# (Non)-Degenerate Ground States in the H–P model

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## Outline

Lattice Models of Protein Folding

Graph Theoretic Preliminaries

Chains with degenerate ground states

Globular Stable Chains Square Lattice

Triangular Lattice

Non-globular Stable Chains Closed Chain Open Chains

Conclusions

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#### Non-globular Stable Chains Closed Chain

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### Lattices

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Given linearly independant vectors  $B = \{ b_1 \dots b_d \}$  in  $\mathbb{R}^d$ , the *lattice* 

$$L(B) := \{\sum_{i=1}^d z_i b_i \mid z_i \in \mathbb{Z}\}$$

### Lattice Graphs

Given I.i.  $B \subset \mathbb{R}^d$ , the *lattice graph* 

 $G(B) = (L(B), \{ (p,q) : \|p-q\| = 1 \})$ 



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### Lattice Models

### **Combinatorial Setting**

Polymer A chain C (node sequence) with coloured (classified) nodes.Lattice A vertex regular (sufficiently large) graph L.Folding An embedding of C into L.



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#### **Energy Model**

Energy  $\phi$ : embedding  $\rightarrow \mathbb{R}$ Locality  $\phi$  is usually a function of a small neighbourhood in *L*. Optimality Minimum energy embeddings (*ground states*) are considered optimal.

## Lattice Models: pro and contra

#### Pro

Physics is hard Global optimization models have  $\Omega(3^n)$  local optima. Chemistry is lattice-like Close packed proteins are crystal-like. Thought Experiment Can a small subset of forces explain folding?

#### Contra

Discrete optimization is hard Computing optimal embeddings is NP-hard. Approximation is rough Close energy ⇔ close shape? Lattice artifacts Crude approximation of shape. Parity. Chirality.

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# What Lattice, What Energy function?

#### Lattice

2D square Some interest for ≤ 30 monomers
3D cubic Basic local structures (helix) are 3D.
2D triangular Solve parity problems

#### **Energy Function**

- Hydrophobic/Hydrophilic forces by far strongest
- Helical structures can be designed by using only hydrophobicity,
- β-sheets have few local interactions

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## H–P model

### Hydrophobic/Hydrophilic

- 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
:	:	:

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stable/degenerate optimal embedding

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## What counts as "unique"?

- Most lattices have isometries, i.e. distance preserving transformations.
- Isometries preserve contacts.
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## Computational Complexity of the H–P model

Algorithmic results

- ▶ 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).

#### Fight hardness with more restricted problem?

- H-connected optimal embedding.
  - 3D NP-hard gadgets have this property
  - 2D gadgets do not
- Unique optimal embeddings
  - neither 2D nor 3D NP-hard gadgets are stable

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## The Protein Folding "Paradoxes"

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

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

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## Why care about uniqueness?

### Motivations

- An important property of real proteins
- ▶ Possible resolution to NP-hardness "paradox".
- "Sequence design: the hard part is uniqueness" (Dill et al., 1995)

### Evidence

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)

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## Simulation Results

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



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Closed Chain Open Chains

### Conclusions

## Terminology

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



contacts

conformation graph

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### Parity

Define the *parity* of lattice point  $\sum z_i b_i$  as  $\sum z_i \mod 2$ .



#### Bipartite Lattice Graphs

In the square and cubic lattice graphs:

- ► Every edge changes parity.
- Contacts exist only between H nodes of different parity.
- ▶ No odd cycles are possible.
- The maximal contact graph of a closed chain consists of disjoint even cycles.

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### Fact

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



➡ Skip proof

Proof.

Consider a big contact graph cycle...

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There are  $\Omega((1 + \sqrt{2})^k)$  embeddings of k-node lattice trees.



• and probably lots more 
$$\left(\Omega\left(\frac{3.79^k}{k}\right)\right)$$

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Missing Contact Neighbouring lattice point that is neither

- ► An H node
- ▶ nor a P node adjacent on chain.

- maximizing pseudocontacts, or
- minimizing missing contacts.



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```
nin 2x + 2y
subject to
x \cdot y \ge s^2
x \ge 1
y \ge 1
```

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### Uniquely achieving the $s \times s$ square

# 

### Start by fixing the corners

Make short loops of H nodes

Repeat

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# Hexagonal Contact Graphs

### Fact

A chain  $3s^2 - 3s + 1$  H nodes embedded in the triangular lattice has at most  $9s^2 - 15s + 6$  pseudocontacts, and this is achieved exactly when the H nodes are embedded in a side-length s hexagonal grid.





### Sides can be fixed

- but with wiggle
- ► Wiggle can be fixed
- ► And the interior filled



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$$A_m = (\mathsf{HP})^m$$

$$S_k = \mathsf{P} A_{\lceil k/2 \rceil} \mathsf{P} A_{\lfloor k/2 \rfloor}$$

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### Observation

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



### Corollary

In any optimal embedding of  $S_k$ , both monochrome edges are on the bounding box.

# Internal and External Contacts

## Definition

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

#### Lemma

There are no exterior contacts in an optimal embedding of  $S_k$ .



### Lemma

Over all optimal embeddings of  $S_k$ , the conformation graph is unique.

#### heorem

There is a the unique optimal embedding (up to isometries) of  $S_k$ .

### Proof.

Start with one of the four cycles, the embedding is forced.

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



#### Theorem

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

#### ➡ Skip proof

### Proof.

- 1. How can H nodes appear on the bounding box?
- 2. Both endpoints on the bounding box, and in contact.
- 3. The monochrome edge is on the bounding box.
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- 2. Asymptotically, what fraction of *n*-node H–P-sequences fold uniquely?
- 3. Is H–P sequence folding still NP-complete when restricted to "nice" sequences?

- ▶ There exist stable H–P trees in 3D.
- There are stable chains in the 2D H-anything model.
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- ► Inspired by an article of Brian Hayes in American Scientist
- Initiated at a workshop on Molecular Reconfiguration organized by Godfried Toussaint.
- Non-globular examples with Oswin Aichholzer, Erik Demaine, Vera Sacristan and Mike Soss.
- Globular examples with Henk Meijer and Jit Bose