# An off-lattice HP model with side-chains and S-S bridges impact for protein folding problem

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Abstract: - The proposed model takes into account highest degree of complexity – different size of radiuses of side-chains, mentioned below as radicals, and two stages of algorithm, including random structure initially and subsequent purposeful folding process according to the physical forces and energies. The objective function is three-componential – one member corresponding to the impact of the hydrophobic contacts of side-chains, next one to the impact of hydrogen bonds between peptide chain parts and third to the impact of S-S bridges.

*Key-Words:* - Protein folding prediction, Bioinformatics, Drug Design, Willpower folding, HP model, Amino acid descriptors, S-S bridges

### **1** Introduction

3D structure of proteins is the major factor that determines their biological activity. The synthesis of new proteins and the crystallographic analysis of their 3D structure is very slow and very expensive process. If we can predict the 3D structure of many proteins, than only proteins with expected properties have to be synthesized. That will increase the number of known structures in the databases for proteins, and they can be used for drug design. The prediction of the 3D structure of proteins, if we know only the primary structure - the amino-acid sequence, is a protein folding problem. The reason for this process of folding in water environment is the interaction between water molecules and between amino-acids and water molecules. As water molecule has higher polarity than amino-acids, there is a minimum of energy when the protein is folded, not to spoil water to water interconnections. The way of folding is determined by the polarity or the hydrophobicity of different amino-acids, so the 3D structure with minimum energy is the real case. [1,2,3] There is less energy when more hydrophobic (H) amino-acids (the hydrophobic type of amino acid depends on the middle nucleotide of the codon [4]) are in contact in the core of the folded 3D structure and more polar (P) amino-acids are in contact with water. As we know the amino-acid sequence and the hydrophobicity of every aminoacid, we can predict the 3D structure - this method is called HP folding [5]. The closest to our model type of HP model is the off-lattice one, following the approach know as HP folding.

### **2** Problem Formulation

#### 2.1 Description of the set of feasible solutions

#### 2.1.1 Structure and contact defining constraints

Let  $x_i, y_i, z_i \in \mathbb{R}$  be the unknown coordinates of the alpha carbon atoms,  $xr_i, yr_i, zr_i \in \mathbb{R}$  be the coordinates of the centers of the radicals and  $r_i$  be the normalized radiuses of the radicals, for the  $i^{th}(j^{th})$  amino acid in the peptide chain, where *n* is the number of amino acids:

$$0.9 \le \sqrt{(x_i - x_{i+1})^2 + (y_i - y_{i+1})^2 + (z_i - z_{i+1})^2} \\ \le 1.1$$
  
$$\sqrt{(x_i - xr_{i+1})^2 + (y_i - yr_{i+1})^2 + (z_i - zr_{i+1})^2} \\ \le 1.1(r_i + 0.3)$$

$$(1) \quad 0.6 \leq \sqrt{(x_i - x_j)^2 + (y_i - y_j)^2 + (z_i - z_j)^2}$$
$$\leq \sqrt{(xr_i - xr_j)^2 + (yr_i - yr_j)^2 + (zr_i - zr_j)^2}$$
$$0.9(r_j + 0.3)$$
$$\leq \sqrt{(x_i - xr_j)^2 + (y_i - yr_j)^2 + (z_i - zr_j)^2}$$
$$\leq 1.1(r_j + 0.3)$$

The constraints below are on corresponding euclidean distances between  $i^{th}$  and  $j^{th}$  alpha carbon atoms and centers of radicals:

$$\sqrt{(x_{i} - x_{j})^{2} + (y_{i} - y_{j})^{2} + (z_{i} - z_{j})^{2}} \le 0.8$$
(2)  $\sqrt{(xr_{i} - xr_{j})^{2} + (yr_{i} - yr_{j})^{2} + (zr_{i} - zr_{j})^{2}} \le 1.2(r_{i} + r_{j})$ 

The goal of the willpower folding is to maximize the contacts between the radicals of hydrophobic amino acids, the contacts between the radicals of cysteines and the contacts between the alpha carbon atoms of all amino acids and the radicals with electrical charge not in contact – to find the maximum of the following objective function:

(3) 
$$F(fold) = \sum_{\substack{i \text{ contact } j \text{ redicals}}} (h_i + h_j + wtw + s_i s_j - c_i c_j) + \sum_{\substack{i \text{ contact } j \text{ a carbons}}} wtw,$$

where  $h_i$  is the hydrophobicity value of the amino acid, *wtw* is a parameter for the influence of hydrogen bonds.

