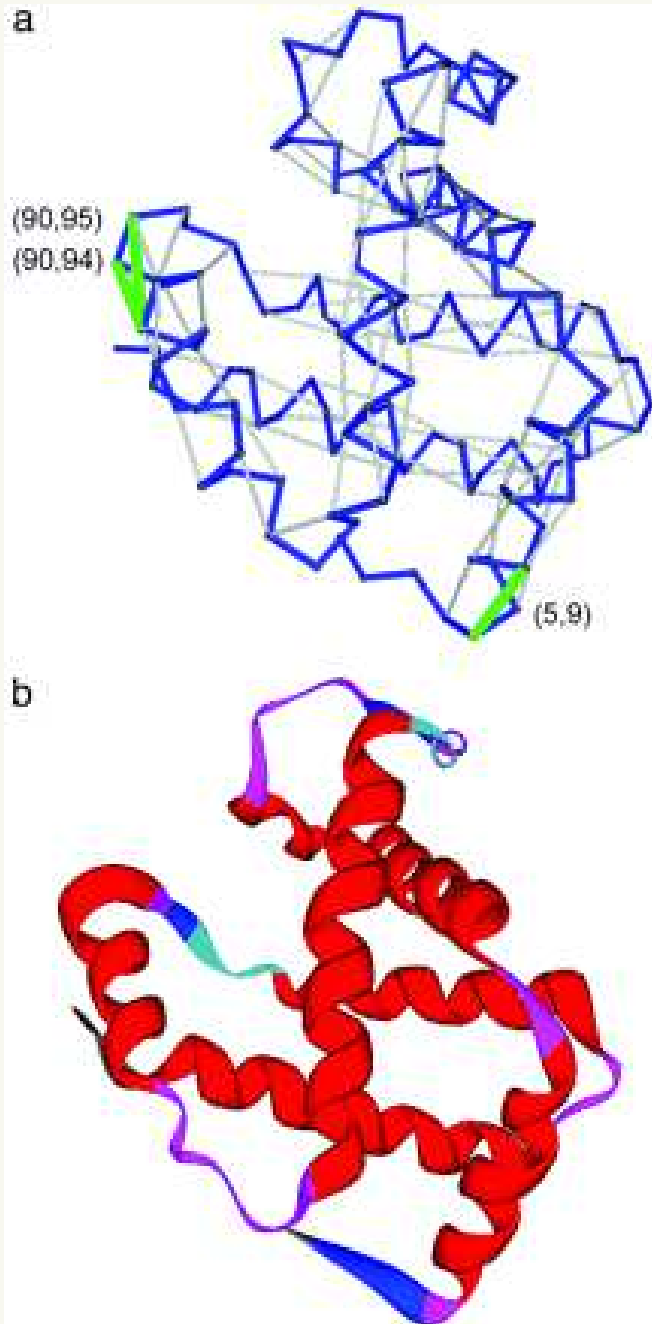
Numeric-intensive versus data  
intensive computing

Example: extracting information  
from genome and protein data

Computing with integers is still  
hard



# Dehydrons in human hemoglobin



## Dehydrons in human hemoglobin

From PNAS 100: 6446-6451 (2003)

Ariel Fernandez, Jozsef Kardos,  
L. Ridgway Scott, Yuji Goto,  
and R. Stephen Berry.

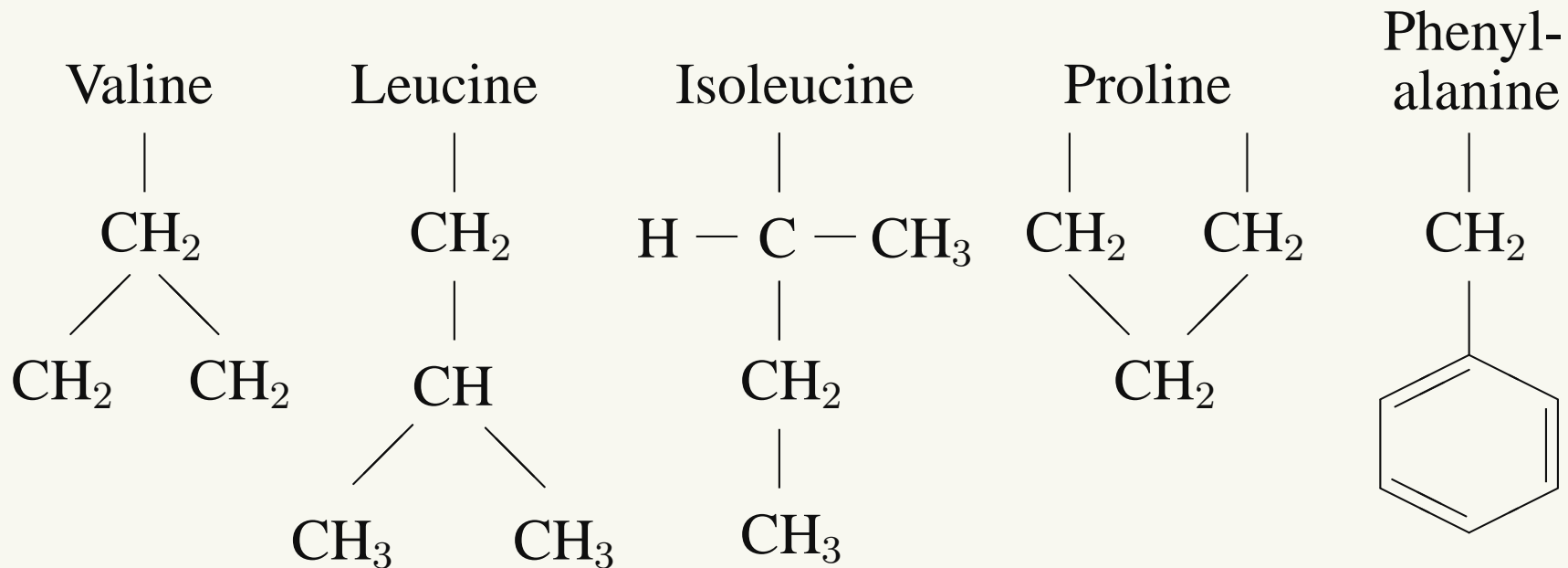
Structural defects and the  
diagnosis of amyloidogenic propensity.

