

Review Article

MOLECULAR DOCKING: AN EXPLANATORY APPROACH IN STRUCTURE-BASED DRUG DESIGNING AND DISCOVERY

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ABSTRACT

Molecular docking is a modeling tool of Bioinformatics which includes two or more molecules which interact to provide a stable product in the form of a complex. Molecular docking is helpful in predicting the 3-d structure of a complex which depends on the binding characteristics of Ligand and target. Also, it is a structure-based virtual screening (SBVS) utilized to keep the 3-d structures of small molecule which are generated by computers into a target structure in various types of conformations, positions and orientations. This molecular docking has come out to be a novel concept with various types of advantages. It behaves as a highly exploring domain due to its significant structure-based drug design (SBDD), Assessment of Biochemical pathways, Lead Optimization and in De Novo drug design. In spite of all potential approaches, there are certain challenges which are scoring function (differentiate the true binding mode), ligand chemistry (tautomerism and ionization) and receptor flexibility (single conformation of rigid receptor). The area of computer-aided drug design and discovery (CADD) has achieved large favorable outcomes in the past few years. CADD has been adopted by various big pharmaceutical companies for leading discoveries of drugs. Many researchers have worked in order to examine different docking algorithms and to predict molecules' active site. Hence, this Review article depicts the whole sole of Molecular Docking.

Keywords: Molecular Docking, Drug Discovery, Conformations, Ligand, Optimization, Protein Flexibility

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INTRODUCTION

Molecular Docking involves the anticipation of the recommended conformation of the ligand against receptor (Protein) to achieve a complex which is stable [1]. These recommended orientations are thus used in predicting the affinity of binding amongst the ligand and protein by the help of scoring functions. Thus Docking mainly aims at anticipating the binding orientations of drug candidates in response to a particular target protein to check the activity of the drug molecule in order to achieve a specific drug design and discovering a novel drug (fig. 1). But there is a requirement of previous knowledge of the favorable orientation predicting the binding strength of two molecules by the help of a scoring function. Docking also aims at the formation of rational drug designs by attaining a stable ligand-receptor complex with minimum binding free energy [2]. There are various factors that predict the binding free energy (ΔG_{bind}) displayed in the form of different parameters such as electrostatic (ΔG_{elec}), hydrogen bond (ΔG_{hbond}), torsional free energy (ΔG_{tor}), desolvation (ΔG_{desolv}), dispersion and repulsion (ΔG_{vdw}), total internal energy (ΔG_{total}) and unbound energy of system (ΔG_{unb}). Consequently, one needs a profound knowledge about the common ethics governing the prediction of binding free energy (ΔG_{bind}) providing extra indications of interacting molecules which will lead to the stable docking procedures [3]. Also the docking technique aims at computationally simulating the process of identification of molecules and achieving a better conformation so as to minimize the overall free energy of the system. It is very difficult to discover a new drug. *In silico*-chemico biological approaches are the main bases of modern drug discovery. A lot of popularity, implementation and appreciation had been gained by the use of computer-aided procedures in the discovery of drugs and generation procedures. There are multiple software and tools which can be utilized in Computer-aided Drug Design (CADD) including-Auto-Dock (<http://vina.scripps.edu/>), DOCK (<http://dock.compbio.ucsf.edu/>), FlexX (<https://dblp.org/pid/64/5059.html>), Glide (<https://www.schrodinger.com/products/glide>), GOLD (<https://www.ccdc.cam.ac.uk/support-and-resources/ccdcresources/>) and Ligand Fit (<https://www.phenix-online.org/>).

