# Stable foldings of proteins in the H–P model

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As far as the laws of mathematics refer to reality, they are not certain, and as far as they are certain, they do not refer to reality.

- Albert Einstein

# **1** Protein Folding

- Life=Water+Proteins.
- Strings (polymers) of amino acids
- The main breakthroughs:
  - Pauling 1951. Common local structure.
  - Anfinsen ca. 1960: Structure from sequence.

#### What makes this a *computational* problem?

sequence  $\rightarrow$  structure  $\rightarrow$  function





# Physical factors in protein folding

## **Folding factors**

- Local (neighbours) vs. nonlocal (collapse)
- Hydrophobic/hydrophilic
- Hydrogen bonding; local helix formation vs. nonlocal stabilization
- Electostatic forces

### **Experimental Results**

- Hydrophobic/Hydrophilic forces by far strongest
- Close packed proteins are crystal- like
- $\beta$ -sheets have few local interactions
- Helical structures can be designed by using only hydrophobicity,

# **Predicting protein structure**

No model	Combinatorics	Physics and	Quantum
		Chemistry	Physics
Annotation	Lattice models	Simulations	madness?

**Problem** Global optimization ( $O(3^n)$  local minima?). **Solution?** Forget almost everything we know.

### H–P model

- Hydrophobic (H) repels water
- Polar (Hydrophilic) (P) attracts water
- Model: H's attract each other and P's are neutral

Amino Acid	Code	Classification
Leucine	L	Н
Serine	S	Р
Glycine	G	Н
Threonine	Т	Р
:	:	:

# **Lattice Embeddings**

## Lattices

**2D square** More "realistic" for  $\leq 30$  monomers **3D cubic** Basic local structures ( $\alpha$ -helix) are 3D. **Other** Solve parity problems



**Optimal** Maximum number of bonds **Stable** Unique optimal embedding

## The Protein Folding "Paradoxes"

#### **Protein Folding Paradox (Levinthal 1968)**

There are an exponential number of foldings ("conformations"), but proteins fold quickly.

#### New Improved Protein Folding Paradox (1998)

Finding the optimal folding in the H–P model is NP-complete, but proteins still fold quickly.

- NP-Complete for 3D (Berger & Leighton 1998)
- NP-Complete for 2D (Crescenzi et al., JCB 1998)
- 3/8-approximation for 3D and 1/4-approximation for 2D (Hart and Istrail, STOC 1995).

# Why care about uniqueness?

- Possible resolution to NP-hardness "paradox".
- "Sequence design: the hard part is uniqueness" (Dill et al., 1995)
  - **Experimental** designed polymers have many optimal foldings
  - Algorithmic designing to fold to a shape is easy. (Kleinberg 1999)
  - **Simulation** machine designed H–P-polymers tend to collapse below design state (Yue et al. 1995)

#### **Simulation Results**

• About 2% of sequences of a given length have unique optimal foldings up to length 18



# 2 Lattice Embeddings of Bicoloured Chains

- A *lattice embedding* of a graph maps edges to adjacent (i.e. distance 1) pairs of lattice points.
- A graph with a lattice embedding is called a *lattice* graph



- A pair of H nodes adjacent in an embedding, but not in the graph, is called a *bond*
- bond graph V = H nodes; E = bonds
- The *conformation graph* consists of the edges of P, along with the bonds.

# Lattice graphs are bipartite

## 2.1. Fact.

Every lattice graph is bipartite.



## 2.2. Corollary.

If an embedding of a closed chain with r H nodes has r bonds, then its bond graph consists of disjoint even cycles.

## 2.3. Corollary.

There can be a bond between two  ${\sf H}$  nodes only if they have different parity.

# **3 Degenerate Ground States**

#### 3.1. Observation.

Any folding of  $P^k$  is optimal

### 3.2. Fact.

Any optimal folding the closed chain  $(PHP)^{4k}$  has a bond graph consisting of k four cycles.

Proof. Consider a big bond graph cycle. . .



## 3.3. Fact.

There are as many optimal embeddings of  $(PHP)^{4k}$  as there are (embeddings of) k node lattice trees.