Well-wrapped hydrogen bonds are  
grey, and dehydrons are green.

The standard ribbon model  
of “structure” lacks indicators  
of electrostatic environment.

## Amino acid sidechains have different properties

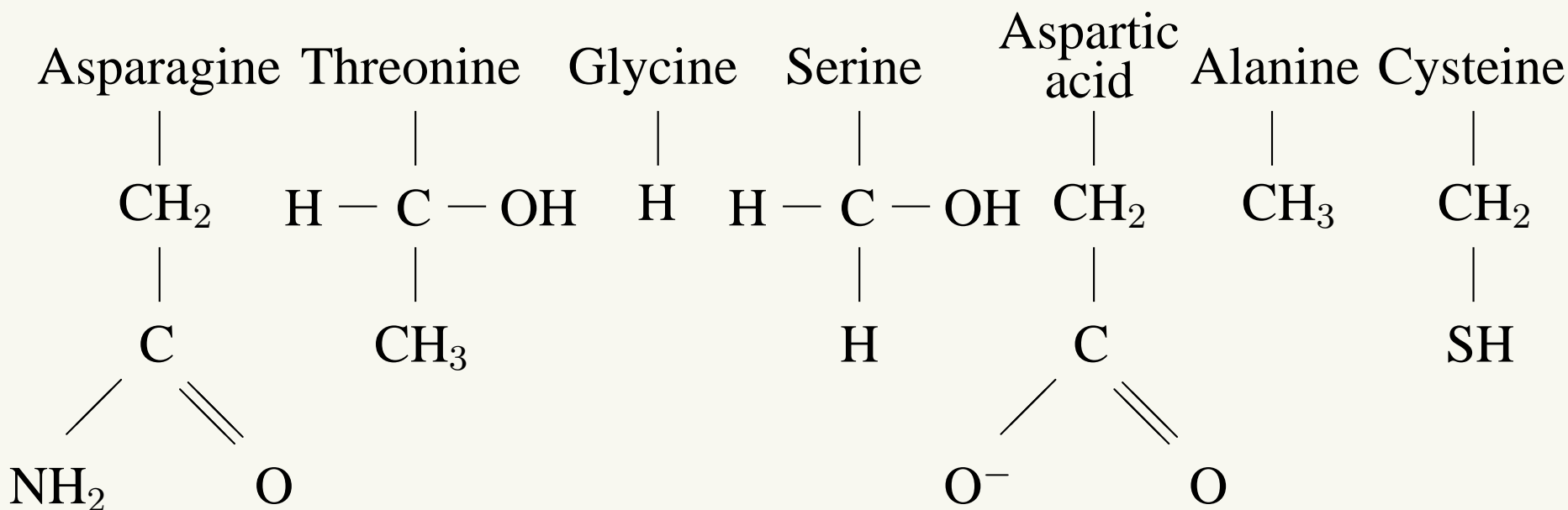
Carbonaceous groups on sidechains are hydrophobic:



Amino acid residues (sidechains only shown) having only carbonaceous groups.

## What sidechains are found at interfaces?

By examining interfaces in PDB structures, we can see which residues are most likely to be found at interfaces.



Sidechains most likely to be involved in interactions, ordered from the left (asparagine), are not hydrophobic.

