## CMSC 858P

Lecture 25: RNA folding cont'd; Protein folding 5/1/2008

## RNA Folding - covariance models

- Based on stochastic context free grammars (SCFGs)

| $\mathrm{W}-(\mathrm{P}\|\mathrm{L}\| \mathrm{R}\|\mathrm{B}\| \mathrm{S} \mid \mathrm{E})$ |  |
| :--- | :--- |
| $\mathrm{P}->\mathrm{aWb}$ | pair (a is paired with b) |
| $\mathrm{L}->\mathrm{aL}$ | left (a unpaired on the left) |
| $\mathrm{R}->\mathrm{Lb}$ | right (b unpaired on the right) |
| $\mathrm{B}->\mathrm{SS}$ | bifurcation |
| $\mathrm{S}->\mathrm{W}$ | start |
| $\mathrm{E} \rightarrow \mathrm{\varepsilon}$ | end |

- State transitions associated with transition probabilities



## Parsing problem

- How likely is it that the RNA sequence observed was generated by the covariance model (CM)?
- Scoring (calculating this probability) can be done with dynamic programming (inside/outside/CYK/forward/backward, etc.)
- High-scoring regions of the genome are likely to be RNAs with the structure encoded in the CM.
- tRNAscan-SE - finds transfer RNAs
- More on machine learning techniques in CMSC 828 N Spring 2007


## Protein folding

- Protein shape determines protein function
- Protein sequence determines protein shape (Anfinsen's experiment)
- Levinthal's paradox - space of possible protein conformations is exponentially large, yet proteins fold fast (usec - minutes).
- Corollary: proteins must "know" how to fold (i.e. they don't search the entire space of conformations)


## Protein folding

- Note: mis-folded proteins may cause disease (e.g. Creutzfeld-Jakob a.k.a. mad cow)
- Drugs (e.g. antibiotics) often inhibit protein function knowing structure can help design drugs
- Folding@home - lend your computer's unused cycles to help fold proteins (like SETI@home) (do you believe in evolution or aliens ?)


## Protein structure (primary structure = sequence)


http://www.tulane.edu/~biochem/med/second.htm

## Amino acids with hydrophobic side groups



Valine
(val)


Leucine (le u)


Isoleucine (ile)


Methionine (met)


Phenylalanine (phe)
hate water
like water
can't decide


Cysteine (cys)



Proline
(pro)


Tyrosine
(tyr)

Amino acids that are in between

http://web.mit.edu/esgbio/www/lm/proteins/aa/aminoacids.html

## Not all bends equally likely Ramachandran plot



## Secondary structure (motifs)


http://alpha2.bmc.uu.se/~kenth/bioinfo/structure/secondary/01.html

## Tertiary structure (3D shape)

Phage CRO Repressor on DNA. Andrew Coulson \& Roger Sayle with RasMol, University of Edinburgh, 1993

http://www.umass.edu/microbio/rasmol/sayle1.htm

## Folded shape: lowest free energy

- Energy components
- electrostatic ( $\sim 1 / D^{2}$ ) ( $\mathrm{n}^{2}$ terms)
- van der Waals ( $\mathrm{n}^{2}$ terms)
- hydrogen bonding ( n terms)
- "bending" ( n terms)
- solvent (water/salt) (?? terms)
- exclusion principle (no two atoms share same volume)
- Energy minimzation
- small perturbations \& computation: hill climbing, simulated annealing, etc.
- Molecular dynamics


## How do we know the truth?

- X-ray crystallography
- crystallize protein
- shine X-rays
- examine diffraction patterns

http://www.cryst.bbk.ac.uk/BBS/whatis/cryst_an.html
- Nuclear Magnetic Resonance (NMR)
- no crystallization necessary
- magnetic field "vibrates" hydrogen atoms
- Nobel prize: Kurt Wuethrich



## Simpler problems

- Secondary structure prediction
- Side-chain conformation (assuming fixed backbone)
- Protein docking (how do proteins interact)
- Database searches (protein threading)
- Simpler energy functions
- Folding on a lattice (theoretical approximation)
- Critical Assessment of Fully Automated Structure Prediction - competition on proteins with unpublished 3D structure


## Secondary structure prediction

Chou-Fasman algorithm

- Estimate amino-acid propensities for helix/sheet structures (from known structures)
- mostly found in helix/often found in helix
- mostly found in sheet/often found in sheet
- ambiguous
- Find helix/sheet "seeds" - regions with many "mostly" AAs
- Extend seeds while overall propensity/likelihood of structure is good
- Clean up prediction (e.g. overlapping modules)


## Folding on a lattice

- Protein - colored beads on a string
- Lattice - beads can occupy nodes in a 2D/3D lattice (not necessarily square lattice)
- Hydrophobic (black or 1) / hydrophilic (white or 0) model
- Objective: maximize \# of contacts between hydrophobic beads
- NP-hard, constant approximation computable in linear time



## Folding on a lattice

- Note: sheets are reason why RNA folding dynamic programming algorithm doesn't work (lots of pseudo-knots in proteins)
- Residues i and jare adjacent
iff $\mid j$ - i| is odd
- Block decomposition:
- b = 1 or $1 Z_{1} 1 Z_{2} 1 Z_{3} \ldots 1 Z_{k} 1 \quad Z_{i}$ - odd \# of $0 s$
- blocks separated by even \# of 0s
- Properties:
- 1s from a same block cannot be paired
- 1s from even blocks can only be paired with 1s from odd blocks


## Block decomposition

- Odd blocks - X blocks, even blocks - Y blocks (1s from $X$ blocks can only line up to 1 s from $Y$ blocks)
- Normal form - 1 s in a line separated by single 0s. Block separators fall to the side (the "face")
- X - super-block structure - treat Y blocks like 0s
- Y - super-block structure - treat X blocks like 0s



## Approximation algorithm

- Decompose protein into blocks
- Find the optimal "folding" place
- Build "super-block" structure for each half (one half as an X super-block, the other as a $Y$ super-block)
- Fold the halves onto each other
- Claim: $1 / 4$ approximation in 2D, $1 / 8$ in 3D. iterative algorithm leads to $3 / 8$ approximation. All algorithms run in linear time!!
- Proof: read the paper (careful counting of contacts)

