# Computational Resources for Computer-Aided Drug Discovery

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### **Brief History of Group**

### **1986: Simple computer services**

- ♦ Joined as computer scientist (1986)
- ♦ Developed databases (COBOL, Dbase)
- ♦ DIC/BIC under BTISNET of DBT (1987)
- ♦ Setup communication via NICNET
- ♦ EMAIL facility via ERNET

### 1992: Initiating research activities

- ♦ First paper on customize curve fitting
- General software for biological methods
- ♦ Ph.D. (1996) Protein structure prediction

### 1996: International presence

- ♦ 1996-8: PDF at Oxford University, UK
- ♦ Sequence/Structure alignment algorithm
- ♦ Successfully compete in CASP
- ♦ Web-based service & mirror sites

#### 2000: Target prediction for Drug/vaccine

- ♦ Research group started (Ph.D. students)
- ♦ 2002-7: CSIR-Mega project (45 core)
- ♦ Identification of drug & vaccine targets
- ♦ Setup BIC at UAMS, Little Rock, USA
- ♦ Visiting prof. at POSTECH, South Korea

### **2008: Open source drug discovery**

- CRDD: Comp. resources for drug discovery
- ♦ Freeware in Chemo/pharma informatics
- 2012 In cilica models for healthcare

#### **2012-: In silico models for healthcare**

- ♦ 2012: GENESIS project (50 crore)
- ♦ Exp. validation of therapeutic peptides
- Customize OS for drug discovery
- ♦ Genome-based personalize medicine

### Concept of Drug and Vaccine



### Concept of Drug

- Kill invaders of foreign pathogens
- Inhibit the growth of pathogens

### Concept of Vaccine

- Generate memory cells
- Trained immune system to face various existing disease agents

### Web servers for designing epitope-based vaccine

T-Cell Epitopes

B-Cell Epitopes

Vaccine Adjuvants **Propred:** Promiscuous MHC-II binders

MHCBN: Database of MHC

**IL4Pred:** Prediction of interleukin-4

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**Propred1:** for promiscuous MHC I binders

Pcleavage: Proteome cleavage sites

**TAPpred:** for predicting TAP binders

**CTLpred:** Prediction of CTL epitopes

**BCIpep:** Database of B-cell eptioes;

**Lbtope:** Prediction of B-cell epitopes

**ALGpred:** Allergens and IgE eptopes

**IgPred**: Antibody-specific epitopes

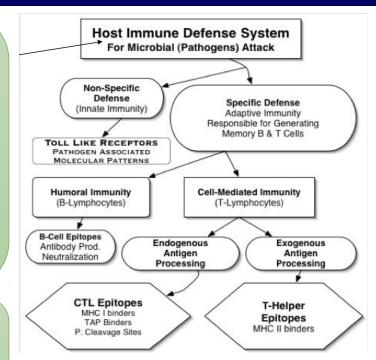
PRRDB: A database of PRRs & ligands

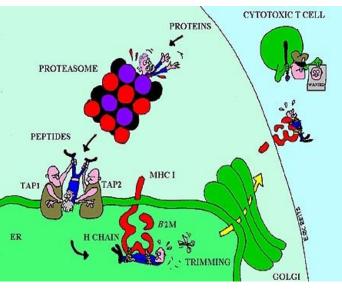
VaccineDA: DNA-based adjuvants

**imRNA:** Immunomulatory RNAs

**VaccinePAD:** Peptide-based adjuvants

**PolysacDB:** Polysaccharide antigens







Briefings in Bioinformatics, 18(3), 2017, 467-478

doi: 10.1093/bib/bbw025

Advance Access Publication Date: 25 March 2016

Software Review

# Novel in silico tools for designing peptide-based subunit vaccines and immunotherapeutics

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### Web servers for drug targets

#### **Genome Annotation**

**FTGpred:** Prediction of Prokaryotic genes **EGpred:** Prediction of eukaryotic genes

**GeneBench:** Benchmarking of gene finders

**SRF:** Spectral Repeat finder

#### **Subcellular Localization Methods**

**PSLpred**: localization of prokaryotic proteins

**ESLpred:** localization of Eukaryotic proteins

**HSLpred:** localization of Human proteins

**MITpred:** Prediction of Mitochndrial

proteins

TBpred: Localization of mycobacterial

### **Comparative genomics**

**GWFASTA**: Genome-Wide FASTA Search

**GWBLAST:** Genome wide BLAST search

**COPID:** Composition based similarity search

**LGEpred:** Gene from protein sequence

#### **Prediction of drugable proteins**

**NRpred:** Classification of nuclear receptors

**GPCRpred:** Prediction of G-protein-coupled receptors

**GPCRsclass:** Amine type of GPCR **VGIchan:**\_Voltage gated ion channel

**Pprint:** RNA interacting residues in proteins

#### **Protein Structure Prediction**

**APSSP2**: protein secondary structure prediction

**Betatpred:** Consensus method for  $\beta$ -turns prediction

**BetaTurns**: Prediction of  $\beta$ -turn types in proteins

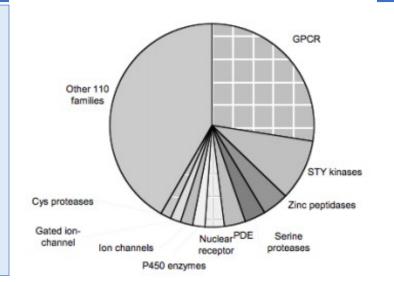
**Turn Predictions:** Prediction of  $\alpha$ /  $\beta$ / $\gamma$  -turns in proteins

**BhairPred:** Prediction of Beta Hairpins

**TBBpred:** Prediction of trans membrane beta barrel proteins

**SARpred:** Prediction of surface accessibility (real accessibility)

**PepStr:** Prediction of tertiary structure of Bioactive peptides



CRDD: Computational Resources ...



### Computational Resources for Drug Discovery



Home | OSDD | Raghava | News | Rewards | Challenges | OSDDpub | Forum | Indipedia | Drugpedia | FAQ | License | Register

Search

#### **Target Identification**

Genome Annotation Proteome Annotation Potential Targets Protein Structure

#### **Virtual Screening**

QSAR Techniques Docking & QSAR Chemoinformatics siRNA/miRNA

#### Drug Design

Lead Optimization
Pharmainformatics
ADMET
Clinical Informatics

#### How to Contribute?

Expermentalists
Virtual Trainees/Jobs
Software Developers

#### **Computational Resources**

Library Interfaces
Meta Servers
Publishing Document
Data on *M.tb.* 

\*\*\*\* Prediction of cytochrome P450 isoform responsible for metabolizing a drug molecule \*\*\*\*

### Computational Resources for Drug Discovery

OSDD Forum is an initiative with a vision to provide affordable healthcare to the developing world. The OSDD concept aims to synergize the power of genomics, computational technologies and facilitate the participation of young and brilliant talent from Universities and industry. It seeks to provide a global platform where the best brains can collaborate and collectively endeavor to solve the complex problems associated with discovering novel therapies for neglected diseases like Tuberculosis.

CRDD (Computational Resources for Drug Discovery) is an important module of the *in silico* module of OSDD. The CRDD web portal provides computer resources related to drug discovery on a single platform. Following are major features of CRDD:

- · CRDD provides computational resources for researchers in the field of computer-aided drug design.
- CRDD allows users to discuss their problem with other members.
- CRDD gives equal opportunity to those willing to solve these problems.
- CRDD Wiki maintain wikipedia related to drug discovery.
- · Contributors may host their database or web server on CRDD portal.

Thus, CRDD provides a platform for researchers having limited resources.