#### 2.2 Model description

The main purpose of the developed algorithm is to create a structure with low potential energy, starting from randomly folded form, instead of looking for the best structure among wholly randomly generated forms. Each amino acid is represented as the position of the alpha carbon atom and the position of the center of the radical with three-dimensional coordinates. The first stage is to generate a three-dimensional shape by randomly turning the peptide chain in 90 degrees and a distance 1 between the alpha carbon atoms in the peptide chain and between each alpha carbon and the radical center of the same amino-acid. For prevention of making rather spread or rather tight forms, there is used variable constraint of spreading [6]. Also, the center of the radicals (side-chains) of every next amino acid are not placed at closer distance than 2 (at least 2).

The second stage, which is called "Willpower folding" [7], is to purposefully modify the 3D structure in order to minimize the energy while using now non-integer coordinates. In order to build a more nature like 3D form, we use four descriptors of each type of amino acid, which are taken from their different native (physical, chemical, geometrical) properties - 'h' for hydrophobicity, 'r' is already mentioned for size of the side-chain, 's' for ability to form S-S bridge, 'c' for electrical charge. These descriptors are given in the following table:

name	h	r	S	c
alanine	1.8	0.2	0	0
glycine	-0.4	0.1	0	0
methionine	1.9	0.6	0	0
aspartic acid	-3.5	0.9	0	10
asparagine	-3.5	0.6	0	0
valine	4.2	0.5	0	0
leucine	3.8	0.7	0	0
isoleucine	1	0.7	0	0
glutamic acid	-3.5	0.9	0	10
glutamine	-3.5	0.7	0	0
arginine	-1	0.9	0	0
serine	-0.8	0.4	0	0
threonine	-0.7	0.5	0	0
cysteine	2.5	0.4	10	0
lysine	-3.9	0.8	0	0
histidine	-3.2	0.8	0	0
phenylalanine	2.8	0.7	0	0
tyrosine	-1.3	0.7	0	0
proline	-1.6	0.5	0	0
tryptophan	-0.9	0.9	0	0

 Table 1 Descriptors of amino acids

### 2.3 Willpower folding

The steps of the algorithm for maximizing (3) subject to (1) and (2) are given below:

1. Locate the conditional center as the arithmetic mean of the three directions:

$$x_{c} = \sum_{i=1}^{n} \frac{xr_{i}}{n}; \ y_{c} = \sum_{i=1}^{n} \frac{yr_{i}}{n}; \ z_{c} = \sum_{i=1...n} \frac{zr_{i}}{n}$$

2. Displace the coordinates of the radicals in proportion to their hydrophobicity value  $h_i$ , if the  $h_i > 0$  direction is to the center of the molecule, and if  $h_i < 0$  is opposite:  $x_{ni} = x_i + 0.02h_i$ ,  $x_c > x_i$ ;  $x_{i\_new} = x_i - 0.02h_i$ ,  $x_c < x_i$ ;  $y_{i\_new} = y_i + 0.02h_i$ ,  $y_c > y_i$ ;  $y_{i\_new} = y_i - 0.02h_i$ ,  $y_c < y_i$ ;  $z_{i\_new} = z_i + 0.02h_i$ ,  $z_c > z_i$ ;  $z_{i\_new} = x_i - 0.02h_i$ ,  $z_c < z_i$ ;

- 3. Displace the coordinates of the alpha carbon atoms to the center of the molecule:  $x_{i\_new} = x_i+0.01$ ,  $x_c > x_i$ ;  $x_{i\_new} = x_i-0.01$ ,  $x_c < x_i$ ;  $y_{i\_new} = y_i+0.01$ ,  $y_c > y_i$ ;  $y_{i\_new} = y_i-0.01$ ,  $y_c < y_i$ ;  $z_{i\_new}=z_i+0.01$ ,  $z_c > z_i$ ;  $z_{i\_new} = x_i-0.01$ ,  $z_c < z_i$ ;
- 4. Correct the positions of all alpha carbon atoms and radicals in order to preserve the peptide chain, such as alpha-carbon *i* approaching *i* + 1 and radical *i* approaching the alpha carbon atom *i* if

