

## A STATISTICAL ANALYSIS TO FIND OUT AN APPROPRIATE DOCKING METHOD

JUN M KALITA\*, SURAJIT K GHOSH, SUPRIYA SAHU, MAYURAKHI DUTTA

Department of Pharmaceutical Sciences, Dibrugarh University, Dibrugarh, Assam, India. Email: pjmk84@gmail.com

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## ABSTRACT

**Objective:** The objective of the study was to determine a suitable and reliable docking protocol based on a statistical study.

**Methods:** Statistical analysis was done to find out the co-relation between *in-silico* and *in-vitro* results.

**Results:** All the docking method shown acceptable root mean square deviation (RMSD) value those were found to be less than that of 2 Å. Coefficient of co-relation value was also quite satisfactory with highest of  $r = 0.6574$  and  $r_s = 0.8322$  for LigandFit.

**Conclusion:** Among the three docking method used for the study, LigandFit was found to be more appropriate as it shown low RMSD and high co-relation coefficient.

**Keywords:** Dihydrofolate reductase, 1J3I, LigandFit, CDOCKER, Gold, Karl Pearson's coefficient of correlation, Spearman's rank correlation ( $r_s$ ).

## INTRODUCTION

Docking, the important tool in drug design and discovery involves search of the best possible conformations and orientations of a ligand in the target binding site [1,2]. Virtual screening tools are an important part of the modern era of drug design and discovery. It is a tedious task to find out the most suitable virtual screening tool mainly in case of protein ligand docking [3-7]. LigandFit is a shape based docking of a flexible ligand at the active site of the protein by cavity detection method, various spaces inside the target protein active site are searched as correspond to the shape of the ligands. A combination of shape comparison filter and Monte Carlo technique is used to search various ligand poses and then these poses are minimized within the active site to get protein ligand interaction energy [8-11]. CDOCKER is a CHARMM-based docking engine where flexible ligands are docked at protein active site. Several random conformations of the ligand are generated at the protein active site which is then followed by MD-based simulated annealing composed of several heating and cooling steps. The final score is obtained by energy minimization process [12,13]. Whereas GOLD docks flexible ligands at the protein active site by employing a genetic algorithm (GA) [14,15].

The strength of association of two sets of variables can be measured by the use of different coefficients. Among them the three most widely used are Pearson's coefficient of correlation ( $r$ ), spearman's rank correlation ( $r_s$ ), and Kendall's tau coefficient ( $T$ ) [16]. Here in the present work Pearson's coefficient of correlation and Spearman's rank correlation are been used to select a best docking method on the basis of correlation between dock score and reported inhibitory concentration 50 values of some anti-folate molecules.

Although difficult, it is important to select the best docking tool that can be suitable for a particular study. In the present work comparative, statistical analysis is been carried out to select the most suitable docking method out of three selected methods [17].

## METHODS

*In silico* study

## Preparation of protein

X-ray crystal structure of wild type *Pf*-DHFR-TS complex was obtained from protein data bank using Accelrys' Discovery studio

version 2.5 (PDB entry code: 1J3I). Water molecules, co-crystallized ligand WR99210 were removed and cofactors Nicotinamide adenine dinucleotide phosphate, dUMP was allowed to retain. Finally, receptor was prepared according to the requirements of the docking protocols LigandFit, Gold and CDOCKER.

## Preparation of ligand

Reference ligands (Fig. 1) were prepared by Marvin sketch tool as supported by Sanjeevani online program. The 3D structures of the ligands were imported to Discovery Studio workplace and energy minimization was done by applying CharmM forcefield.

## Docking

Validation of all the docking protocol was done by the calculating root mean square deviation (RMSD) value of the docked ligand with respect to the co-crystallized ligand (Fig. 2).

## LigandFit

In order to simulate the biological environment, CharmM forcefield was applied. Sites were generated from the receptor protein, and site 1 was selected for docking. All the molecules were docked keeping dreiding energy grid with an extension of 5.0 Å, dielectric constant as 1.0, and parallel processing was kept as false. Binding energy of the docked molecules was calculated using calculate binding energy protocol.

## Gold

Receptor protein was prepared according to the requirements of the protocol. A sphere was constructed around active site 1 and molecules were docked at the active site. This docking protocol employs GA to dock the molecules at the assigned site. GA was speeded up by 7-8 times, and GA automatic search efficiency was kept as 100.0. Finally, binding energy was calculated using calculate binding energy protocol.

## CDOCKER

This is a CHARMM forcefield based docking method where a sphere was constructed around the active site of the receptor protein. Molecules were then docked at the active site keeping simulated annealing as true and parallel processing was kept false. Finally, ligand-protein binding energy was calculated for all the docked ligands.