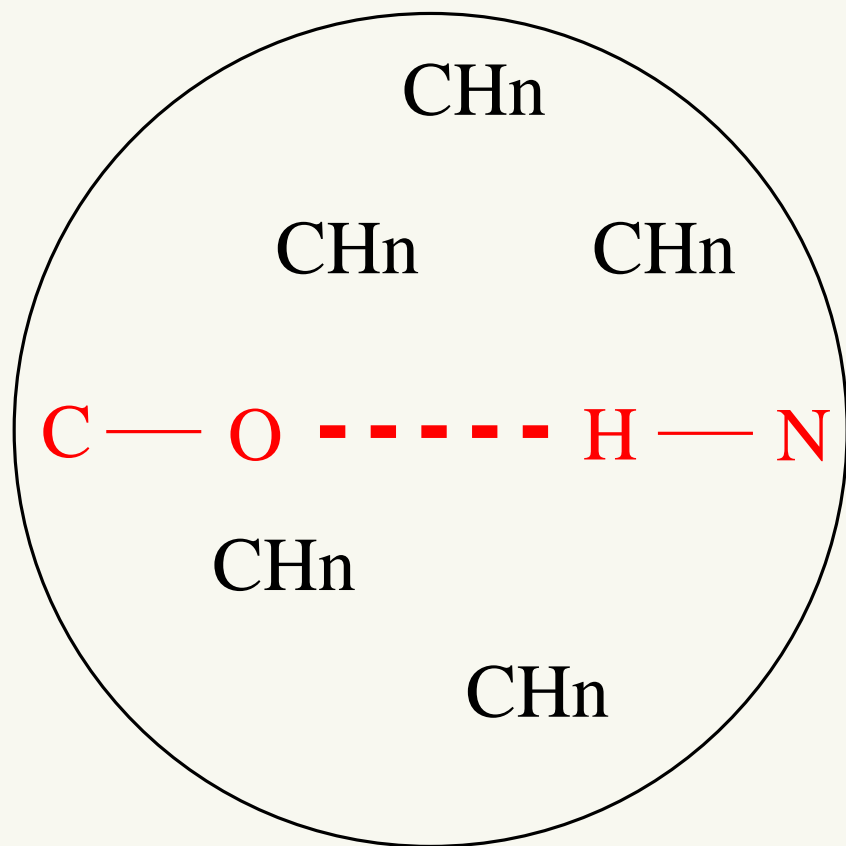
# Genetic code

Genetic code minimizes changes of polarity due to single-letter codon mutations, but it facilitates changes in wrapping due to single-letter codon mutations.

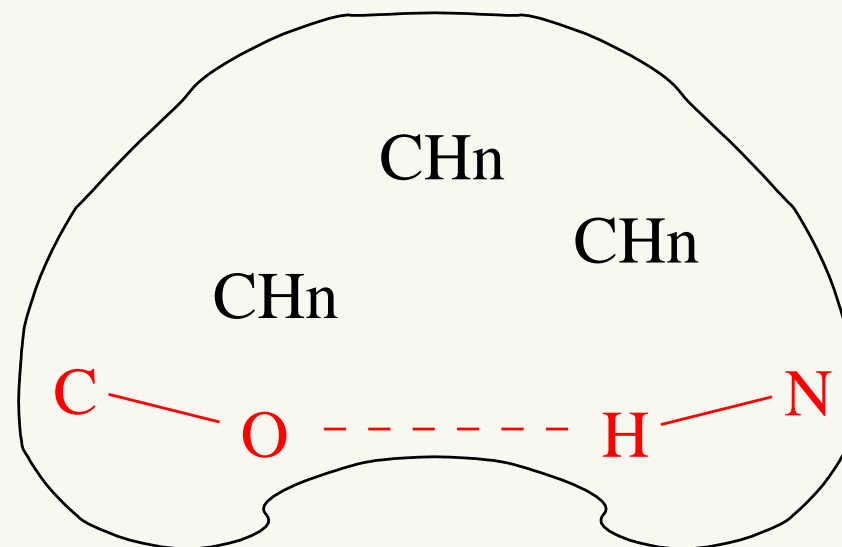
		Second Position					
		u	c	a	g		
First Position	u	uuu ] Phe 7	ucu ] Ser 0 +- ucc ]	uau ] Tyr 6 +- uac ]	ugu ] Cys 0 +- ugc ]	u c	
		uua ] Leu 4    uug ]		uca ] ucg ]	uaa stop uag stop		uga stop ugg Trp 7 +- g
	c	cuu ] Leu 4    cuc ]	ccu ] Pro 2    ccc ]	cau ] His 1 +- cac ]	cgu ] Arg 2 ++ cgc ]	u c a g	
		cua ] cug ]		caa ] Gln 2 +- cag ]	cga ] cgg ]		
a	auu ] Ile 4    auc ] aua ]	acu ] Thr 1 +- acc ] aca ]	aau ] Asn 1 +- aac ]	agu ] Ser 0 +- agc ]	u c a g		
	aug ] Met 1 +- g		aaa ] Lys 3 ++ aag ]	aga ] Arg 2 ++ agg ]			
g	guu ] Val 3    guc ]	gcu ] Ala 1    gcc ]	gau ] Asp 1 -- gac ]	ggu ] Gly 0 +- ggc ]	u c a g		
	gua ] gug ]		gca ] gcg ]	gaa ] Glu 2 -- gag ]		gga ] ggg ]	

First digit after residue name is amount of wrapping. Second indicator is polarity; ||: nonpolar, +-: polar, --: negatively charged, ++: positively charged.