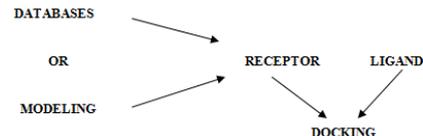


Fig. 1: Basic molecular docking procedure [2]

Computational approaches to drug discovery or CADD

Computer-aided Drug Design (CADD) is an extensively used term since 1980. It represents the computer-based approaches as a tool and a source for the storing, managing, analyzing and modeling of compounds. Various features of drug discovery can be explored by the CADD approach like the designing of compounds, studying chemical interactions and assessment of potentially leading candidates [4]. CADD can be principally applied to achieve the identification, validation and optimization of the target molecule and even for the preclinical trials [5-8]. The cost for the development of drugs can be decreased up to 50% by the CADD approach [9]. The virtual screening involves the examination of a large no. of databases of compounds to search for the binding capacity for a target. Out of the huge databases, an appropriate subset of compounds is selected. This technique thus reduces the amount of compounds to be tested by conducting various experiments and enhancing the hit rate of novel drugs [10].

- The computational approach is beneficial in drug designing and development.
- Novel Drug discovery and optimization can be achieved by the chemical and biological information gathered about the target and the ligand from the computational databases.
- Some *in silico* filters have been designed to remove chemical compounds with unwanted properties and for the selection of the most appropriate candidate.

d. By the use of computational approaches, it becomes easy to identify the novel drug target. Also the protein data bank proves to

be a promising tool for the retrieval of target protein structure (fig. 2).

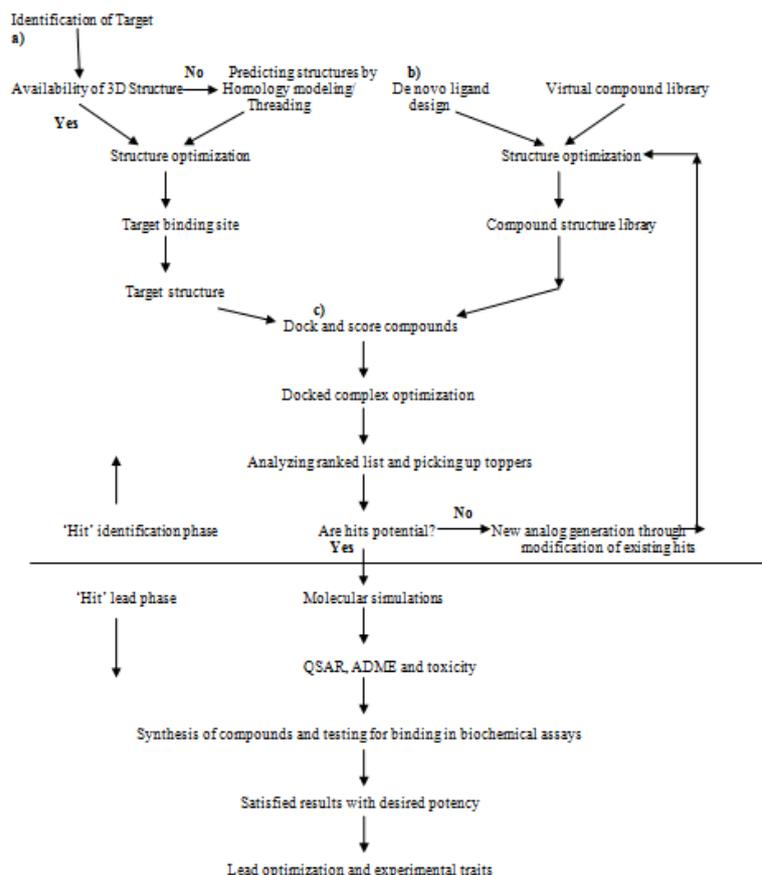


Fig. 2: Computational approaches to drug discovery [3]

e. The application of virtual screening can be seen in finding novel drug candidates from different chemical sets by inquiring about the databases [11, 12].

Various interactions involved in the docking procedure

There can be four different types of Interaction forces:

- (1) Electrodynamics forces-Van der Waals interaction.
- (2) Electrostatic forces-dipole-dipole, charge-dipole and charge-charge
- (3) Solvent-related forces-Hydrogen bond and hydrophobic interactions
- (4) Steric forces-Caused by entropy [13, 14].