### Open Source Software and Web Services for Designing Therapeutic Molecules

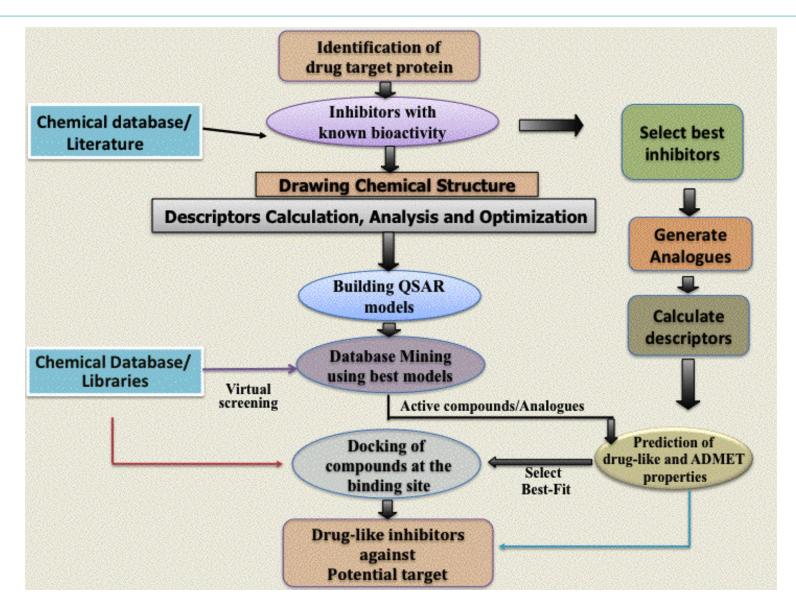
Deepak Singla<sup>1,2</sup>, Sandeep Kumar Dhanda<sup>1</sup>, Jagat Singh Chauhan<sup>1</sup>, Anshu Bhardwaj<sup>3</sup>, Samir K. Brahmachari<sup>3,4</sup>, Open Source Drug Discovery Consortium<sup>3</sup> and Gajendra P.S. Raghava<sup>1,\*</sup>

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Abstract: Despite the tremendous progress in the field of drug designing, discovering a new drug molecule is still a challenging task. Drug discovery and development is a costly, time consuming and complex process that requires millions of dollar and 10-15 years to bring new drug molecules in the market. This huge investment and long-term process are attributed to high failure rate, complexity of the problem and strict regulatory rules, in addition to other factors. Given the availability of 'big' data with ever improving computing power, it is now possible to model systems which is expected to provide time and cost effectiveness to drug discovery process. Computer Aided Drug Designing (CADD) has emerged as a fast alternative method to bring down the cost involved in discovering a new drug. In past, numerous computer programs have been developed across the globe to assist the researchers working in the field of drug discovery. Broadly, these programs can be classified in three categories, freeware, shareware and commercial software. In this review, we have described freeware or open-source software that are commonly used for designing therapeutic molecules. Major emphasis will be on software and web services in the field of chemo- or pharmaco-informatics that includes in silico tools used for computing molecular descriptors, inhibitors designing against drug targets, building QSAR models, and ADMET properties.

### An overview of the workflow of *in silico* drug designing process





### **Important Points**



- 1. Source of Molecules (databases or repositories)
- 2. Molecular Editors (editing & viewing existing molecules)
- 3. Analog Generators (software used to generate analogs)
- 4. Structure Optimization (Energy/geometry of molecules)
- 5. Calculation of Molecular Descriptors
- 6. Chemical Similarity Search
- 7. Development of QSAR/QSPR Models
- 8. Classification and Clustering of Small Molecules
- 9. Docking Small Molecules in Macromolecules
- 10. Pharmacophore Tools/Search
- 11. Software for ADMET Techniques
- 12. Designing of Inhibitors
- 13. Major Initiatives towards affordable drugs

# Databases and resources managing and hosting chemical compounds



| Database          | Brief Description with URL  |  |  |  |  |  |
|-------------------|---|--|--|--|--|--|
| PubChem           | A comprehensive database of bioassays, compounds and substances ( <a href="http://pubchem.ncbi.nlm.nih.gov/">http://pubchem.ncbi.nlm.nih.gov/</a> ) |  |  |  |  |  |
| ChEMBL            | Database of drug like molecules<br>( <u>https://www.ebi.ac.uk/chembldb</u> )  |  |  |  |  |  |
| Zinc              | Maintain commercially-available compounds for virtual screening (http://zinc.docking.org/)  |  |  |  |  |  |
| ChemDB            | Collection of small-molecules (http://cdb.ics.uci.edu/)   |  |  |  |  |  |
| ChemSpider        | A chemical database (http://www.chemspider.com/)  |  |  |  |  |  |
| MMsINC            | Commercial compounds (http://mms.dsfarm.unipd.it/MMslNC/)   |  |  |  |  |  |
| KEGG              | Maintain comprehensive information (http://www.genome.jp/kegg/)   |  |  |  |  |  |
| SMPDB             | Small molecule Pathway database (http://www.smpdb.ca)   |  |  |  |  |  |
| HMDB              | Human Metabolites (http://www.hmdb.ca/)   |  |  |  |  |  |
| PDBeChem PDBeChem | Dictionary of chemical components refered in PDB entries (http://www.ebi.ac.uk/pdbe-srv/pdbechem/)  |  |  |  |  |  |
| PDB-Bind          | Binding affinity information for PDB Ligands (http://sw16.im.med.umich.edu/databases/pdbbind/index.jsp)   |  |  |  |  |  |
| BindingDB         | Binding affinity of PDB Ligands (http://www.bindingdb.org/)   |  |  |  |  |  |
| NCI               | Small molecules related to cancer (http://cactus.nci.nih.gov/ncidb2.1/)   |  |  |  |  |  |

# frequently used for drawing and editing molecules



| - 1.                                  |   |  |  |  |  |  |
|---------------------------------------|---|--|--|--|--|--|
| Editors                               | Brief description   |  |  |  |  |  |
| BKchem                                | Python based free 2D molecule editor (http://bkchem.zirael.org/)  |  |  |  |  |  |
| PubChem<br>Sketcher<br>[ <i>117</i> ] | A web-based tool for sketching, integrated in PubChem (http://pubchem.ncbi.nlm.nih.gov/edit2/index.html)                                  |  |  |  |  |  |
| Chem5ke<br>tch                        | ACD/ChemSketch Freeware is a free software for drawing chemicals (http://www.acdlabs.com/resources/freeware/chemsket ch/)                 |  |  |  |  |  |
| J ChemPa<br>int                       | Editor for 2D chemical structures (http://jchempaint.github.com/)   |  |  |  |  |  |
| Accelrys<br>Draw                      | Draw and edit complex molecules, no fee for academic community (http://accelrys.com/products/informatics/cheminformatics/draw/index.html) |  |  |  |  |  |
| XDrawC<br>hem                         | Molecule drawing program (http://xdrawchem.sourceforge.net/)  |  |  |  |  |  |
| MedChe<br>m<br>Designer               | Drawing molecules and integration with ADMET property. (http://simplus-downloads.com/)  |  |  |  |  |  |
| JME                                   | J ME Molecular Editor (http://www.molinspiration.com/jme/)  |  |  |  |  |  |

### Analogs generation softwares



| Software                      | Brief description   |
|-------------------------------|---|
| SmiLib [ <i>118</i> ]         | Enumerates combinatorial libraries with very high rate (http://gecco.org.chemie.uni-frankfurt.de/smilib/)       |
| GLARE<br>[ <i>119</i> ]       | Generate combinatorial library (http://glare.sourceforge.net/)  |
| Library<br>synthesizer        | Virtual chemical enumeration (http://tripod.nih.gov/?p=370)   |
| CLEVER<br>[ <i>120</i> ]      | Chemical Library Editing, Visualization and Enumerating Resource (http://datam.i2r.a-star.edu.sg/dever/)        |
| <b>Newlead</b> [ <i>121</i> ] | Generate of combinatorial library from bioactive conformations (http://www.cd.net/cca/software/MAC/index.shtml) |