# Wrapping protects hydrogen bond from water



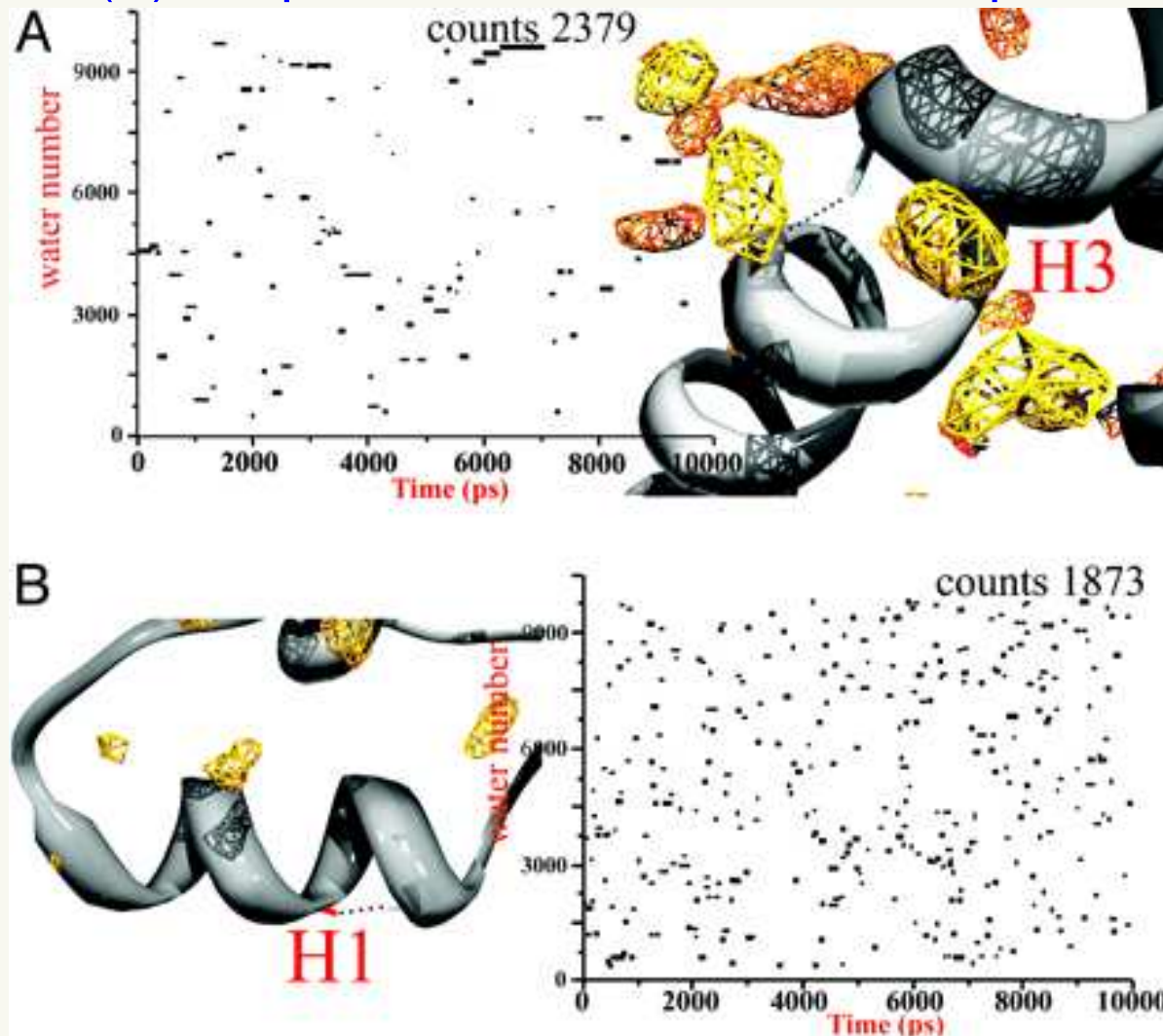
Well wrapped hydrogen bond



Underwrapped hydrogen bond

# Extent of wrapping changes nature of hydrogen bond

Hydrogen bonds (B) not protected from water do not persist.