The docking procedure aims at predicting one of the best approaches of binding ligands with its suitable macromolecular partner which is most often a protein. This technique thus generates possible orientations in the form of ligand poses in a huge amount inside the binding site of the protein. Thus, it necessitates the presence of the 3-d structure of the targeted molecule. This structure can be any of the type, either achieved after conducting various experiments like X-ray crystallography/Nuclear Magnetic Resonance or by utilizing various computer-aided techniques like homology modeling [15]. Molecular docking involves two main stages: a search algorithm and a scoring function, which is associated with a score predicting every conformation [16-18].

Search algorithm

The searched algorithm must be able to generate the most favorable amount of configurations to be admitted by conduction of many experiments to determine modes of binding. There exist many

relevant algorithms for analyzing docking procedures like Point complementary, Monte Carlo, Fragment-based, Genetic algorithms, Systematic searches, Distance geometry etc., [19, 20].

Various docking approaches

Monte carlo approach

This approach is beneficial in generating an initial orientation of a ligand at the active site which possesses translation, random conformation rotation. The starting orientation can be scored from it and it can also score a new configuration after generating it. A metropolis criterion is useful in the determination of the retaining ability of a new configuration. (Metropolis criterion is based on the immediate acceptance of new solution scores only when it is better than the previous one. In case a configuration is not found to be new, the application of a Boltzmann-based probability function is done, which finally decides if the configuration is accepted or rejected on the basis of the passing of the probability function test.

Fragment-based method

This method as the name suggests, mainly depends on the division of ligands in the form of fragments or small protons followed by the docking procedure and finally the linking of docked fragments is performed.

Distance geometry

Information about the structure has been utilized by the Distance Geometry to be conveyed as intra or intermolecular distances. First of all, this geometry assembles the distance and then the consistency of 3-d structures is calculated with these distances.

Matching approach

The main basis of this approach is the complementarity between the ligand and the protein. In this approach, the ligand-receptor configuration is generated by placing the ligand atom at the best site of the protein. This configuration, thus formed may need to be optimized further.

Ligand fit approach

The base of this approach is the shape resemblance between ligand and protein active sites. Hence, it is beneficial in the rapid and accurate methods for docking of smaller molecule ligands into the active sites of protein.

Point complementarity approach

This approach aims at evaluating the shape and chemical complementarity between the molecules forming specific interactions.

Blind docking

This docking approach is used in the detection of binding sites which are possible. Also in identifying the fashion of peptide ligand by overall surface scanning of the targeted proteins.

Inverse docking

This docking procedure utilizes computational methods to detect the toxicity and side effect of small molecular protein targets. The understanding of these proteins facilitates the side effects and toxicities of the drug molecules by the combined effects of proteomics and pharmacokinetic profile [21-23].

Scoring function

This function is also an important constituent of protein-ligand docking protocols. Mainly, this function is utilized in the estimation and ranking of the conformational binding which are produced with the help of search algorithms. The score thus obtained after the ranking, directly corresponds to the ligands binding affinity so that the ligands with the topmost score become the best binders. Scoring is drawn up of 3 expressions which are significant to docking and drug designing:

- a) Ranking of the orientations produced after docking search.
- b) Virtual Screening: To rank different ligands against the protein
- c) Selectivity and specificity: To rank one or more than one ligands against different proteins on the basis of their binding affinity [24-27]

Also, the scoring functions act like a pose selector, utilized to differentiate correctly assumed binding fashion and binders for non-binders in the group of poses produced by the sampling engine/search algorithm. The 3 main kinds of scoring functions are:

Force-field based scoring functions

This function proceeds the potential energy of a system by combined effects of bonded (intramolecular) and non-bonded (intermolecular) constituents. In molecular docking, more preference is given to the non-bonded components, by possibly adding the ligand-bonded terms, especially the torsional components. Intermolecular components mainly include the van der Waals forces, the electrostatic potential and the solvation energy to some extent [28]. Some of the examples of this scoring function includes-Gold Score and Auto Dock. Auto Dock is a multifaceted protein-ligand docking procedure offering various search algorithms like Monte Carlo Simulated Annealing algorithm, Genetic Algorithm (GA), and hybrid local search GA [Lamarckian Genetic Algorithm (LGA)]. The use of auto doc tools can be done with a visual interface called Auto Dock Tools (ADT) ensuring an adequate investigation of the docking results. While GOLD is a considerable protein-ligand docking program, allowing full ligand flexibility. It also ensures partial flexibility of proteins as its side-chain and backbone flexibility, which can be utilized by almost ten user-defined residues [29-31].