 $\sqrt{(x_i - x_{i+1})^2 + (y_i - y_{i+1})^2 + (z_i - z_{i+1})^2} \le 1.1, x_{i\_new} = x_i + (x_{i+1} - x_i)/10; y_{i\_new} = y_i + (y_{i+1} - y_i)/10; z_{i\_new} = z_i + (z_{i+1} - z_i)/10; xr_{i\_new} = xr_i + (x_i - xr_i)/10; yr_{i\_new} = yr_i + (y_i - yr_i)/10; zr_{i\_new} = zr_i + (z_i - zr_i)/10;$ 

5. Separate the coordinates of the radicals of electrically charged amino acids from one another if

 $\sqrt{(xr_{i} - xr_{j})^{2} + (yr_{i} - yr_{j})^{2} + (zr_{i} - zr_{j})^{2}} \leq 2, xr_{i\_new} = xr_{i} - (xr_{j} - xr_{i})/10; yr_{i\_new} = yr_{i} - (yr_{j} - yr_{i})/10; zr_{i\_new} = zr_{i} - (zr_{j} - zr_{i})/10; xr_{j\_new} = xr_{j} - (xr_{i} - xr_{j})/10; yr_{j\_new} = yr_{j} - (yr_{i} - yr_{j})/10; zr_{j\_new} = zr_{j} - (zr_{i} - zr_{j})/10;$ 

6. Reduce the distance radical coordinates of closely spaced hydrophobic amino acids if

 $\sqrt{(xr_{i} - xr_{j})^{2} + (yr_{i} - yr_{j})^{2} + (zr_{i} - zr_{j})^{2}} \leq 2, xr_{i\_new} = xr_{i} + (xr_{j} - xr_{i})/20; yr_{i\_new} = yr_{i} + (yr_{j} - yr_{i})/20; zr_{i\_new} = zr_{i} + (zr_{j} - zr_{i})/20; xr_{j\_new} = xr_{j} + (xr_{i} - xr_{j})/20; yr_{j\_new} = yr_{j} + (yr_{i} - yr_{j})/20; zr_{j\_new} = zr_{j} + (zr_{i} - zr_{j})/20; zr_{j\_new} = zr_{j} + (zr_{i}$ 

- 7. Reduce the distance radical coordinates of closely spaced cysteine amino acids if  $\sqrt{(xr_i xr_j)^2 + (yr_i yr_j)^2 + (zr_i zr_j)^2} \leq 2, xr_{i\_new} = xr_i + (xr_j xr_i)/20; yr_{i\_new} = yr_i + (yr_j yr_i)/20; zr_{i\_new} = zr_i + (zr_j zr_i)/20; xr_{j\_new} = xr_j + (xr_i xr_j)/20; yr_{j\_new} = yr_j + (yr_i yr_j)/20; zr_{j\_new} = zr_j + (zr_i zr_j)/20;$
- 8. Reduce the distance the coordinates of the alpha carbon atoms of closely spaced amino acids if

 $\sqrt{(xr_i - xr_j)^2 + (yr_i - yr_j)^2 + (zr_i - zr_j)^2} \le 2, xr_{i\_new} = xr_i + (xr_j - xr_i)/20; yr_{i\_new} = yr_i + (yr_j - yr_i)/20; zr_{i\_new} = zr_i + (zr_j - zr_i)/20; xr_{j\_new} = xr_j + (xr_i - xr_j)/20; yr_{j\_new} = yr_j + (yr_i - yr_j)/20; zr_{j\_new} = zr_j + (zr_i - zr_j)/20;$ 