### Overview of Free Software Developed for Designing Drugs Based on Protein-Small Molecules Interaction

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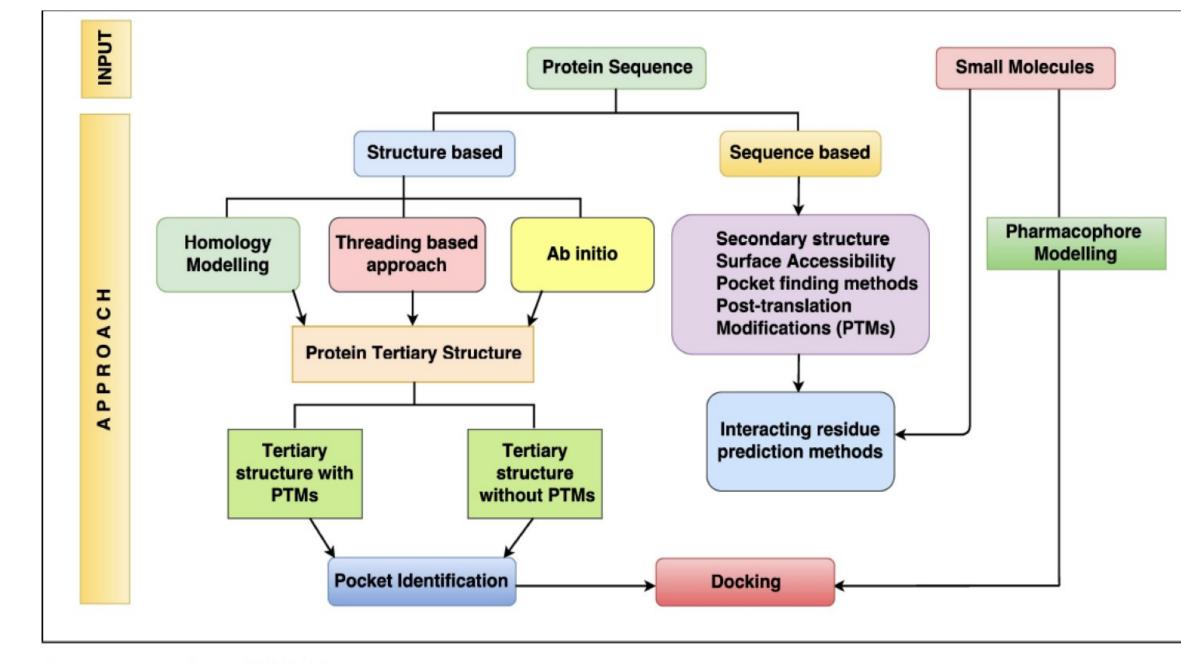
#### ARTICLE HISTORY

Received: April 05, 2018 Revised: June 08, 2018 Accepted: August 08, 2018

DOI: 10.2174/1568026618666180816155131

Abstract: One of the fundamental challenges in designing drug molecule against a disease target or protein is to predict binding affinity between target and drug or small molecule. In this review, our focus will be on advancement in the field of protein-small molecule interaction. This review has been divided into four major sections. In the first section, we will cover software developed for protein structure prediction. This will include prediction of binding pockets and post-translation modifications in proteins. In the second section, we will discuss software packages developed for predicting small-molecule interacting residues in a protein. Advances in the field of docking particularly advancement in the knowledge-based force fields will be discussed in the third part of the review. This section will also cover the method developed for predicting affinity between protein and drug molecules. The fourth section of the review will describe miscellaneous techniques used for designing drug molecules, like pharmacophore modelling. Our major emphasis in this review will be on computational tools that are available free for academic use

**Keywords:** Protein-small molecule interaction, Structure Prediction, Docking, Pharmacophore, Molecular Dynamics, Post Translational Modifications.



(3). Schematic representation of CADD.

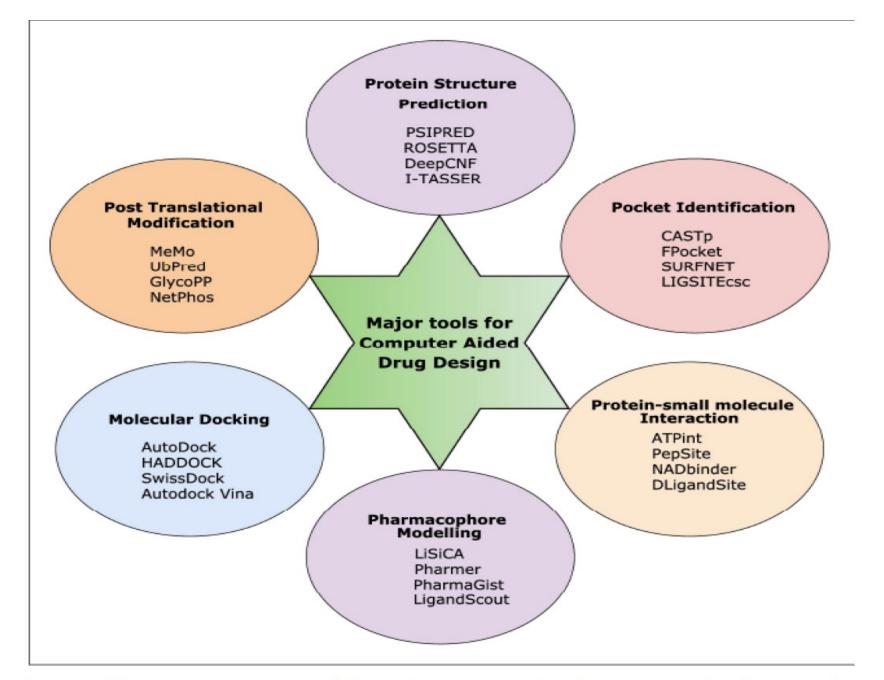


Fig. (1). Shows major categories of freely available computational tools reviewed in this manuscript and popular tools in each category.

**List of web servers and standalone software for predicting tertiary structure of proteins and are freely available for public use.** 

| Name of Tool<br>[Reference]   | Description of Tool [Web Link]   |  |  |  |  |
|-------------------------------|--|--|--|--|--|
| PHYRE2 <sup>#</sup> [30]      | It uses HMM technique for tertiary structure prediction. [http://www.sbg.bio.ic.ac.uk/phyre2/]   |  |  |  |  |
| CPHModels <sup>#</sup> [31]   | It is based on secondary structure-guided profile alignment and exposure prediction.  [http://www.cbs.dtu.dk/services/CPHmodels/]                                  |  |  |  |  |
| SWISS MODEL <sup>#</sup> [32] | A fully automated protein structure homology-modelling server.  [https://swissmodel.expasy.org/]   |  |  |  |  |
| I-TASSER###<br>[33]           | Prediction of protein tertiary structure using threading approach. [http://zhanglab.ccmb.med.umich.edu/I-TASSER/]  |  |  |  |  |
| EsyPred3D <sup>#</sup> [34]   | It obtains the alignment using neural network technique and final model is built using MODELLER.  [http://www.unamur.be/sciences/biologie/urbm/bioinfo/esypred/]   |  |  |  |  |
| (PS)2 <sup>#</sup> [35]       | Protein tertiary structure prediction using comparative modelling.  [http://ps2v3.life.nctu.edu.tw/]   |  |  |  |  |
| AS2TS <sup>#</sup> [36]       | Homology-based approach for predicting protein structure directly based on amino acid sequence.  [http://proteinmodel.org/AS2TS/AS2TS/as2ts.html]                  |  |  |  |  |
| RaptorX <sup>#</sup> [37]     | Nonlinear scoring function for predicting the structure of non-homologous proteins.  [http://raptorx.uchicago.edu/StructurePrediction/predict/]                    |  |  |  |  |
| IntFOLD-TS <sup>#</sup> [38]  | It uses single-template local consensus fold recognition approach for tertiary structure prediction.  [http://www.reading.ac.uk/bioinf/IntFOLD/IntFOLD3_form.html] |  |  |  |  |
| Robetta <sup>#</sup> [39]     | Comparative and de novo methods are used for prediction.  [http://robetta.bakerlab.org/]   |  |  |  |  |
|                               |  |  |  |  |  |

Table 2. Standalone software and web servers developed for predicting important component of protein structure like secondary structure, surface accessibility.

| Name of Tool<br>[Reference] | Description of Tool<br>[Web Link]  |  |  |  |  |  |
|-----------------------------|--|--|--|--|--|--|
| APPSP2**** [55]             | A combination of nearest neighbour and neural network for secondary structure prediction.  http://webs.iiitd.edu.in/raghava/apssp2/]   |  |  |  |  |  |
| YASPIN <sup>#</sup> [56]    | Hidden Neural Network based approach for prediction. [http://www.ibi.vu.nl/programs/yaspinwww/]  |  |  |  |  |  |
| CFSSP <sup>#</sup> [57]     | redict secondary structure using Chou Fasman Algorithm. [http://www.biogem.org/tool/chou-fasman/]  |  |  |  |  |  |
| PSIPRED###<br>[58]          | Utilize the evolutionary information in the form of alignment profile for prediction.  [http://bioinf.cs.ucl.ac.uk/psipred/]   |  |  |  |  |  |
| Jpred4 <sup>#</sup> [59]    | It predicts secondary structure using Jnet algorithm. [http://www.compbio.dundee.ac.uk/jpred/]   |  |  |  |  |  |
| DSC#<br>[60]                | It uses simple and linear statistical method for prediction.  [https://npsa-prabi.ibcp.fr/cgi-bin/npsa_automat.pl?page=/NPSA/npsa_dsc.html]  |  |  |  |  |  |
| PREDATOR <sup>#</sup> [61]  | This method is based on recognition of potentially hydrogen-bonded residues in a single amino acid sequence.  [https://npsa-prabi.ibcp.fr/cgi-bin/npsa_automat.pl?page=/NPSA/npsa_predator.html] |  |  |  |  |  |
| GOR V <sup>#</sup> [62]     | A statistical method that utilizes evolutionary information.  [http://gor.bb.iastate.edu/]   |  |  |  |  |  |
| NetSurfP### [63]            | Predicts secondary structure as well as surface accessibility.  [http://www.cbs.dtu.dk/services/NetSurfP/]   |  |  |  |  |  |