From De Simone, et al., PNAS 102 no 21 7535-7540 (2005)

# Dynamics of hydrogen bonds and wrapping

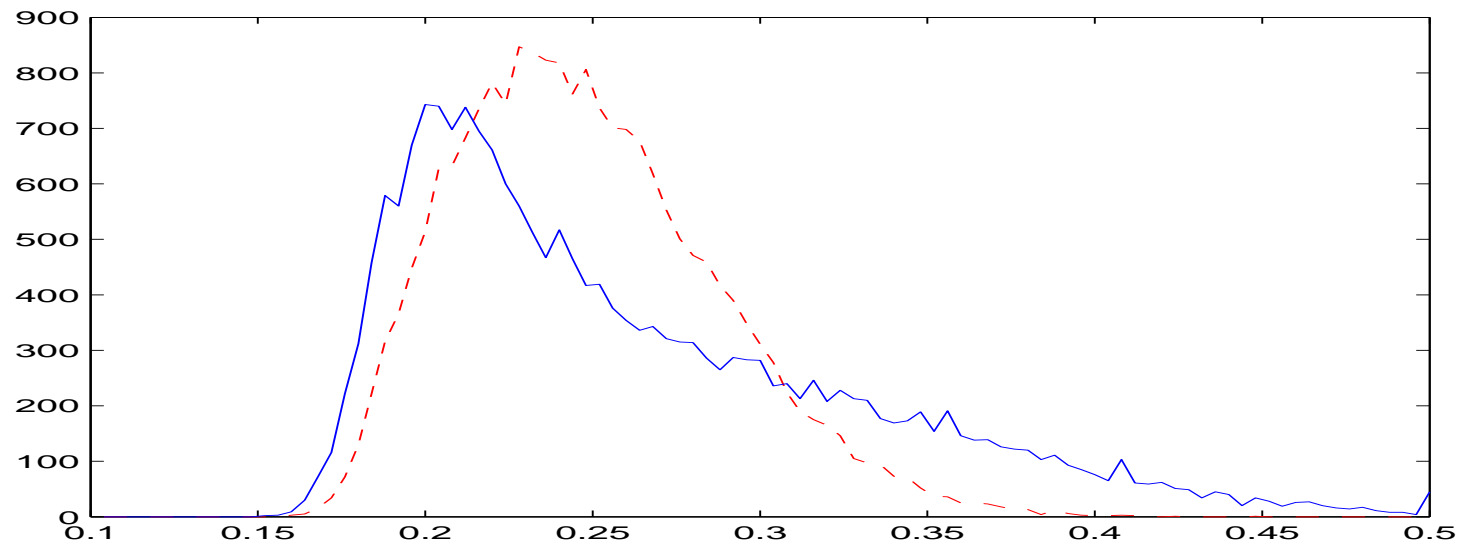
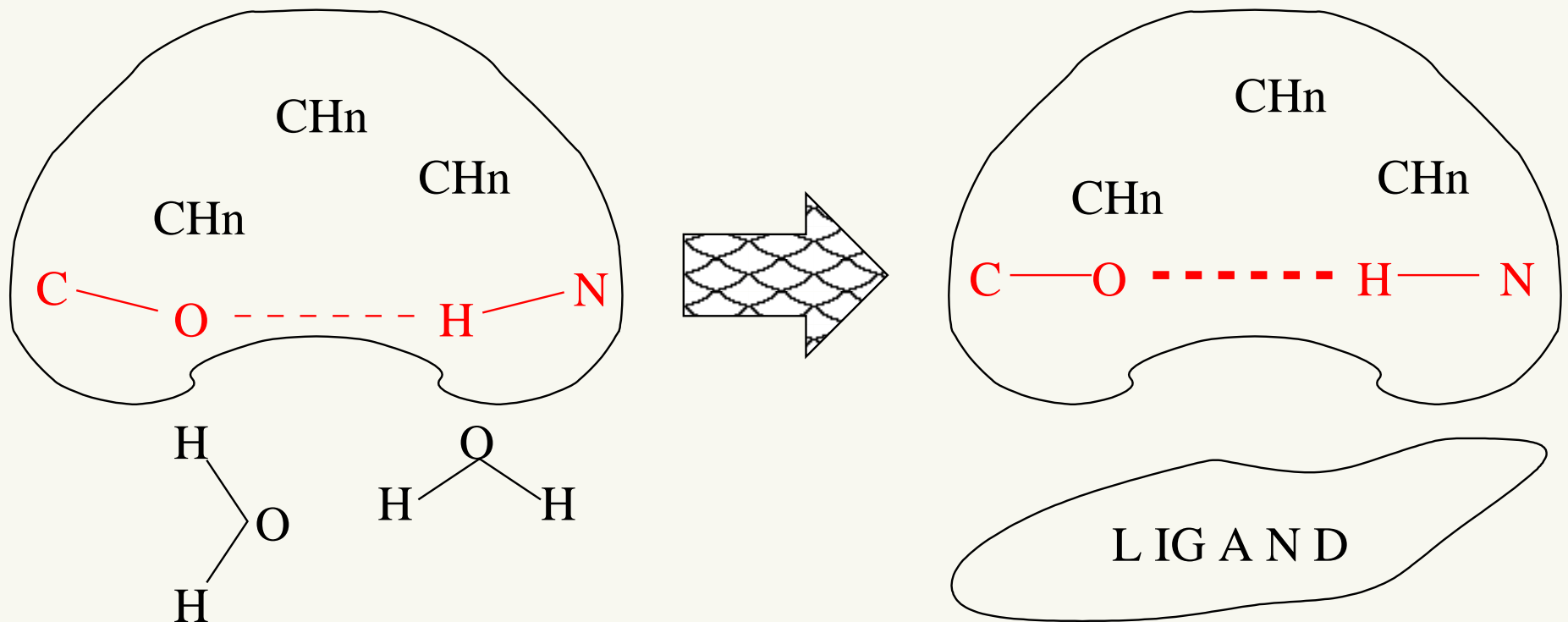