9. Adjust the positions of all alpha carbon atoms to avoid overlapping if  $0.6 > \sqrt{(x_i - x_j)^2 + (y_i - y_j)^2 + (z_i - z_j)^2}$ as  $j \neq i+1$ , and

$$0.9 > \sqrt{(x_i - x_j)^2 + (y_i - y_j)^2 + (z_i - z_j)^2}$$
  
as  $j = i+1$ ,  $x_{i\_new} = x_i-0.1(x_j-x_i)/((x_j-x_i)^2 + (y_j-y_i)^2 + (z_j-z_i)^2)$ ;  $y_{i\_new} = y_i-0.1(y_j-y_i)/((x_j-x_i)^2 + (y_j-y_i)^2 + (z_j-z_i)^2)$ ;  $z_{i\_new} = z_i-0.1(z_j-z_i)/((x_j-x_i)^2 + (y_j-y_i)^2 + (z_j-z_i)^2)$ ;

10. Correct the positions of all radicals to avoid overlapping if  $0.9(r_i + r_i) >$ 

$$\sqrt{\left(xr_{i} - xr_{j}\right)^{2} + \left(yr_{i} - yr_{j}\right)^{2} + \left(zr_{i} - zr_{j}\right)^{2}}, xr_{i\_new} = xr_{i} - 0.1(xr_{j} - xr_{i})/((xr_{j} - xr_{i})^{2} + (yr_{j} - yr_{i})^{2} + (zr_{j} - zr_{i})^{2}); yr_{i\_new} = yr_{i} - 0.1(yr_{j} - yr_{i})/((xr_{j} - xr_{i})^{2} + (yr_{j} - yr_{i})^{2} + (zr_{j} - zr_{i})^{2}); zr_{i\_new} = zr_{i} - 0.1(zr_{j} - zr_{i})/((xr_{j} - xr_{i})^{2} + (yr_{j} - yr_{i})^{2} + (zr_{j} - zr_{i})^{2});$$

11. Adjust positions to avoid overlapping between the alpha carbon atom and the radical, if  $0.9(r_i + 0.3) >$ 

$$\sqrt{\left(xr_{i} - xr_{j}\right)^{2} + \left(yr_{i} - yr_{j}\right)^{2} + \left(zr_{i} - zr_{j}\right)^{2}}, xr_{i\_new} = xr_{i} - 0.1(xr_{j} - x_{i})/((xr_{j} - r_{i})^{2} + (yr_{j} - y_{i})^{2} + (zr_{j} - x_{j})^{2})$$

$$z_i^2$$
;  $yr_{i\_new} = yr_i - 0.1(yr_j - y_i)/((xr_j - x_i)^2 + (yr_j - y_i)^2 + (zr_j - z_i)^2)$ ;  $zr_{i\_new} = zr_i - 0.1(zr_j - z_i)/((xr_j - r_i)^2 + (yr_j - r_i)^2 + (zr_j - z_i)^2)$ ;

### 2.4 Thermo effect

What we call "Thermo effect" is to make a small random move in every step of Willpower folding, which corresponds to the real environment. This prevents building equal structures if the initial random fold is the same and gives more chance to find better structure. This random value is limited to the half of the main value in each step.

### **3 Problem Solution**

First, using our definition of contact (2), we find the contacts in the real structure of protein 1UUB, using the coordinates of alpha carbons in PDB file of the protein data bank (Figure 1).



Fig. 1 Real structure of protein 1UUB

There are different 3D structures from crystallographic analysis and for one of them the coordinates of alpha carbons are extracted in the list below:

inde	ex x y z
1	-2.218 6.755 3.480
2	-4.621 3.954 4.056
3	-7 988 5 520 3 295
1	7 352 7 803 2 541
4 5	4 112 10 556 2 176
5	-4.113 10.556 2.176
6	-1.323 9.910 -0.509
7	-0.515 6.072 -0.433
8	3.197 5.086 -0.245
9	4.212 3.553 -3.604
10	8.005 3.596 -3.100
11	9.443 4.804 0.307
12	12.187 2.112 0.559
13	12.068 -0.142 -2.577
14	11 132 0 806 -6 186
15	7 324 0 560 6 688
16	<i>1</i> .324 0.300 -0.088
10	4.874 -2.320 -0.139
1/	1.040 -2.2/3 -6.595
18	-2.213 -3.720 -5.226
19	-5.330 -2.113 -3.563
20	-5.601 0.989 -1.332
21	-8.565 3.100 -0.080
22	-9.103 6.424 -1.965
23	-12.241 7.358 0.083
24	-12.673 10.573 -1.937
25	-12.668 9.795 -5.706
26	-14.112 6.302 -5.914
27	-12 562 4 930 -2 720
28	12.302 + .
20	7 707 2 200 5 222
29	-1.101 2.290 -3.333
30	-4.103 0.917 -5.879
31	-0.392 1.344 -4.693
32	0.410 -1.734 -2.470
33	3.871 -0.480 -1.399
34	7.387 0.313 -2.544
35	9.598 -0.882 0.283
36	9.562 -0.541 4.116
37	7.032 -2.287 6.484
38	4.723 -2.774 3.431
39	3.016 0.453 4.721
40	0 454 -1 906 6 433
41	-2 162 -0 992 3 702
<u>11</u>	-2 112 -3 909 1 253
42	5 415 5 020 0 246
43	-3.413 -3.029 -0.240
44	-0.304 -7.075 -3.349
45	-10.212 -6.890 -3.527
46	-13.385 -5.372 -1.978
47	-13.218 -7.679 1.064
48	-9.590 -6.631 1.648
49	-10.227 -2.931 1.145
50	-13.241 -3.183 3.471
51	-11.616 -5.095 6.386