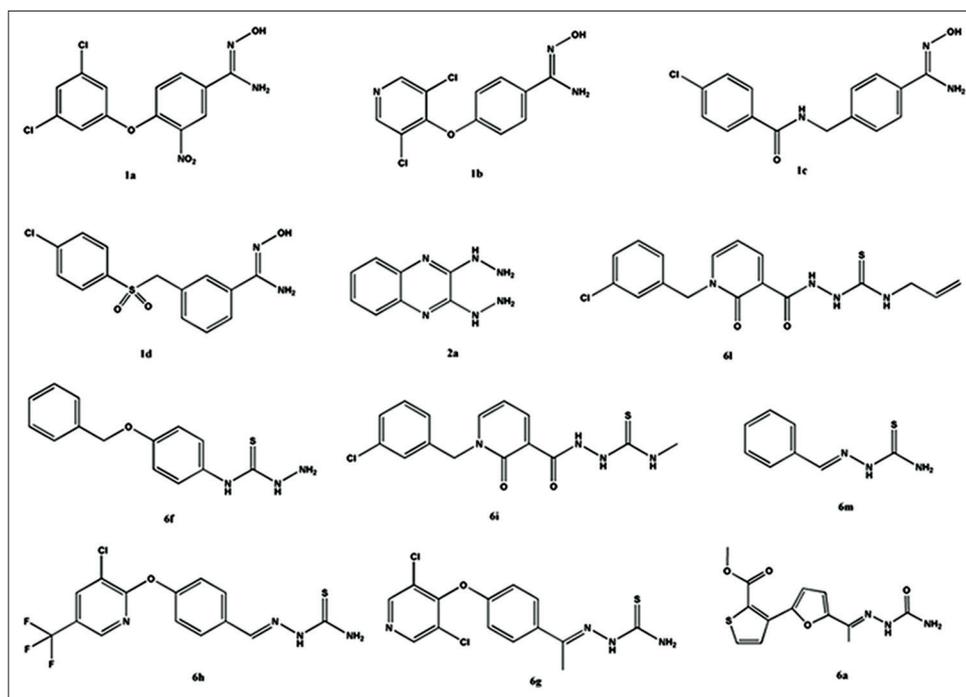


Fig. 1: Structure of the reference ligands used for the study

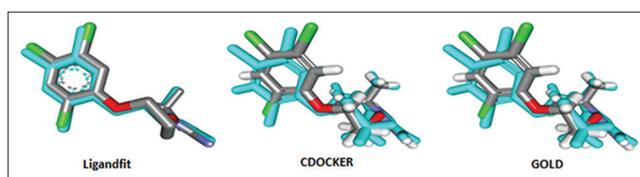


Fig. 2: Root mean square deviation poses for the docking protocols

$$r = \frac{n \sum xy - (\sum x)(\sum y)}{\sqrt{[n \sum x^2 - (\sum x)^2][n \sum y^2 - (\sum y)^2]}} \quad r_s = 1 - \frac{6(\sum d^2)}{n(n^2 - 1)}$$

Fig. 3: Formula used for the calculation of co-relation coefficient

### Statistical analysis

$K_i$  values for the reference ligand were obtained from Ref [8] then the data were organized and Karl Pearson's coefficient of correlation ( $r$ ) and Spearman's rank correlation ( $r_s$ ) were calculated using the standard formulas as shown in Fig. 3.

### RESULTS AND DISCUSSIONS

Calculated RMSD value reveals that docking protocol LigandFit closely reproduces the co-crystallized ligand with an RMSD value of 0.248 Å whereas RMSD value for CDOCKER and Gold was found to be 0.538 Å and 0.6187 Å (Fig. 2). Although an RMSD value <2 Å is considered as valid, here docking protocol LigandFit can be said as most accurate because of its lowest RMSD value.

Calculated Karl Pearson coefficient of correlation ( $r$ ) and rank correlation ( $r_s$ ) signifies that docking protocol LigandFit is more accurate than that of other docking protocols. As in the case of LigandFit both Karl Pearson coefficient of correlation ( $r$ ) and rank correlation ( $r_s$ ) are greater and more near to one (Table 1). This signifies that the docking value obtained from LigandFit fits more accurately to the practical  $K_i$ . Finally, it can be concluded that the accuracy of docking protocol follows the

Table 1: Estimated binding energy and  $K_i$  values

Molecule*	$K_i^*$	(-) Binding energy LigandFit	(-) Binding energy CDOCKER	(-) Binding energy Gold
1a	2.4	133.038	57.568	60.028
1b	25.2	47.195	115.170	42.770
1c	77.2	16.096	43.722	45.628
1d	102	12.389	20.464	12.802
2a	3.6	71.560	45.576	41.101
6a	9.7	70.968	136.419	61.520
6f	13.7	70.231	85.708	60.617
6g	0.9	121.749	137.807	129.082
6h	5.2	60.205	126.214	165.403
6i	11.3	38.629	60.156	78.402
6l	15.2	15.687	43.880	58.592
6m	23.6	68.969	30.926	33.067

\* $K_i$  values were obtained from ref no. [18],  $r=0.6574$ ;  $r_s=0.5172$ ;  $r=0.5324$ ,  $r_s=0.8322$ ;  $r=0.6294$ ;  $r_s=0.6364$ , RMSD=0.248; RMSD=0.538; RMSD=0.6187, Coefficient of correlation ( $r$ ), rank correlation ( $r_s$ ), RMSD: Root mean square deviation

following order LigandFit > CDOCKER > Gold, where LigandFit is more accurate, and Gold is the least.

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