Figure 2: Distribution of bond lengths for two hydrogen bonds formed in a structure of the sheep prion [1]. Horizontal axis measured in nanometers, vertical axis represents numbers of occurrences taken from a simulation with 20,000 data points with bin widths of 0.1 Ångstrom. Distribution for the well-wrapped hydrogen bond (H3) has smaller mean value but a longer (exponential) tail, whereas distribution for the underwrapped hydrogen bond (H1) has larger mean but Gaussian tail.

# Ligand binding removes water



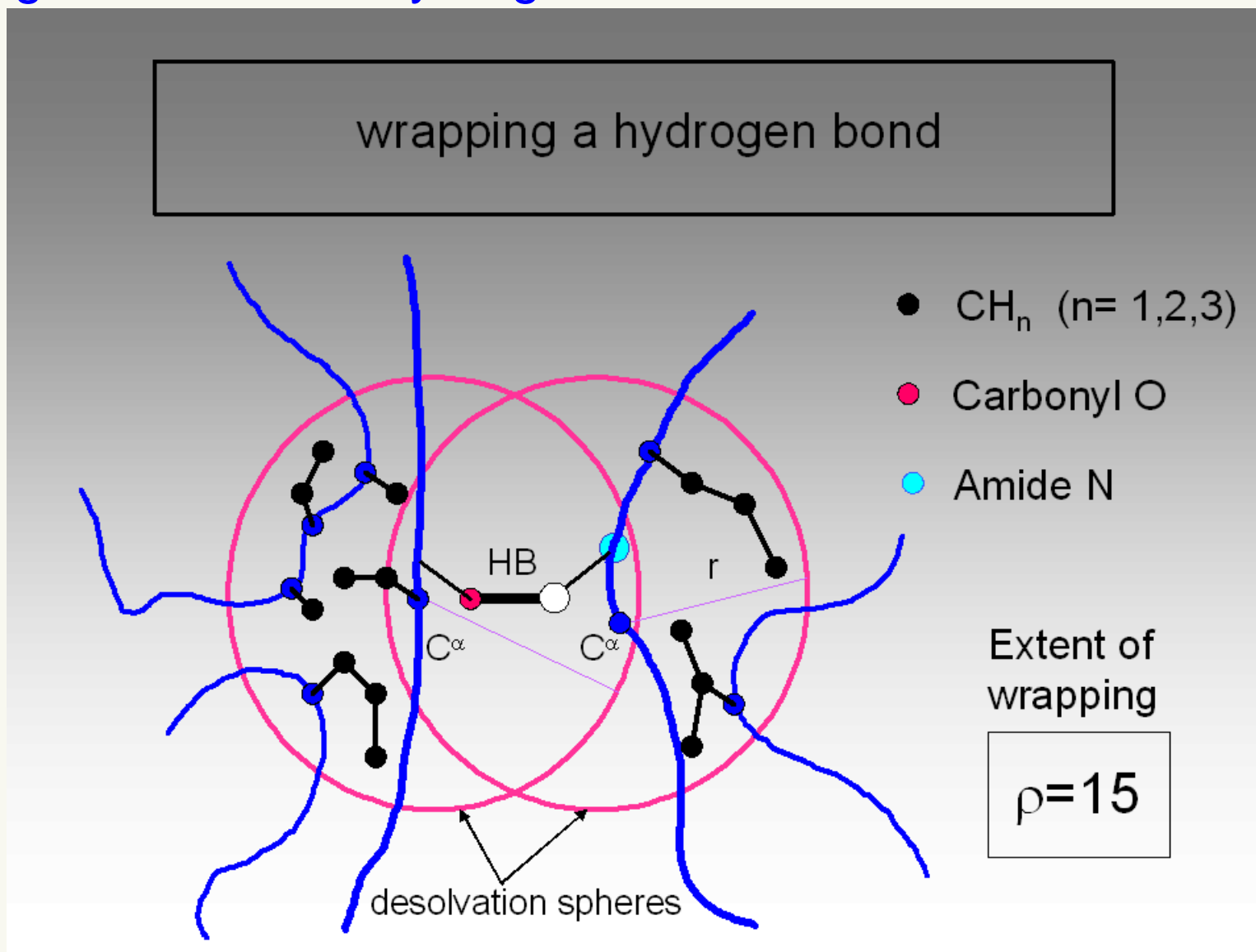
Binding of ligand changes underprotected hydrogen bond (high dielectric) to strong bond (low dielectric)