52	-8.886	-2.430	6.608
53	-10.830	0.858	6.007
54	-14.064	-0.108	4.206
55	-16.218	-1.270	7.116
56	-14.212	-0.494	10.258

There are 125 contacts according to the constraints (2) above.

The test run of the program, realizing the algorithm on 1UUB obtains the following results: among only 100000 randomly generated structures, the value of the evaluation function is 1578.4 and there are 209 contacts -60 matches with the real one (Figure 2).. The time needed was 70 min on PC, Intel i5, 2.26GHz. The list of the coordinates of alpha carbons carbons are given in the list below:

index(0 for first AA in chain),x,y,z 0.0.984.1.479.-0.860 1,0.595,1.471,-1.802 2,0.132,0.683,-2.314 3,0.428,0.089,-1.874 4,0.859,0.869,-0.388 5,1.751,0.360,-0.755 6,0.546,-0.147,-1.145 7,1.158,0.411,-1.710 8,0.299,0.753,-1.483 9,1.012,0.689,-0.897 10,1.743,0.867,-0.268 11,1.425,0.584,0.857 12,1.940,1.214,0.382 13,2.582,2.052,0.265 14,3.114,2.684,0.912 15,3.834,2.074,1.510 16,3.090,1.806,0.987 17,2.136,1.809,0.899 18,2.464,0.875,0.926 19,2.524,-0.213,1.317 20,1.938,0.432,1.326 21,1.208,0.543,2.303 22,0.676,-0.110,1.448 23,-0.132,0.385,2.137 24,-0.399,1.309,2.425 25,-1.056,0.870,1.722 26,-0.300,0.413,1.33 27,-1.027,1.131,0.888 28,-1.044,1.885,1.511 29,-0.290,1.261,1.690 30,0.586,0.623,1.648 31,1.477,1.044,1.654 32,0.752,0.960,0.939 33,0.755,1.319,1.811 34,1.268,1.558,1.044 35,0.319,1.700,1.189 36,-0.309,2.236,0.649 37,-1.160,1.891,0.653 38,-1.404,2.169,-0.187

39,-1.637,1.267,-0.477
40,-1.726,0.275,-0.720
41,-1.740,-0.790,-0.716
42,-1.974,-1.355,-1.362
43,-2.695,-2.118,-1.634
44,-3.332,-2.900,-1.226
45,-2.590,-3.598,-0.945
46,-2.282,-2.706,-1.170
47,-2.441,-1.751,-0.830
48,-1.733,-1.921,-0.078
49,-1.711,-3.015,-0.185
50,-1.774,-2.299,-0.780
51,-1.506,-2.045,-1.585
52,-0.997,-2.679,-1.009
53,-0.0354,-2.635,-1.633
54,-0.647,-1.702,-1.267
55,-0.871,-2.453,-1.855