Table 3. List of software and web servers developed for predicting binding pockets on the surface of a protein.

| Name of Tool<br>[Reference]       | Description of Tool<br>[Web Link]  |  |  |  |  |
|-----------------------------------|--|--|--|--|--|
| PockDrug <sup>#</sup> [82]        | It uses physio-chemical and geometry based descriptors to find the pocket.  [http://pockdrug.rpbs.univ-paris-diderot.fr/]  |  |  |  |  |
| SURFNET <sup>##</sup><br>[83]     | It uses PDB 3D coordinates to generate molecular surfaces and gaps.  [http://www.ebi.ac.uk/thornton-srv/software/SURFNET/]   |  |  |  |  |
| Q-siteFinder <sup>#</sup><br>[84] | Locate energetically favourable binding sites in a protein.  [http://www.bioinformatics.leeds.ac.uk/qsitefinder]   |  |  |  |  |
| CASTp <sup>#</sup> [85]           | Identification of surface accessible pockets and interior inaccessible cavities in a protein.  [http://sts.bioe.uic.edu/castp/]  |  |  |  |  |
| PASS##<br>[86]                    | It utilizes geometry to characterize regions of buried volume in proteins.  [http://www.ccl.net/cca/software/UNIX/pass/overview.html]  |  |  |  |  |
| LIGSITEcsc <sup>###</sup> [87]    | LIGSITEcsc is based on the notion of surface-solvent-surface events and the degree of conservation of the involved surface residues.  [http://projects.biotec.tu-dresden.de/pocket/] |  |  |  |  |
| bSiteFinder <sup>#</sup> [88]     | Predicts binding sites on a protein using multiple techniques.  [http://binfo.shmtu.edu.cn/bsitefinder/]   |  |  |  |  |
| AutoSite### [89]                  | It identifies binding pockets using energetic aspects. [http://adfr.scripps.edu/AutoDockFR/autosite.html]  |  |  |  |  |

Table 5. List of computational methods developed for predicting ligand interacting residues in a protein.

| Name of Tool<br>[Reference]     | Description of Tool<br>[Web Link]   |  |  |  |  |
|---------------------------------|---|--|--|--|--|
| ATPint <sup>###</sup> [169]     | Prediction of ATP interacting residues in a protein. [http://webs.iiitd.edu.in/raghava/atpint/]                                 |  |  |  |  |
| TargetATPsite## [170]           | A template-free method for predicting residues in ATP binding sites.  [http://www.csbio.sjtu.edu.cn:8080/TargetATPsite/]        |  |  |  |  |
| ATPsite <sup>#</sup> [171]      | quence-based method for predicting ATP-binding residues.  ttp://biomine.ece.ualberta.ca/ATPsite/]                               |  |  |  |  |
| GTPbinder <sup>###</sup> [172]  | Prediction of GTP binding residue in a protein sequence. [http://webs.iiitd.edu.in/raghava/gtpbinder/]                          |  |  |  |  |
| NADbinder### [173]              | Prediction of NAD interacting residues in a protein. [http://webs.iiitd.edu.in/raghava/nadbinder/]                              |  |  |  |  |
| FADPred### [174]                | A method for predicting FAD interacting residues in a protein.  [http://webs.iiitd.edu.in/raghava/fadpred/]                     |  |  |  |  |
| ProtChemSI <sup>###</sup> [175] | A database of protein-chemical structural interaction derived from PDB.  [http://pcidb.russelllab.org/]                         |  |  |  |  |
| STITCH##<br>[176]               | A database containing information of known and predicted interactions between proteins and chemicals.  [http://stitch.embl.de/] |  |  |  |  |
| 3did <sup>###</sup> [177]       | A database of 3-D structural templates for domain-domain and domain-peptide interaction.  [http://3did.irbbarcelona.org/]       |  |  |  |  |

Table 6. Docking tools categorized based on features, algorithms, scoring functions, availability with URLs.

| Name of Tool<br>[Reference]      | Description of Tool [Web Link]  |  |  |  |  |  |
|----------------------------------|---|--|--|--|--|--|
| Autodock Vina## [205]            | It is a Monte Carlo based docking software. [http://vina.scripps.edu]   |  |  |  |  |  |
| Autodock### [206]                | enetic Algorithm based docking software for docking small molecules.  http://autodock.scripps.edu]  |  |  |  |  |  |
| BSP-SLIM <sup>#</sup> [207]      | Blind low-resolution ligand-protein docking approach. https://zhanglab.ccmb.med.umich.edu/BSP-SLIM/]  |  |  |  |  |  |
| COPICAT <sup>#</sup> [208]       | SVM based method for predicting interactions between proteins & ligands. [http://copicat.dna.bio.keio.ac.jp]  |  |  |  |  |  |
| DAIM <sup>##</sup> [209]         | Fragment-based docking suite. [http://www.biochem-caflisch.uzh.ch/download/]  |  |  |  |  |  |
| DARWIN**** [210]                 | Prediction of the interaction between a protein and ligand.  [http://darwin.cirad.fr/product.php]   |  |  |  |  |  |
| Dock Blaster <sup>#</sup> [211]  | A web server for virtual screening using structure-based ligand discovery.  [http://blaster.docking.org/]   |  |  |  |  |  |
| DockingServer <sup>#</sup> [212] | Integrates a number of computational chemistry software for docking.  [https://www.dockingserver.com/]  |  |  |  |  |  |
| DockoMatic <sup>##</sup> [213]   | Automate the creation and management of AutoDock screening jobs.  [https://sourceforge.net/projects/dockomatic/]  |  |  |  |  |  |
| DockVision <sup>###</sup> [214]  | Docking package including algorithms like Monte Carlo, Genetic algorithm, and database screening docking algorithms. [http://dockvision.sness.net/overview/overview.html] |  |  |  |  |  |

Table 7. List of pharmacophore-based tools.

| Name of Tool<br>[Reference]     | Description of Tool<br>[Web Link]  |  |  |  |  |
|---------------------------------|--|--|--|--|--|
| Pharmer <sup>##</sup> [256]     | A new computational approach to search the pharmacophore.  [http://smoothdock.ccbb.pitt.edu/pharmer/]  |  |  |  |  |
| PharmaGist <sup>#</sup> [257]   | Freely available web server for pharmacophore detection. [http://bioinfo3d.cs.tau.ac.il/PharmaGist/]   |  |  |  |  |
| LigandScout <sup>##</sup> [258] | Tool that derives 3D pharmacophores from structural data of macromolecule/ligand complexes.  [http://en.bio-soft.net/3d/LigandScout.html]                                    |  |  |  |  |
| CoLibri <sup>##</sup> [259]     | Compound collections used as virtual screening library. [https://www.biosolveit.de/CoLibri/]   |  |  |  |  |
| DecoyFinder <sup>##</sup> [260] | A graphical tool which helps in finding sets of decoy molecules for a given group of active ligands.  [http://urvnutrigenomica-ctns.github.io/DecoyFinder/]                  |  |  |  |  |
| MOLA <sup>##</sup> [261]        | Free software for virtual screening using AutoDock4/Vina in a computer cluster using non-dedicated multi-platform computers.  [http://esa.ipb.pt/biochemcore/index.php/ds/m] |  |  |  |  |
| NNScore## [262]                 | Neural network-based scoring function for the characterization of protein-ligand complexes.  [http://rocce-vm0.ucsd.edu/data/sw/hosted/nnscore/]                             |  |  |  |  |