**No intermolecular bonds needed!**



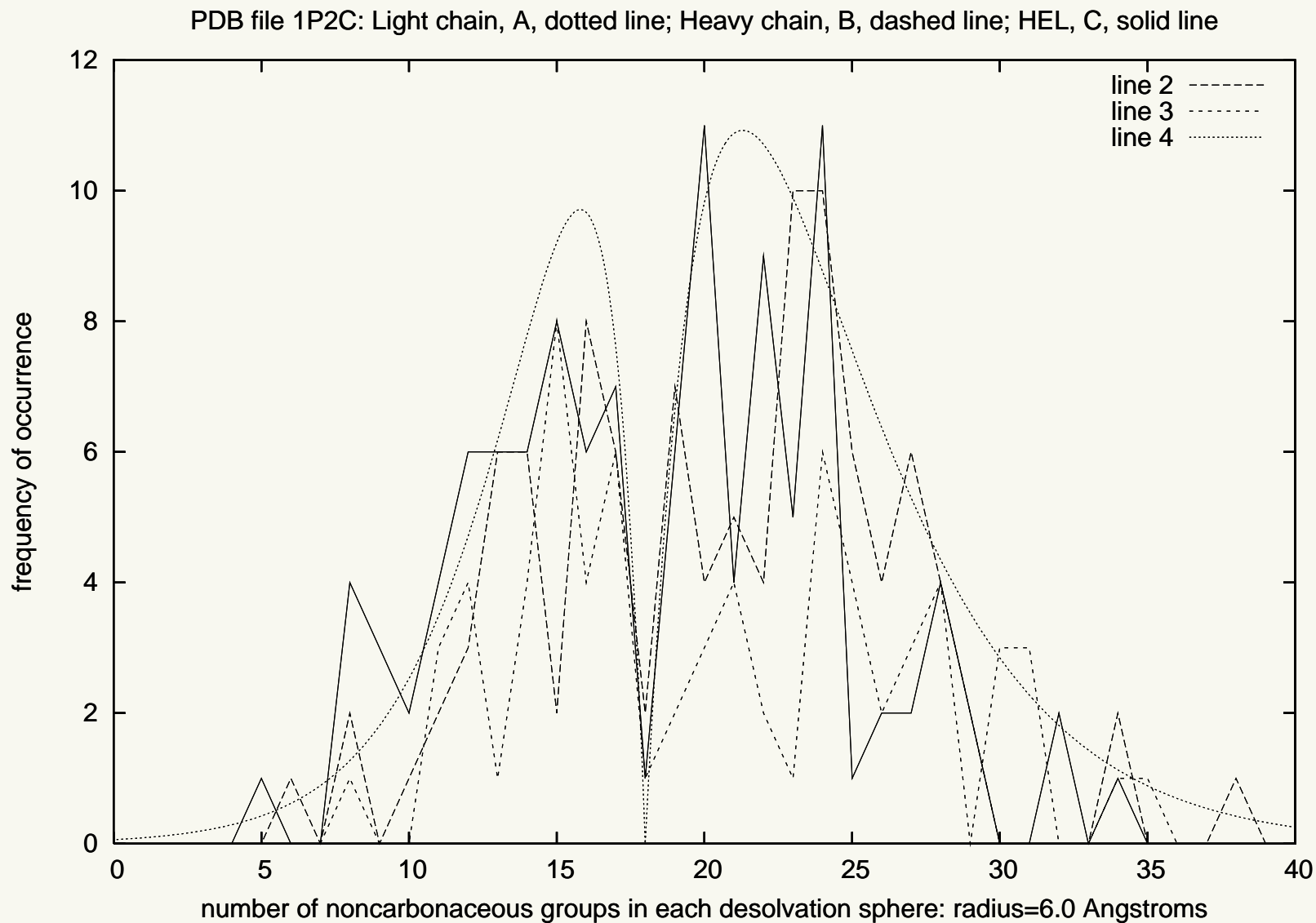
# Wrapping made quantitative

Wrapping made quantitative by counting carbonaceous groups in the neighborhood of a hydrogen bond.

