Protein Structure Prediction Through Residue Co-Evolution

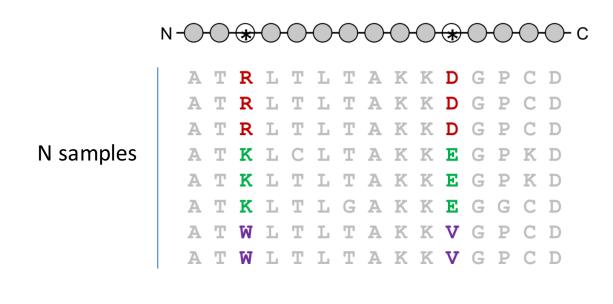
CSC412/2506 Course Project
Chris Cremer

Goal

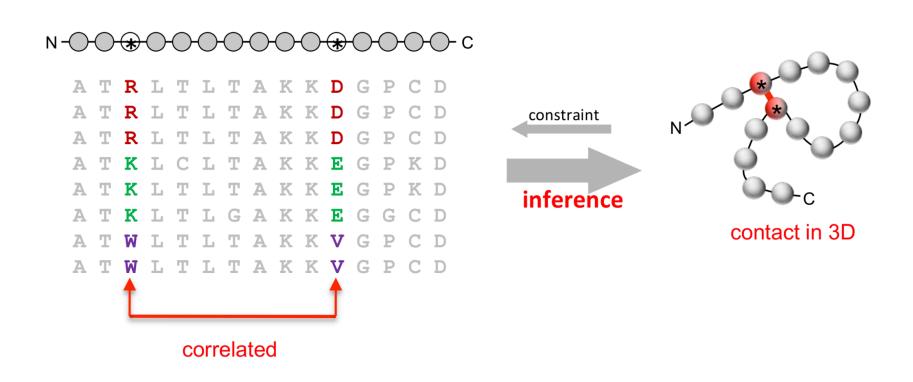
- Predict latent 3D positional vector for each amino acid of a protein
- Input: Protein Family Multiple Sequence Alignment

Multiple Sequence Alignment

- Proteins are made of amino acids (residues) (20)
- MSA is an alignment of many protein sequences from the same family

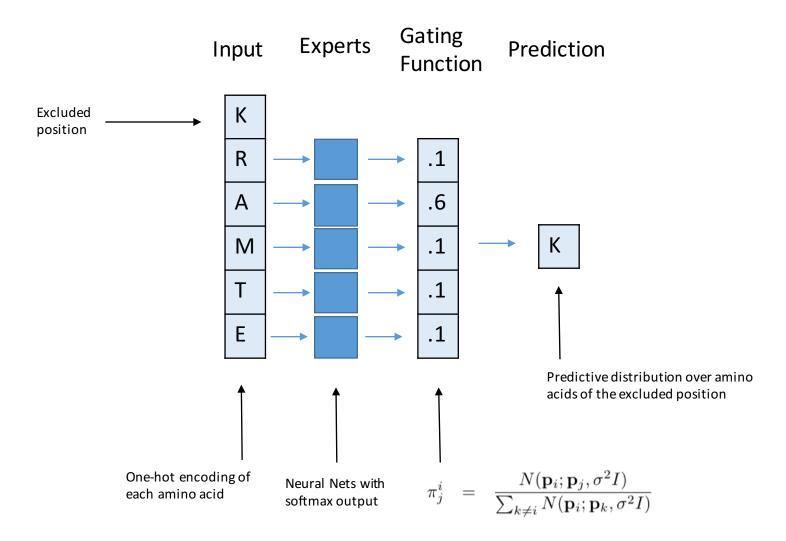


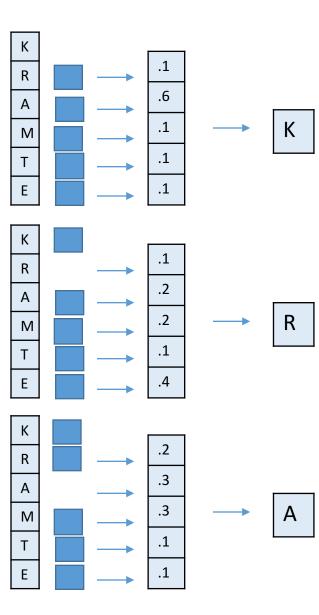
How can we use a protein family MSA to predict 3D structure?



Infer the latent 3D coordinates of each column based on which columns predict each other

Model Description





Objective Function

Cross-Entropy Attract Adjacent Repel All Weight Decay

$$E(\Theta, \Psi) = \sum_{m=1}^{M} \sum_{l=1}^{L} C(\mathbf{a}_{l}^{m}, h(m, l)) + \lambda \sum_{i=1}^{L-1} N(\mathbf{p_{i}} | \mathbf{p_{i+1}}, \sigma^{2} I)^{-1} + \nu \sum_{i=1}^{L} \sum_{j=1}^{L} N(\mathbf{p_{i}} | \mathbf{p_{j}}, \sigma^{2} I) + \rho \sum_{i \neq j}^{L} ||G_{l|j}||_{F}$$

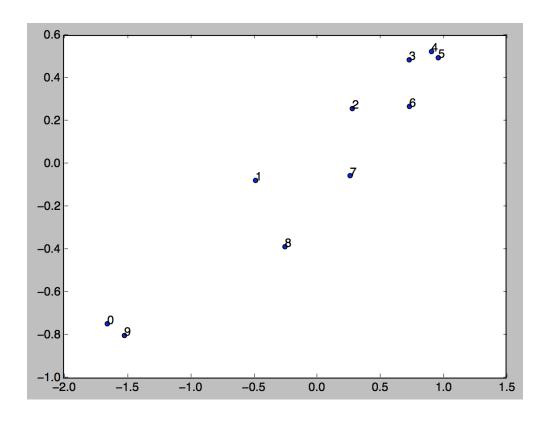
Parameters Θ:

- Weights and biases of the experts: G
- Coordinates of the columns: **p**

Hyperparameters Ψ: λ, ν, ρ

Train via gradient descent

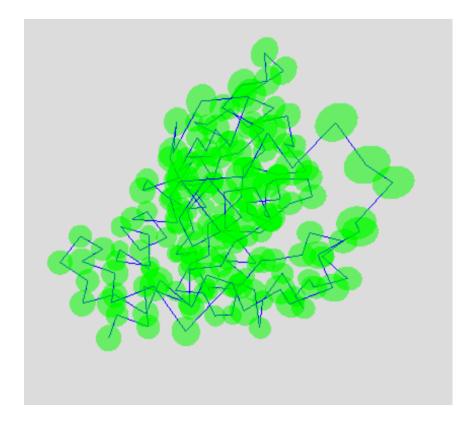
Preliminary Results



Only 0 and 9 predict eachother

Upcoming Work

- Apply to real data
- Compare to other methods



RASH_HUMAN Crystallography