### **MetaPred:**A webserver for the Prediction of Cytochrome P450 Isoform responsible for Metabolizing a Drug Molecule

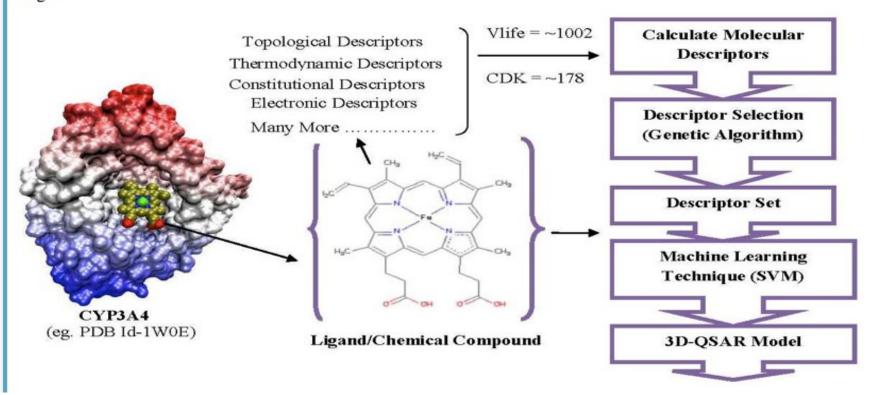
#### Toxipred | KiDoQ | GDoQ | NPTOPE | KetoDrug | CRDD | OSDD | IMTECH | Raghava

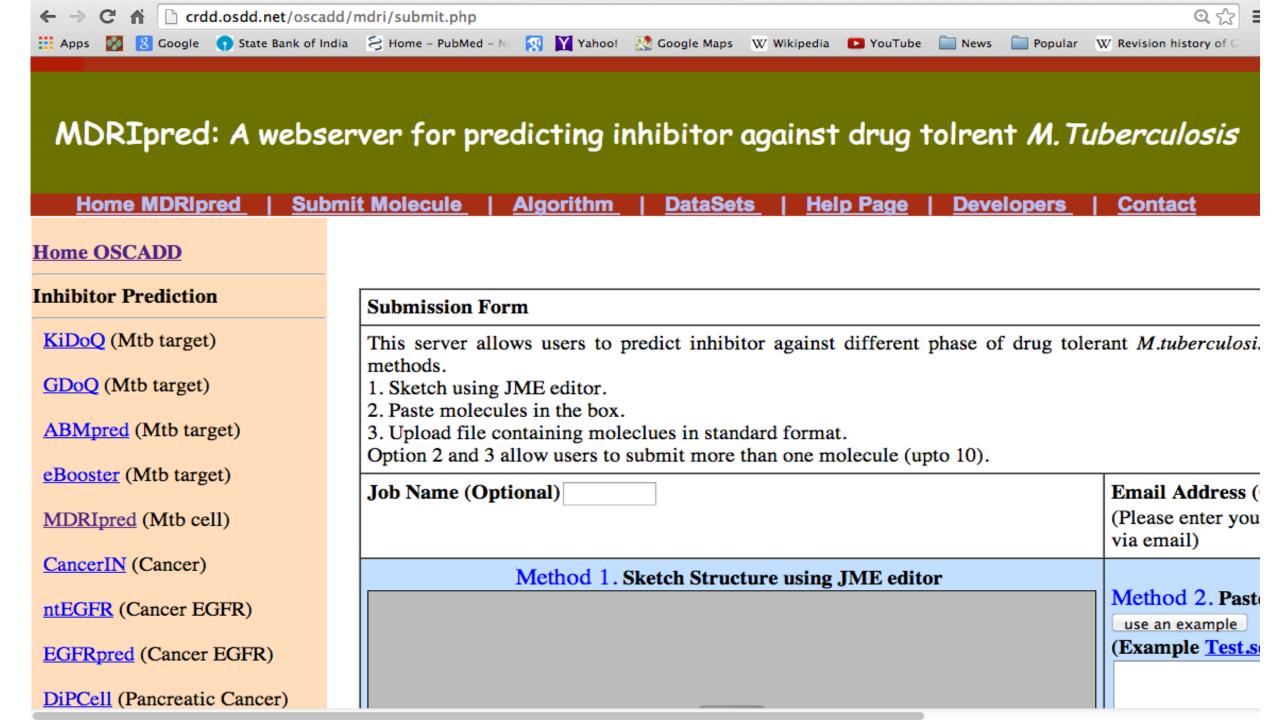
ver, please cite:: Prediction of cytochrome P450 isoform responsible for metabolizing a drug molecule BMC Pharmacolo

- » Home
- » Submit
- » Algorithm
- » Developers
- » Contact Us
- » Help
- » Dataset

Cytochrome P450 enzymes (CYPs) are a multi gene family of heme-containing isoenzymes that are involved in oxidative metabolism of drug, steroids and carcinogens. About sixty CYPs are reported in human genome, but more than 90% of all therapeutic drugs are metabolized by five isoforms i.e. CYP1A2, CYP2C9, CYP2C19, CYP2D6 and CYP3A4.

MetaPred Server predict metabolizing CYP isoform of a drug molecule/substrate, based on SVM models developed using CDK descriptors. This server will be helpful for researcher working in the field of drug discovery. This study demonstrates that it is possible to develop free web servers in the field of chemoinformatics. This will encourage other researchers to develop web server for public use, which may lead to decrease the cost of discovering new drug molecules. In the following flow digaram we have given the example of CYP3A4, how this study will be helpful in drug design.







#### Home OSCADD

#### Inhibitor Prediction

KiDoQ (Mtb target)

GDoQ (Mtb target)

ABMpred (Mtb target)

eBooster (Mtb target)

MDRIpred (Mtb cell)

CancerlN (Cancer)

ntEGFR (Cancer EGFR)

EGFRpred (Cancer EGFR)

DiPCell (Pancreatic Cancer)

### **Welcome to Design Analogs Module**

Lead optimization is a time consuming process in drug discovery. This tool generate all the possible analogs cuser-defined or identified R groups. Finally, the server will generate the virtual chemical library, which wo properties. After screening, the results will be displayed in tabular format with the facility to sort them as per click help.

| Paste Scaffold structure: Use Scaffold Example                |  |
|---|--|
| Paste Building Blocks structure:  Use Building Blocks Example |  |
| Paste linkers :  Use Linker Example                           |  |

### **MetaPred:**A webserver for the Prediction of Cytochrome P450 Isoform responsible for Metabolizing a Drug Molecule

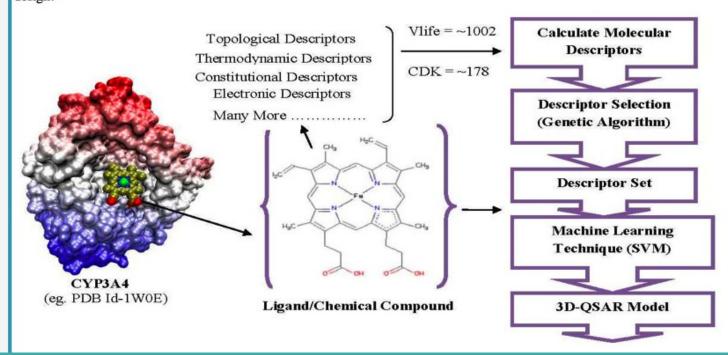
#### Toxipred | KiDoQ | GDoQ | NPTOPE | KetoDrug | CRDD | OSDD | IMTECH | Raghava

ver, please cite:: Prediction of cytochrome P450 isoform responsible for metabolizing a drug molecule BMC Pharmacolo

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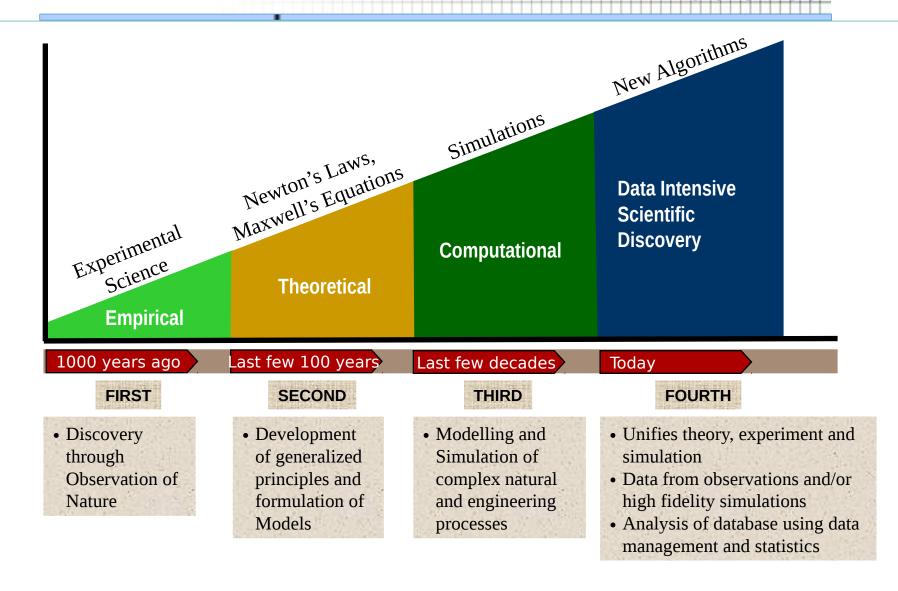