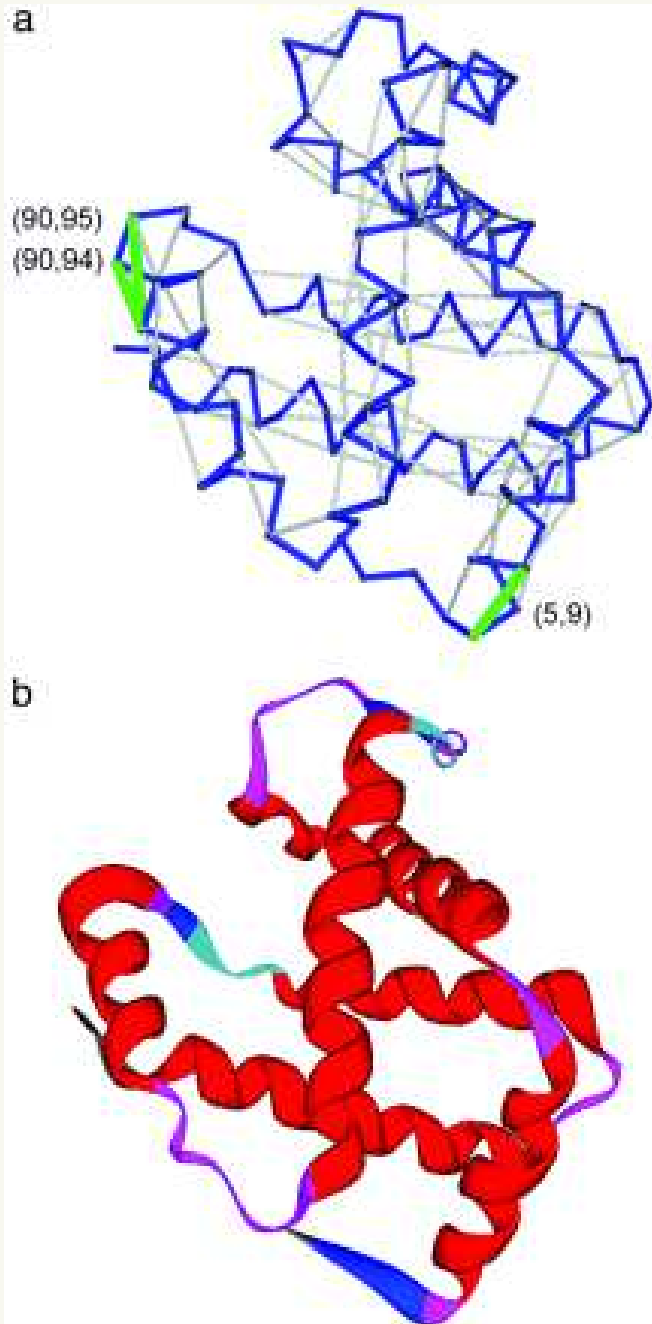


# Distribution of wrapping

## Distribution of wrapping for an antibody complex.



# Dehydrons in human hemoglobin



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# Introducing wrappa: Chris Fraser

## WRAPPA 1.0

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model chain(s)

-

ALL

### [PDB File](#)

PDB file:  no file selected

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Specify the PDB model number and chain(s) to be analyzed by WRAPPA:

model: enter the MODEL number to be analyzed. If the PDB file to be analyzed contains only a single model, leave the field unchanged.

chains: select all chains (default) or specify a single chain to analyze. No more than 36 chains may be analyzed during a single WRAPPA session.

### [PDB File](#)

Select a PDB file from a local directory. After uploading, the file will be checked for [PDB Format Version 3.0](#) compliance. This may take some time for larger PDB files. Please note that there is a 3MB size limit for uploaded files.

## What is hard about this?

Protein (and other bio-) data is messy

Some of this is formal in the PDB

- alternate atom locations
- inserted residues

Some of this is not formalized

- missing sidechains
- missing residues

Makes definitive statements difficult

# Thanks

This talk featured joint work with

- Babak Bagheri: PC, guarded memory, Pfortran, UHBD, fec, Analyssa
- Terry Clark: Pfortran, Euler Gromos, NPACI data-intensive system under linux, SAGE
- Reinhard von Hanxleden: Euler Gromos
- Ernesto Gomez: PC, SOS
- Alexander Veit: compressed Schrodinger
- Chris Fraser: Wrappa, various Python tools

We acknowledge partial support by NSF grant DMS-1226019.

# References

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- [4] Hector Juarez, L. R. Scott, R. Metcalfe, and B. Bagheri. Direct simulation of freely rotating cylinders in viscous flows by high-order finite element methods. *Computers & Fluids*, 29:547–582, 2000.
- [5] W. G. Pritchard, S. J. Tavener, and L. R. Scott. Numerical and asymptotic methods for certain viscous free-surface flows. *Philos. Trans. Roy. Soc. London A*, 340:1–45, 1992.
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- [7] Anna-Karin Tornberg, R. Metcalfe, L. R. Scott, and B. Bagheri. A front-tracking method for simulating bubble motion in a viscous incompressible fluid using high-order finite element methods. In *1997 ASME Fluids Engineering Division Summer Meeting FEDSM97-3493*, 1997.