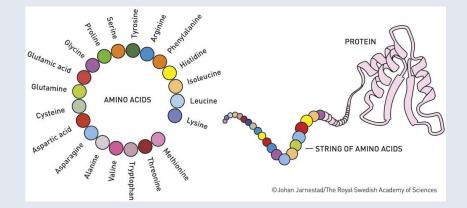
AlphaFold: Predicting Protein Structures

By Kathy Lin Buckingham Browne and Nichols School December 8, 2024

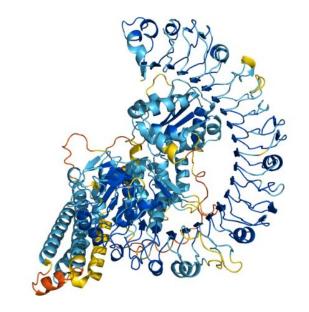
The Protein Folding Problem

- Proteins carry out all of the important functions in all living organisms
- The 3D structure of a protein molecule is essential for its function
- How to determine the structure of proteins based only on its amino acid sequence
- Tons of possible protein folding combinations

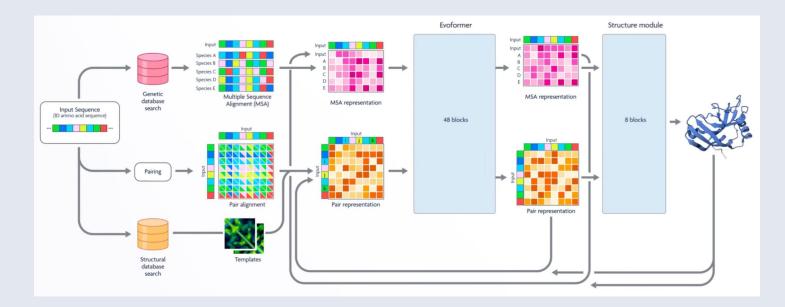


What is AlphaFold?

- Program developed by Google Deepmind
- Uses artificial intelligence to predict the structures of proteins
- Inputs an amino acid sequence and output an image similar to the one on the right

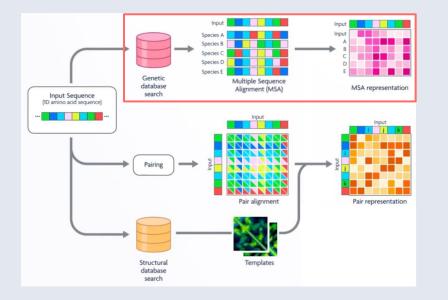


AlphaFold 2 Architecture



AlphaFold 2 takes in an amino acid sequence and outputs a protein structure.

MSA Representation



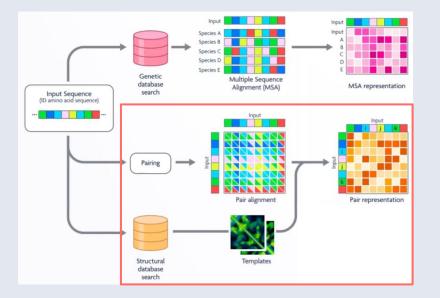
- Short for Multiple Sequence Alignment
- List of amino acid sequences of other proteins that are similar to the input sequence
 - Shows the evolutionary history of the protein
 - Probably evolved from the same source
 - Repeated/similar sections have similar structure and are integral to the function of the protein

- Proteins can mutate by insertion, substitution, or deletion
 - Can't compare positions of amino acids
- Machine learning algorithm tries to find best alignment by inserting a gap token represented by a dash
 - Uses the Needleman–Wunsch algorithm

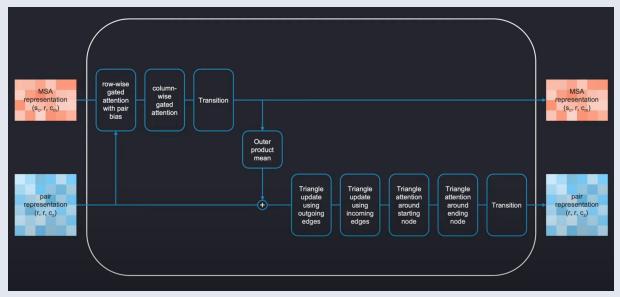
PIAQIHILEGRSDEQKETL-IREVSEAISRSLDAPLTSVRVILTEWMAKGHFGIGTELASK WIAQIDILETRSDEQLLHLPPQEVSEAISRSGDAILVSKRVIQT-EMWFGHFGAGTYLASW