The other experiment we done, is to find out how much better structure could be built, classifying fold not by evaluation function, but by ratio contacts matching ratio. In this way we obtain the following structure with 62 contacts matches out of 120 (Figure 3). The list of the coordinates of alpha carbons carbons are given in the list below:

index(0 for first AA in chain),x,y,z 0,-0.928,-0.754,-0.314 1,-1.907,-0.841,0.149 2,-1.690,-1.128,1.196 3,-1.002,-1.843,1.631 4,-1.113,-2.201,0.609 5,-0.643,-3.032,0.072 6,0.193,-3.319,0.710 7,0.373,-4.382,0.479 8,0.799,-5.388,0.504 9,1.345,-5.157,1.162 10,1.250,-4.519,1.965 11.0.779,-4.836,2.897 12,1.105,-5.664,2.807 13,1.990,-6.288,2.973 14,2.144,-6.985,3.815 15,2.017,-8.015,4.178 16,1.943,-9.046,4.533

17,2.067,-9.92,4.720 18,2.412,-10.694,5.496 19,2.331,-12.359,6.122 20,1.371,-12.539,6.237 21,0.373,-12.491,5.327 22,0.481,-11.828,4.463 23,0.726,-12.599,4.078 24,1.492,-13.371,4.144 25,2.192,-13.415,4.979 26,1.543,-12.748,5.496 27.1.025.-11.796.5.323 28,1.837,-11.080,5.451 29,2.691,-11.313,5.256 30,3.177,-12.009,4.658 31,2.369,-12.077,4.267 32,1.818,-11.218,3.885 33,1.333,-10.919,2.623 34.0.247.-10.731.0.678 35,-0.674,-10.534,0.938 36,-1.684,-10.816,0.609 37,-2.431,-10.0376,0.476 38, -2.578, -9.671, -0.536 39,-2.916,-9.502,-1.575 40,-2.751,-8.954,-2.508 41,-2.453,-9.365,-3.249 42,-2.155,-10.230,-3.648 43,-2.500,-10.539,-4.535 44,-3.422,-11.087,-4.778 45,-4.116,-11.888,-4.507 46,-4.582,-12.808,-4.904 47, -3.998, -13.677, -5.224 48,-3.159,-13.512,-4.923 49,-3.025,-12.638,-5.225 50,-2.631,-12.076,-6.079 51,-3.242,-12.582,-6.384 52,-3.202,-13.470,-7.010 53,-2.528,-14.188,-6.569 54,-1.799,-13.595,-5.997 55,-1.215,-13.086,-6.457

Remark: for the source code in C++ and the list of contacts' couples, mail to itodorin@gmail.com.



**Fig. 2** The structure with 60 matches



Fig. 3. The structure with 62 contacts matches

### **4** Conclusions

This approach for protein folding prediction, using "Willpower folding" with "Thermo effect", appear to be faster than models for finding best structure among randomly built structures. Therefore it is possible rather more structures of proteins to be processed for the same time. Even more, the model is at age under year and might be further developed in direction of granularity placing every atom, and the evaluation function could take into account the real physical values of the impact of the distribution of electronic density such degree of granularity is hard to be executed considering computational time through models for finding best structure among randomly built structures.

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### Reference

- 1. A. Kolinski and J. Skolnick, Monte Carlo simulations of protein folding. i. lattice model and interactionscheme, *Proteins*, vol. 18, 1994, pp. 338-352.
- 2. B. Berger, and T. Leighton, Protein folding in the hydropho-bichydrophilic (HP) model is NPcomplete, *Journal of Computational Biology*, vol. 5, 1998, pp. 27-40.
- 3. H. Greenberg, W. Hart, G. Lancia, Opportunities for combinatorial optimization in computational biology, *INFORMS Journal on Computing*, vol. 16, 2004, pp. 211-231.
- P. Milanov, I. Trenchev, N. Pencheva, Explicit description of the set of all theoretical genetic codes, Mathematica Balkanica, vol. 17, 2004, pp. 157-165.
- 5. S. Istrail, and F. Lam, Combinatorial algorithms for protein folding in lattice models: A survey of mathematical results, *Commun. Inf. Syst.*, vol. 9, 2009, pp. 303-346.
- I. Todorin, A Model for HP folding prediction using variable size of lattice, *Proceedings of the Fifth International Scientific Conference – FMNS2013*, vol. 1, 2013, pp. 188-192.
- I. Todorin, Protein Folding Prediction using two stages over random made structure – "Bridge Building" and "Willpower Folding", *SDNS*, vol. 1, 2017, pp. 1-6 (in printing).