Empirical scoring functions

It is the combining effect of many empirical energy terms like electrostatic, van der Waals, hydrogen bond, entropy, desolvation

and hydrophobicity [32]. Glide score, FlexX [33], and LUDI [34, 35] are examples of this scoring function. Glide score has proved to be an integrated explication for protein-ligand docking, which is accessible as a module in the Schrodinger software suite, managed by the Schrodinger LLC [36, 37]. Glide has been capable of gaining a considerable amount of users in a very short span of time for about a few years and is becoming prominent as an animating option for protein-ligand docking. Glide is capable of generating set of grids with various kinds of fields depicting geometries and characteristics of the bonding site region of the receptor [38, 39].

Knowledge-based scoring functions

These functions are called by another name which is the statistical potential-based scoring functions. Their development has been done by the statistical examination of the atom pairs that are visible in a training data set. The Inverse-Boltzmann equation defines the relationship of structural features frequency and the interaction energies allotted to those features [40]. This scoring function is able to maintain more balance between accuracy and speed as compared with the other scoring functions. But it lacks behind from the others by being trained set-dependent. Some examples of this function include the potential of mean force (PMF) [41, 42] and IT Score [43-48]

Various types of docking

During the 1980s, the very first algorithm for docking procedures was developed [49]. The receptor was optimized by a number of spheres which filled the cleft of its surface while the ligand was filled with one more set of spheres depicting its volume. In order to find out the most favorable steric overlap between receptor spheres and the site of binding a study was conducted by neglecting any type of conformational movement. The docking procedures can thus be differentiated on the basis of degrees of flexibility of the molecules concerned with the calculation [50] (fig. 3):

Rigid docking/lock and key phenomena

The ligand along with its associated protein are contemplated rigid entities and during the sampling procedure, only three-three each of the translational and rotational degrees of freedom are studied. This estimation is similar to the "lock and key" model for binding and is basically utilized for protein-protein docking where it becomes difficult to sample the amount of conformational degrees of freedom as it is much higher. These methods mainly involve optimization of the binding site and the ligand with hot points and the evaluation of superposition of matching points [51]

Semi-flexible docking

Out of the ligand and protein, the former is flexible and the latter is rigid. Hence, the sampling of the conformational degrees of freedom of the ligand is done along with the 6 translational and rotational ones. These procedures presume that a ligand which is to be docked can be recognized by the fixed orientation of a protein.

Flexible docking/Induced fit model

This method focuses on the concept of both protein and ligand to be flexible equivalents of each other at the time of binding. It involves either the utilization of an induced fit model or the conformational selection.

Molecular docking technique: steps involved

The technique involves the *In silico* study of intermolecular interaction between two molecules i.e. a ligand and receptor, where the protein receptor is a macromolecule and the ligand is a macromolecule that acts as an inhibitor. The technique constitutes:

Preparation of protein

The first step involves the retrieval of the 3-d structure of the protein from the Protein data bank (PDB); and the structure thus obtained is allowed for pre-processing. This step also capacitates to remove water molecules from the cavity, for the stabilization of charges, filling the missing residues and formation of side chains on the basis of present parameters.

Prediction of active site

The preparation of protein is followed by the prediction of its active site. A lot of active sites may be possessed by the receptor, but the one which is accurately concerned with the ligand is selected. But the water molecules and hetero atoms if present, are then withdrawn [52, 53].