Pair Representation

- AlphaFold also pairs each amino acid with every other amino acid in the sequence
- It searches in many databases for the templates of proteins with similar sequences that have already determined structures
 - Other scientists have figured them out through experimental methods
- This is used to create an initial pair representation
 - Represents the relationship between every pair of amino acids



Evoformer



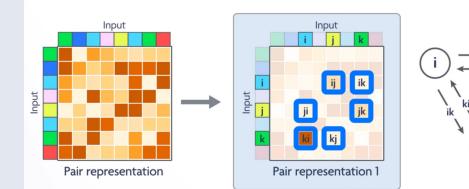
- A neural network that contributes the most parameters to AlphaFold
 - Full model has around 93 million and the Evoformer contributes 88 million
- Updates the MSA and Pair representations
- Has two main stacks that communicate with each other through two information channels

MSA Representation Stack

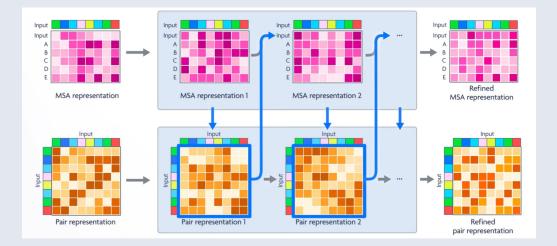
- Model wants to do attention on the MSA representation, but it would be too big
 - Instead splits into two parts
- Row-wise attention between the different amino acids in the input sequence
 - Is able to find the parts of the sequence that are important to the structure/function of the protein
 - Column-wise attention
 - Evaluates the importance of each amino acid in the context of the other sequences from the other proteins

Pair Representation Stack

- The pair representation stack evaluates the relationship between each amino acid
- This can be thought of as nodes and the edges between them, like a graph
- It triangulates the relationship of each pair of nodes in relation to another node
- The goal of this is to satisfy the triangle inequality, which is where the sum of two edges on a triangle must be greater than the third edge



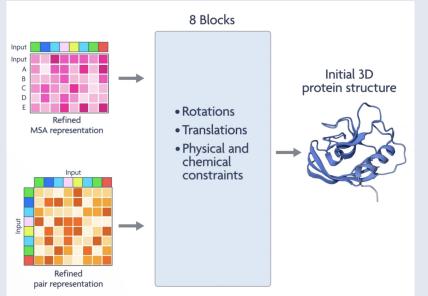
Communication Between Stacks



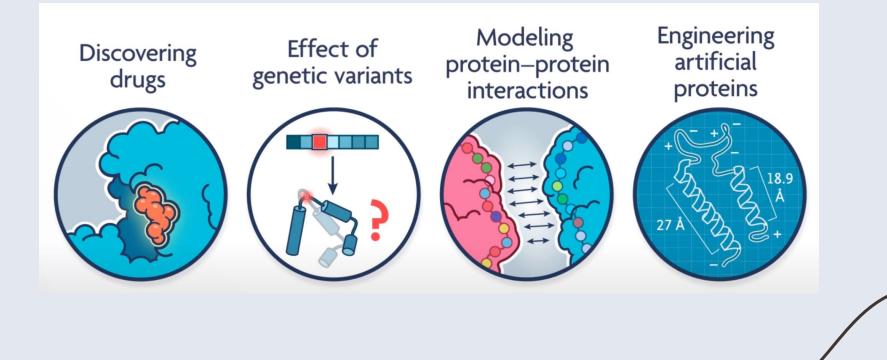
- Pair representation stack takes the information from the updated MSA representation and changes the pair representation accordingly
- Updated pair representation is used in the new MSA representation and so on for a total of 48 times
- The refined MSA and pair representations are created

Structure Module

- Refined MSA and pair representations are put into the Structure Module
- Performs rotations and translations on the amino acids
- Reveals an initial guess of the 3D protein structure
- It also applies physical and chemical constraints based on the atomic bond angles
- Iterated back through the Evoformer and Structure Module three more times to produce the final structure



Applications of AlphaFold



Thanks

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