INDRA INFOR

**DELHI** 

### What is the Fourth Paradigm of Science

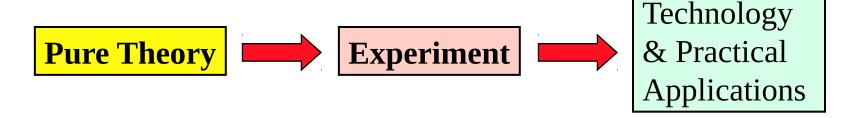




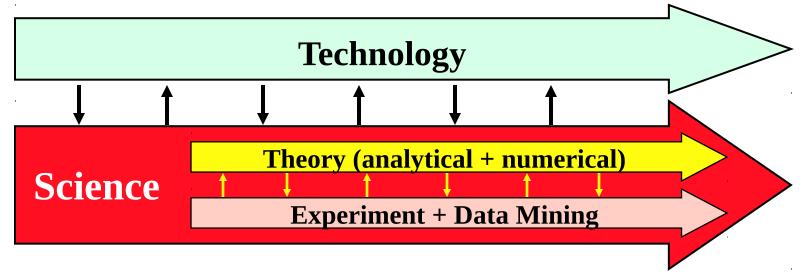
### **Scientific and Technological Progress**



A traditional, "Platonistic" view:



A more modern and realistic view:



This synergy is stronger than ever and growing; it is greatly enhanced by the IT/computation

# Biological Data is Growing with Exponential Rate (Mining this data is a challenge)

### **Limitations of traditional tools**

- Trained on small & obsolete data
- O Unable to utilize modern datamining techniques
- Not suitable for scaling/parallelization
- O Lack of precision & speed

### **Volume**

Gene databases are growing with exponential rates

### **Velocity**

Automatic NGS machines are producing data at high rate

BIG DATA Of Genes

### Variety

gbank

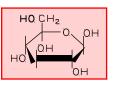
PDB

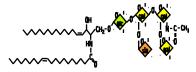
Type of data from sequence to expression to CNV to SNP etc.

### What is Challenge?

Algorithms for dynamic mining for handling data in

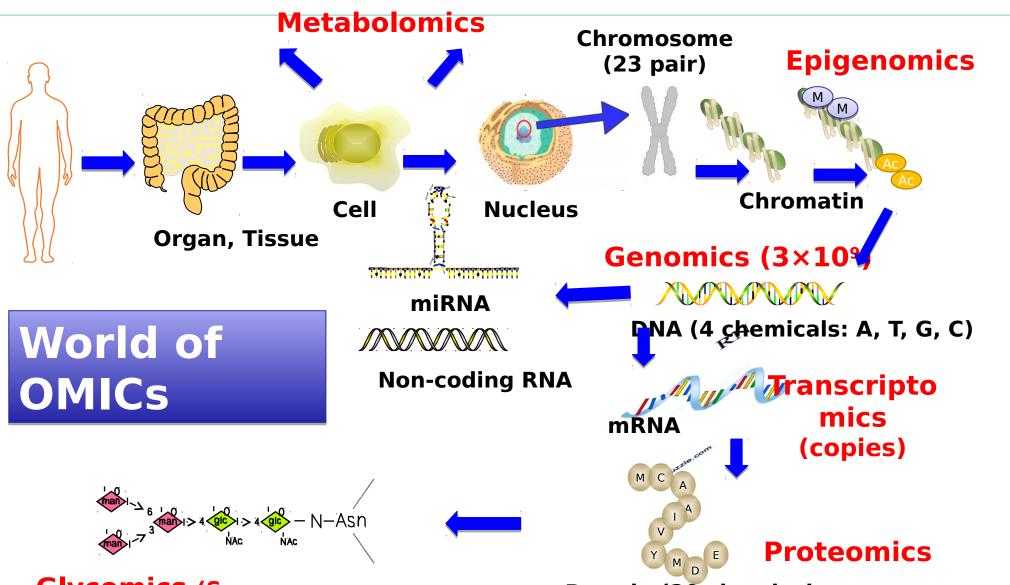
Glycomi CS (Sugars)











**Glycomics** (Sugars

**Protein (20 chemicals:** 



Table 1. Different types of omics techniques used in quantifying the genomic architecture of the human genome and their functionalities

| Type of omics   | Technique Description |   |  |  |  |
|-----------------|-----------------------|---|--|--|--|
| Genomics        | WGS, WES              | Used for variant identification at genome or exome level        |  |  |  |
| Epigenomics     | ChiP-Seq              | Identification for DNA binding site, transcription factor       |  |  |  |
|                 | DNase-Seq             | Identification of regulatory elements                           |  |  |  |
|                 | ChiRP-Seq             | Identification of ncRNA, lncRNA and their associated proteins   |  |  |  |
|                 | WG-bisulphite         | Identification of methylation sites in human genome             |  |  |  |
| Transcriptomics | RNA-Seq               | Identification of transcripts such as mRNA, miRNA               |  |  |  |
| Proteomics      | LC–MS/MS based        | Quantify protein abundance within biological condition          |  |  |  |
|                 | RRPA/SILAC based      | Quantify protein abundance within biological condition          |  |  |  |
| Metabolomics    | LC–MS based           | Identify and quantify metabolites involves in specific pathways |  |  |  |