Preparation of ligand

Ligands can be retrieved from several databases such as ZINC, Pub Chem or can be sketched applying Chem sketch tool. While picking out the ligand, the LIPINSKY'S RULE OF 5 should be utilized. Lipinski

rule of 5 assists in discerning amongst non-drug like and drug like candidates. It promises high chance of success or failure due to drug-likeness for molecules abiding two or more than two rules. For choice of a ligand allowing to the LIPINSKY'S RULE:

- Less than five hydrogen bond donors
- Less than ten hydrogen bond acceptors
- Molecular mass less than 500 Da
- High lipophilicity (expressed as LogP not over 5)
- Molar refractivity should be between 40-130

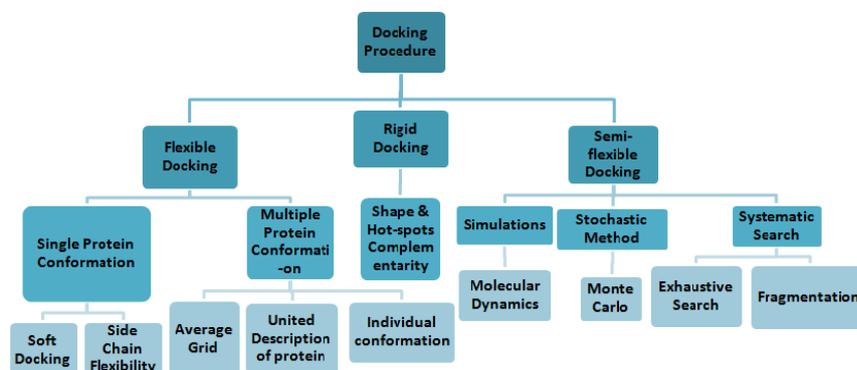


Fig. 3: Various docking procedures [50]

Energy minimization

The ligand is the main candidate for this procedure as it can attain various orientations. The one with minimum energy will be considered the best and most stable ligand conformation. The two different types of energies are:

a) Electrostatic potential energy: It is a pairwise summation of coulombic interactions as described in equilibrium.

$$E(r) = \sum_{i=1}^{N_A} \sum_{j=1}^{N_B} \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}}$$

In Equation N= the number of atoms in molecules A and B respectively q = charge on each atom.

b) Van Der Waals Potential Energy: The general treatment of non-bonded interactions is often modeled by a Lennard-Jones 12-6 function as in equilibrium mentioned in the equation:

$$E(r) = \sum_{i=1}^N \sum_{j=1}^N 4\epsilon \left[\left(\frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left(\frac{\sigma_{ij}}{r_{ij}} \right)^6 \right]$$

S = is the well depth of the potential

s = is the collision diameter of respective atoms i and j

Verification of docking software packages

There is a huge availability of various software packages in the market for molecular docking. The relative assessment is performed for the identification of the most promising software package which can predict the nearest match to the crystallographic data on the protein-ligand complex-

- A familiar standard ligand is selected, e. g. Nevirapine
- X-ray crystallography is used to predict the coordinates of the binding position of Nevirapine and coordinates of active site amino acids experimentally.
- A ligand is taken and is docked into the active site of various enzyme software packages, now, translation and rotation of ligand

are done totally. Then the final binding energy is determined followed by its grading.

d) The comparison of the most stable ligand fit is performed by X-ray crystallographic binding coordinates. This can lead to the selection of the most favorable software package for the study of docking procedures.

Docking

The last step involves the docking of the ligand against its corresponding protein and the interaction between the two is examined. The scoring function thus provides the score on behalf of the most effectively docked ligand-protein complex and then this complex is apparently selected.

Docking software

Throughout the last twenty years, many docking procedures have been drawn up table (1) [54-56].

Applications

The activation or inhibition of the protein is achieved by molecular docking while the ligand binding leads to agonism or antagonism. Some of the applications include:

- For evaluating various databases to discover the most powerful drug candidate [61].
- Prediction of optimized conformation of ligand on its target [62, 63].
- Bioremediation
- Checking Biological activities by predicting Ka values
- Prediction of binding sites
- Adoption of orphan receptor protein
- To study interactions between proteins
- To seek leading structures for protein targets
- To study enzymatic reaction procedures
- Protein engineering

Table 1: Properties of currently available molecular docking tools [55]