#### 3.4. Fact.

There are  $\Omega(2^k)$  embeddings of k-node lattice trees.



# **4 Closed Chains with Stable Foldings**

$$\begin{split} D_m &= (\mathsf{ES})^m \\ U_m &= (\mathsf{WN})^m \\ F_k &= \begin{cases} \mathsf{E} \ \mathsf{D}_{k/2} \ \mathsf{W} \ \mathsf{U}_{k/2} & k \equiv 0 \mod 2 \\ \mathsf{E} \ \mathsf{D}_{\lfloor k/2 \rfloor} \ \mathsf{S} \ \mathsf{U}_{\lceil k/2 \rceil} & k \equiv 1 \mod 2 \end{cases} \end{split}$$

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# **Missing Bonds**

## **Missing Bond**

• Neighbouring lattice point empty or P not adjacent on chain.



### 4.1. Observation.

There exists an embedding of  $S_k$  with 2 missing bonds.



#### 4.2. Corollary.

In any optimal embedding of  $S_{\rm k},\ {\rm both}\ {\rm monochrome}\ {\rm edges}\ {\rm are}\ {\rm on}\ {\rm the}\ {\rm bounding}\ {\rm box}.$ 

# **Internal and External Bonds**

### 4.3. Definition.

An *exterior* bond in an embedding of a closed chain C is one that does not subdivide the interior of C.

### 4.4. Lemma.

There are no exterior bonds in an optimal embedding of  $\boldsymbol{S}_k.$ 



# The bond graph of $S_k$ is a path

Let  $\nu_i$  denote the ith H node to occur in  $S_k.$  Let  $w_i$  denote  $\nu_{k-i+1}.$ 

#### 4.5. Lemma.

Over all optimal embeddings of  $S_k$ , the conformation graph is unique up to relabelling  $v_i \leftrightarrow w_i$ .



#### 4.6. Observation.

A 4-cycle has a unique lattice embedding, up to isometries.

#### 4.7. Theorem.

 $F_k$  is the unique optimal folding (up to isometries) of  $S_k.$ 

# **5 Open Chains with Stable Foldings**

$$Z_{k} = (\mathsf{HP})^{\lceil k/2 \rceil} (\mathsf{PH})^{\lfloor k/2 \rfloor}$$



#### 5.1. Theorem.

 $Z_{2j}$  has a unique optimal folding for all  $j \ge 1$ .

Proof. (Sketch)

- 1. How can H nodes appear on the bounding box?
- 2. Both endpoints on the bounding box, and bonded.
- 3. The monochrome edge is one the bounding box.
- 4. The open case reduces to the closed case



# **External and Internal Missing Bonds**

**external missing bond** outside bounding box **internal missing bond** inside bounding box

#### 5.2. Observation.

Every embedding of  $Z_k$  has either

- (a) 3 e.m.b.'s and the monochrome edge on the bounding box, or
- (b) 4 external missing bonds.



#### 5.3. Observation.

There exist embeddings of  $Z_{2j}$  with 4 external missing bonds and no internal missing bonds.

## **H** corners

#### 5.4. Lemma.

In an optimal embedding of  $Z_{2j}$ , there are no H corners on the bounding box.



## straight H nodes



#### 5.5. Lemma.

There is at most one solitary straight H node on the bounding box.



# Wrapping things up

#### 5.6. Lemma.

Both endpoints are on the bounding box, and bonded.

### 5.7. Corollary.

The monochrome edge is on the bounding box.

## 5.8. Fact.

There are at least as many distinct optimal embeddings of  $S_{2j}$  as there are of of  $Z_{2j}$ .



## **Open Questions**

- 1. Do real proteins fold uniquely in the H–P model?
- 2. Asymptotically, what fraction of n-node H–Psequences fold uniquely?
- 3. Is H–P sequence folding still NP-complete when restricted to "nice" sequences?

#### Not so open questions

- There exist stable H–P trees in 3D.
- There are stable chains in the 2D H-anything model.
- Minimal area and maximum bonds are not always simultaneously achievable.

# Credits

- Inspired by an article of Brian Hayes in American Scientist
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