### CancerDR: Cancer Drug Resistance Database

CSIR - Institute of Microbial Technology, India

Http://webs.iiitd.edu.in/raghava/

cancerdr/

Information

SUDMISSION

Acknowleagement

Guiae

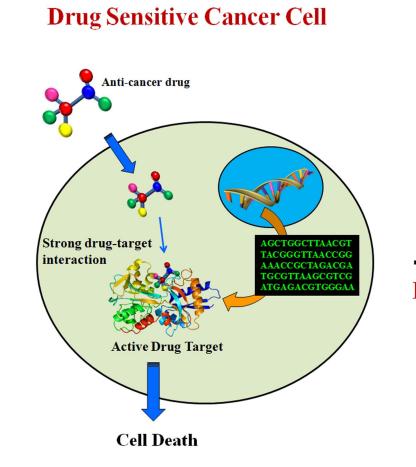
Links

Team

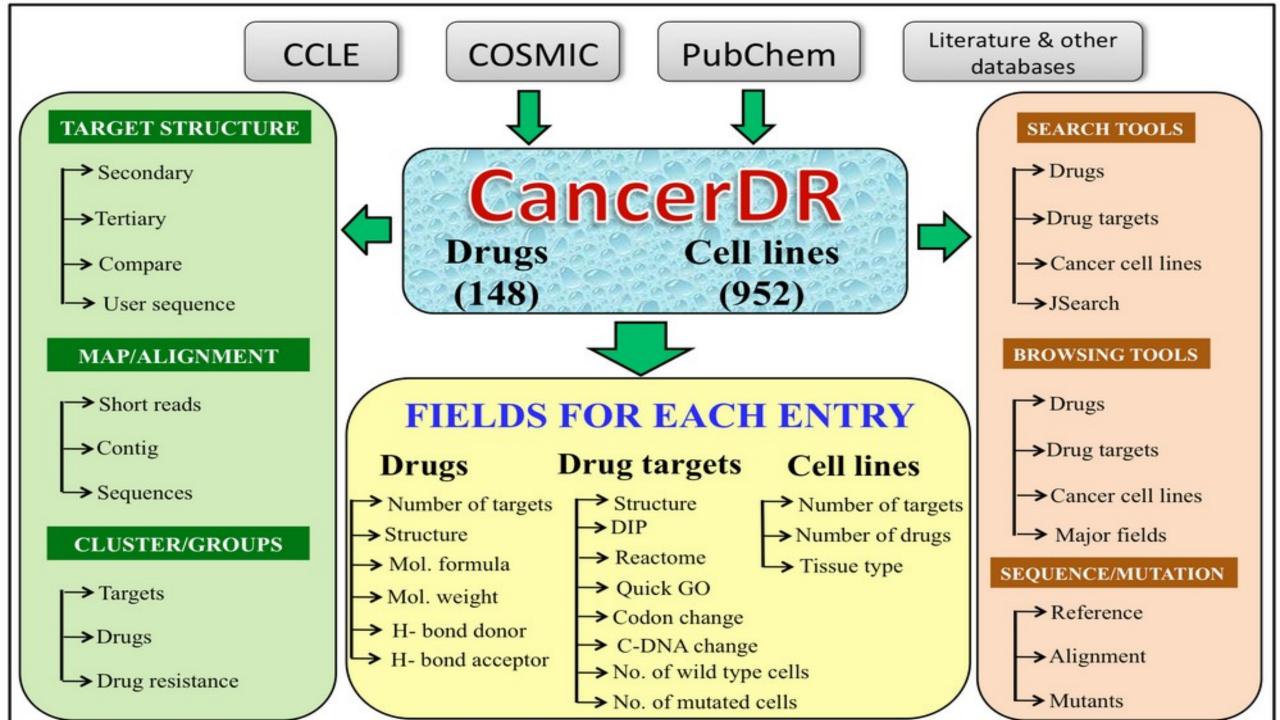
Contact

### Search **Browse** Alignment/Mutation **Target Structure** Map/Alignment Clusters/Groups **Downloads**

General



### **Drug Resistant Cancer Cell** Anti-cancer drug Resistance Weak drug-target interaction **Development** TGAGAC<mark>C</mark>TGGGA **Inactive Drug Target** (mutated) Cell Survival



### **Scientific Reports**

Sci Rep. 6: 23857

# Prioritization of anticancer drugs against a cancer using genomic features of cancer cells: A step towards personalized medicine

Sudheer Gupta<sup>1</sup>, Kumardeep Chaudhary<sup>1</sup>, Rahul Kumar<sup>1</sup>, Ankur Gautam<sup>1</sup>, Jagpreet Singh Nanda<sup>1</sup>, Sandeep Kumar Dhanda<sup>1</sup>, Samir Kumar Brahmachari<sup>2</sup>, Gajendra P. S. Raghava<sup>a1</sup>

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- 2. CSIR-Institute of Genomics and Integrative Biology, Mathura Road, New Delhi-110007, India.
- a. raghava@imtech.res.in

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DOI: 10.1038/srep23857

Published online: 31 March 2016

### **Abstract**

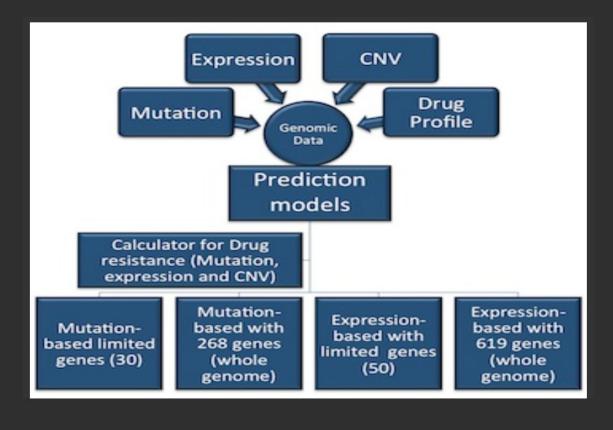
In this study, we investigated drug profile of 24 anticancer drugs tested against a large number of cell lines in order to understand the relation between drug resistance and altered genomic features of a cancer cell line. We detected frequent mutations, high expression and high copy number variations of certain genes in both drug resistant cell lines and sensitive cell lines. It was observed that a few drugs, like Panobinostat, are effective against almost all types of cell lines, whereas certain drugs are effective against only a limited type of cell lines. Tissue-specific preference of drugs was also seen where a drug is more effective against cell lines belonging to a specific tissue.



### Prioritization Of Anticancer Drugs



CancerDP Y Priortization Y Drug Calculator Y Signatures Y Source Y Help Te



## Drug Prioritization Prediction

<u>Prioritization:</u> Prediction of drug prioritization based of mutation/expression/CNV of given genes.

<u>Drug Calculator</u>: Interactive calculation of drug resistar probability.

<u>Genome Submit:</u> Prediction of anticancer drug based of Signatures: Browsing significant and correlated genes.

rence: Gupta et al. (2016) <u>Prioritization of anticancer drugs against a cancer using genomic features of cancer cells:</u> ds personalized medicine. Scientific Reports 6, 23857. #####

Figure 1: Illustration of tissue-specific response of 24 anticancer drugs, where right column contains names of drugs and bottom row has names of tissues.

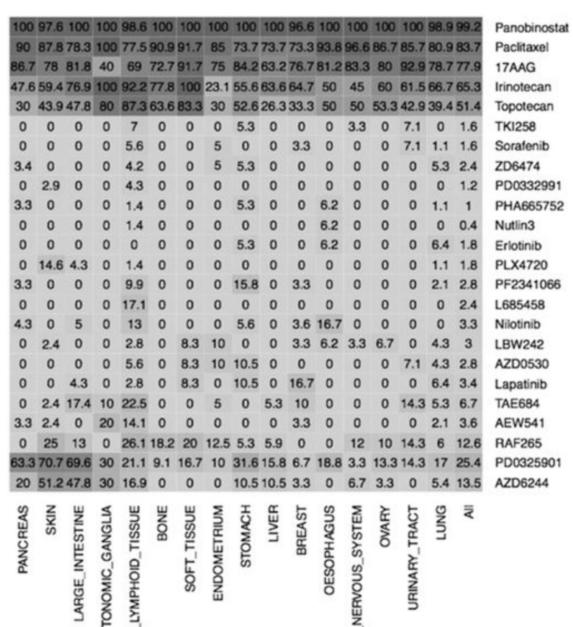


Table 3: The performance of SVM models developed using various genomic features that include mutant genes, variant genes, CNV, expression, hybrid.

From: Prioritization of anticancer drugs against a cancer using genomic features of cancer cells: A step towards personalized medicine

| Drug         | Mutation | Variation | Expression | CNV  | Hybrid | CCLE* |
|--------------|----------|-----------|------------|------|--------|-------|
| 17AAG        | 0.42     | 0.55      | 0.67       | 0.54 | 0.76   | 0.43  |
| AEW541       | 0.25     | 0.54      | 0.69       | 0.54 | 0.75   | 0.33  |
| AZD0530      | 0.41     | 0.45      | 0.65       | 0.56 | 0.71   | 0.19  |
| AZD6244      | 0.52     | 0.51      | 0.81       | 0.56 | 0.82   | 0.59  |
| Erlotinib    | 0.48     | 0.56      | 0.79       | 0.62 | 0.82   | 0.3   |
| Irinotecan   | 0.58     | 0.65      | 0.84       | 0.56 | 0.87   | 0.68  |
| L685458      | 0.44     | 0.63      | 0.82       | 0.59 | 0.89   | 0.48  |
| LBW242       | 0.44     | 0.52      | 0.72       | 0.52 | 0.90   | 0.46  |
| Lapatinib    | 0.43     | 0.57      | 0.75       | 0.64 | 0.79   | 0.09  |
| Nilotinib    | 0.58     | 0.53      | 0.84       | 0.71 | 0.77   | 0.76  |
| Nutlin3      | 0.24     | 0.26      | 0.52       | 0.33 | 0.62   | 0.1   |
| PD0325901    | 0.54     | 0.50      | 0.82       | 0.55 | 0.83   | 0.6   |
| PD0332991    | 0.42     | 0.61      | 0.84       | 0.51 | 0.87   | 0.62  |
| PF2341066    | 0.38     | 0.56      | 0.75       | 0.61 | 0.74   | 0.62  |
| PHA665752    | 0.37     | 0.49      | 0.60       | 0.49 | 0.70   | 0.49  |
| PLX4720      | 0.68     | 0.56      | 0.79       | 0.68 | 0.90   | 0.38  |
| Paclitaxel   | 0.34     | 0.51      | 0.58       | 0.48 | 0.73   | 0.29  |
| Panobinostat | 0.46     | 0.50      | 0.78       | 0.58 | 0.82   | 0.58  |
| RAF265       | 0.48     | 0.49      | 0.73       | 0.53 | 0.78   | 0.35  |
| Sorafenib    | 0.37     | 0.58      | 0.78       | 0.44 | 0.76   | 0.28  |
| TAE684       | 0.38     | 0.42      | 0.68       | 0.52 | 0.74   | 0.38  |
| TKI258       | 0.36     | 0.43      | 0.72       | 0.53 | 0.76   | 0.3   |
| Topotecan    | 0.44     | 0.55      | 0.75       | 0.54 | 0.80   | 0.58  |
| ZD6474       | 0.36     | 0.48      | 0.71       | 0.53 | 0.74   | 0.22  |
| Average      | 0.43     | 0.52      | 0.73       | 0.55 | 0.78   | 0.42  |



