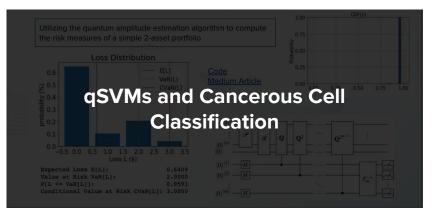
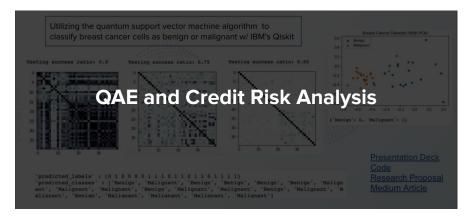


Simulated Protein Folding with Quantum Annealing on D'Wave's Hardware for Drug Discovery Implications









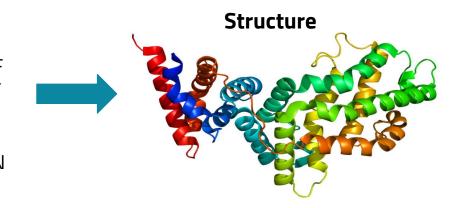
Over 6 million deaths per year due to neurodegenerative disorders

The Protein Folding Problem

How can a protein's amino acid sequence dictate its three-dimensional atomic structure?

Sequence

GIAISVGFAYIMINTYFEVLVAF WCCACWWFPKQNPKIHKHT MIQTAEGQIMNPAGWHWR GNIEKVGFACFNSTCLDICTW WIDPETSEYAYNWMVHMDN



The Protein Folding Problem

How can a protein's amino acid sequence dictate its three-dimensional atomic structure?

3D-Structure Relationship

Computational Drug Design



Our current computational methods are not efficient enough.

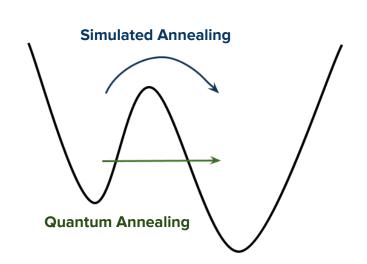
>150 residues proteins unable to be computed

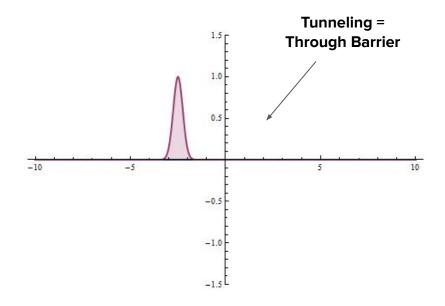
No classical algorithm exists that is able to find a protein's minimum energy in polynomial time

Quantum Tunneling Effect

Simulated Annealing = Over Energy Barrier = ↑ Expensive

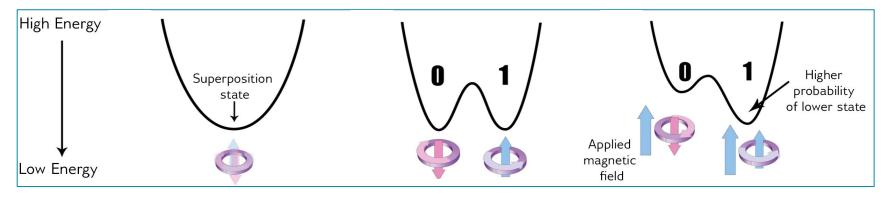
Quantum Annealing = Through Energy Barrier = ↓ Expensive





Quantum Annealing

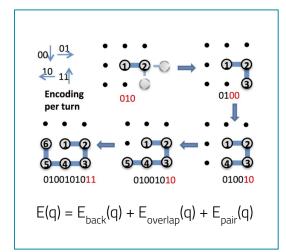
Finds protein's minimum energy with **speedup** from quantum tunneling



- 1 Apply biases and couplers to superpositions of qubits to optimize for annealing
- 2 Energy change computed, step is accepted for each residue
- 3 Energy landscape is defined and energy is minimized to reach native structure

n qubits = 2ⁿ solutions able to be run at the same time

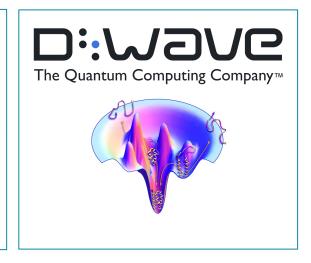
QuantFold



- 1 Define a schedule for annealing temperature **T**
- Randomly choose ith qubit q_i
- Perform a qubit flip
- Compute energy change in energy $\Delta \mathbf{E} = \mathbf{E} \mathbf{E}'$
- 5 Accept step if **exp(-ΔE/T)** expresses the probability a state of energy E relative to the probability of a state of zero energy > **random.uniform(0,1**). If ΔE <=0, always accept 1

Probability =
$$\frac{1}{1+e^{\frac{-\Delta H}{T}}}$$

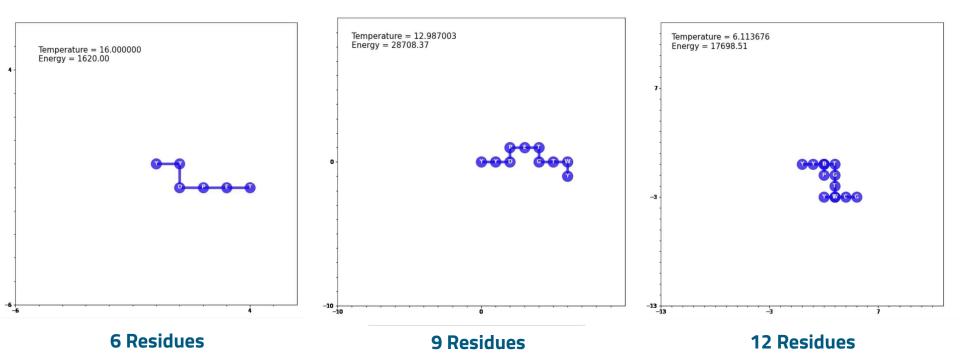
6 Process repeats as T → 0



Turn Ancilla Encoding

Quantum Annealing

Run on D'Wave Annealer



	6 Residues	9 Residues	12 Residues
Conventional Simulated	18.6%	13.3%	6.1%
Annealing	12.2 s	25 s	38.0 s
Quantum Annealing,	86.6%	70.8%	61.0%
D'Wave's Annealer	2.6 s	8.0 s	12.0 s

QuantFold

Modeling protein
structures energy
conformations,
sequence
information

Efficient
prediction and
classification
in protein
sequences

Optimized generation of new computational drug designs

Stage 1 Stage 2 Stage 3

