## **BhageerathH-Pro**

# BhageerathH-Pro: Protein Tertiary Structure Prediction Server Akshata Hegde<sup>1</sup>, Smriti Pranjal<sup>1</sup>, Devendra Prajapat<sup>1</sup>, Shashank Shekhar<sup>1</sup> and B. Jayaram<sup>1,2,3</sup>

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### Key: Auto:Y; CASP\_serv:N; MSA:N; Fragm:Y.v; EMA:Y; MD:Y

BhageerathH-Pro protein tertiary structure prediction server is based on an *ab initio*/homology hybrid methodology. It integrates several methodological innovations designed over the years in SCFBio, such as grid sampling, empirical energy-based scoring, physicochemical filters for screening decoys, RM2TS and NCL methodologies for structure generation, ProTSAV for structure selection, together with template-based homology modeling and molecular dynamics refinement.



Despite the now well-known successes of Alphafold2, we refrained from inserting alphafold2 codes into our methodology and intended to benchmark our server against released experimental structures, and Alphafold predicted structures. The expectation, as we analyze the shortcomings of our server, from CASP to CASP, is that someday soon, physics-based methods can yield reliable tertiary structures.





#### Methodology

BhageerathH-Pro is an advanced version of Bhageerath-H<sup>1</sup> which consists of three major steps of structure generation, quality assessment, and refinement respectively [Figure 1(a)]. The structure generator methodology follows three paths namely, Path A, Path B, and Path C [Figure 1(c)]. Path A caters to the full-length template modeling, while Path B includes the New Chemical Logic of amino acids driven protein alignment and decoys generation<sup>2</sup> and fragment assembly using the previously developed StrGen<sup>3</sup> algorithm. The Bhageerath-*ab initio* module [Figure 1(b)] is implemented as Path C for *ab initio* structure prediction in the absence of homology with an advanced version of RM2TS<sup>4</sup> and an updated smart Bhageerath<sup>5</sup>, that works on loop sampling. The quality assessment pipeline is designed to pull out the best possible structure from the basket of almost a million conformations generated [Figure 2]. The sample conformations are clustered and filtered to retain mutually exclusive topologies, that are scored and ranked using iterative scoring modules like pcSM<sup>6</sup>, Function-driven scoring<sup>7</sup>, and ProTSAV<sup>8</sup> to extract the top 100 structures. The selected structures are energy minimized using PROSEE<sup>9</sup>, and geometry optimized using the deep encoder-based refiner.

The top 5 models thus generated are subjected to molecular dynamics for final refinement. The models resulting from path A are refined using conventional molecular dynamics (5ns). [Figure:3 Path A], whereas the models obtained from path B or C are refined using Conventional MD, Accelerated MD, and Annealing [Figure:3 Path B or C]. Once the simulations are finished, the lowest energy conformer from each simulation is subjected to MMPBSA/GBSA calculations to find the most stable conformer, which is further refined using iterative main chain and side chain minimizations.

## Results

The pipeline outlined above is fully automated and fielded in the recently concluded CASP15 under the TS category as the BhageerathH-Pro server. BhageerathH-Pro has performed reasonably well so far for the targets whose native structures are released in RCSB till now. Out of 7 targets (whose native information is released), BhageerathH-Pro succeeded in predicting 4 of them under low-resolution structures and 3 of them under 5Å of RMSD. Structures submitted from our server are benchmarked with the now famous Alphafold2 structures, and it is observed that for more than 50% of the targets (i.e., 49 out of 94), BhageerathH-Pro structures are within 3Å of RMSD. We have further noticed that mutational effects and functions are well distinguishable in BhageerathH-Pro structures. Most of BhageerathH-Pro modules and tools are freely available in the public domain for the user community.

## Availability

BhageerathH-Pro is an open-source web server and is available at the SCFBio website: <u>http://www.scfbio-iitd.res.in/bhageerathH+/</u>.

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