S. No.	Different tools	Name of designer/ Company	Licensing terms	Assisted platforms	Approach for docking	Scoring function	References
I	Auto Dock	D. S. Good sell and A. J. Olson The Scripps Research Institute	Free for Academic Use	Unix, Mac OSX, Linux, SGI	Genetic Algorithm Lamarckian Genetic Algorithm Simulated Annealing	Auto Dock (force-field methods)	13
II	DOCK	I. Kuntz University of California, San Francisco	Free for Academic use	Unix, Linux, Sun, IBM AIX, Mac OSX, Windows	Shape fitting (sphere sets)	Chem Score, GB/SA solvation scoring, other	57
III	Flex X	T. Lengauer and M. Rarey BioSolveIT	Commercial Free evaluation (6 w)	Unix, Linux, SGI, Sun Windows	Incremental Construction	FlexXScore, PLP, Screen Score, Drug Score	58
IV	Glide	Schrödinger Inc.	Commercial	Unix, Linux, SGI, IBM AIX	Monte Carlo Sampling	Glide Score, Glide Comp	59
V	GOLD	Cambridge Crystallographic Data Centre	Commercial Free evaluation (2 mo)	Linux, SGI, Sun, IBM, Windows	Genetic Algorithm	Gold Score, Chem Score user defined	60
VI	Ligand Fit	Accelrys Inc.	Commercial	Linux, SGI, IBM AIX	Monte Carlo Sampling	Lig Score, PLP, PMF	26

Basic challenges

Ligand chemistry

The docking results are prominently affected by the ligand preparation because the recognition of ligand by any biomolecule is dependent on 3-d confirmation and electrostatic interaction. This proves the importance of orientation and preparation of ligands. By removing or adding hydrogens the structure to be docked can be optimized, but the tautomeric and protomeric molecular states still become the major inconsistency. The molecules remain in their neutral forms by all databases but under certain physiological conditions, they are actually ionized. Since molecules are kept in their neutral form of almost all the databases, but they are actually ionized under physiological conditions. Thus, their ionization is required to be done before docking. But this standard ionization can be achieved easily through different programs. Concerning the matter of tautomers, there still remains a problem of selecting one tautomer out of the all others [64].

Receptor flexibility

The receptor flexibility, i.e. the handling of flexible protein is a major issue of molecular docking. Different conformations are adopted by a protein which depends on the binding ligand. This ensures the occurrence of a single receptor orientation when the docking is performed using a rigid receptor. Although, the ligands may need various receptor orientations to bind, when the docking is performed with a flexible receptor. In understanding the concept of molecular docking, the most varied orientation states of proteins are the most neglected features. Since the protein flexibility depicts the achievement of better affinity between a present drug and target, hence is important. Active site water molecules are one more feature of target flexibility. To avoid the use of artifact waters in the docking procedure, the water should be rectified [65].

FUNCTION

The defect in the scoring function is also a major challenge of docking. The scoring function aims at discriminating between the correct binding modes and all other aligned modes. The scoring functions create various proposals for evaluating the affinity of ligands when there is accuracy. Entropy and electrostatic interactions, which are physical phenomena, are disregarded in scoring schemes. With reference to accuracy and speed, the absence of applicable scoring function is the major obstruction in the molecular docking procedures [66].

CONCLUSION

The docking procedures have come out to be one of the most favorable techniques in the field of drug designing, especially in the past few years. This could be possible by the increased availability of various software used in docking, its advanced approaches and the rapidly growing users. Along with all the enhancing benefits, some problems are also to be faced while performing molecular docking. This mainly involves the achievement of efficient protein flexibility during searching algorithms and the presence of water molecules along with entropy treatments during scoring function. But there are a varied number of software available to overcome these problems and new alternatives are also continuously appearing in each upcoming year. Though in this rapidly growing field all the alternatives will become outdated sooner or later especially if not updated timely. So, the early adopters own a special benefit here as it is difficult to master a newly formed software.

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All authors have equally contributed to the article.

AUTHORS CONTRIBUTIONS

All the authors are equally contributed

CONFLICT OF INTERESTS

Authors have declared no conflicts of interest.

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