https://doi.org/10.1093/bfgp/elab021

Advance Access Publication Date: 1 April 2021

**Review Paper** 

# Computational resources for identification of cancer biomarkers from omics data

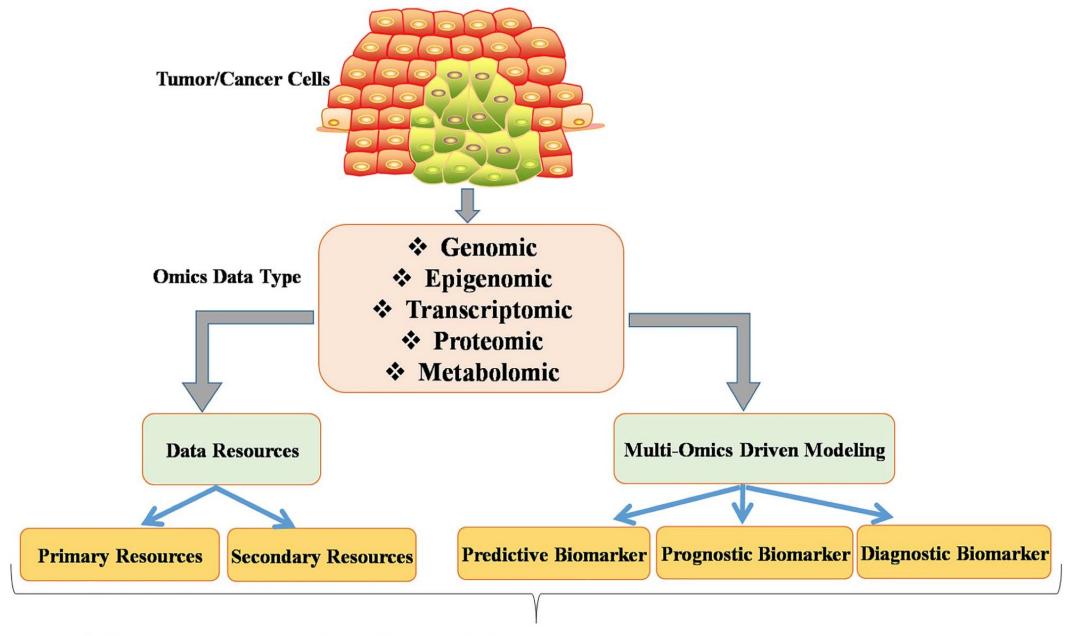
Harpreet Kaur<sup>†</sup>, Rajesh Kumar<sup>†</sup>, Anjali Lathwal<sup>†</sup> and Gajendra P.S. Raghava

Corresponding author: Gajendra P.S. Raghava, Department of Computational Biology, Indraprastha Institute of Information Technology, Okhla Industrial Estate, Phase III, New Delhi 110020, India. Tel.: +91 011 26907444; E-mail address: raghava@iiitd.ac.in

†These authors have contributed equally.

#### **Abstract**

Cancer is one of the most prevailing, deadly and challenging diseases worldwide. The advancement in technology led to the generation of different types of omics data at each genome level that may potentially improve the current status of cancer patients. These data have tremendous applications in managing cancer effectively with improved outcome in patients. This review summarizes the various computational resources and tools housing several types of omics data related to cancer. Major categorization of resources includes—cancer-associated multiomics data repositories, visualization/analysis tools for omics data, machine learning-based diagnostic, prognostic, and predictive biomarker tools, and data analysis algorithms employing the multiomics data. The review primarily focuses on providing comprehensive information on the open-source multiomics tools and data repositories, owing to their broader applicability, economic-benefit and usability. Sections including the comparative analysis, tools applicability and possible future directions have also been discussed in detail. We hope that this information will significantly benefit the researchers and clinicians, especially those with no sound background in bioinformatics and who lack sufficient data analysis skills to interpret something from the plethora of cancer-specific data generated nowadays.



❖ Enhanced understanding of disease etiology ❖ Better therapeutic outcome

Figure 1. Schematic description of the overall methodology and workflow of the review article.



# Computational resources in the management of antibiotic resistance: Speeding up drug discovery

Lubna Maryam<sup>1</sup>, Salman Sadullah Usmani<sup>1</sup>, Gajendra P.S. Raghava\*

Department of Computational Biology, Indraprastha Institute of Information Technology, New Delhi 110020, India

This article reviews more than 50 computational resources developed in past two decades for forecasting of antibiotic resistance (AR)-associated mutations, genes and genomes. More than 30 databases have been developed for AR-associated information, but only a fraction of them are updated regularly. A large number of methods have been developed to find AR genes, mutations and genomes, with most of them based on similarity-search tools such as BLAST and HMMER. In addition, methods have been developed to predict the inhibition potential of antibiotics against a bacterial strain from the whole-genome data of bacteria. This review also discuss computational resources that can be used to manage the treatment of AR-associated diseases.

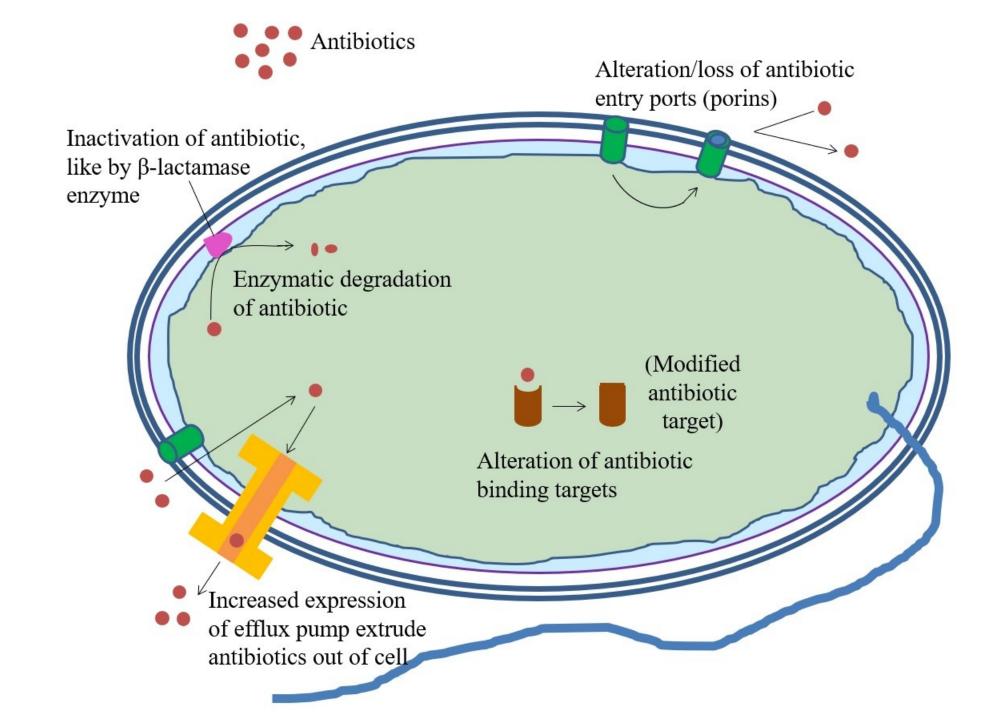


TABLE 1
List of databases concerned with antibiotic-resistance (AR) genes.

| Name and link  | Description   | Status | Update             | Reference |
|--|---|--------|--------------------|-----------|
| ARGO http://bioinformatics.org/argo/beta/index.php   | First database of AR genes  | N      | N/A                | [10]      |
| ARDB  http://ardb.cbcb.umd.edu/  | Information about AR genes  | N      | 2009               | [11]      |
| CARD https://card.mcmaster.ca/   | Comprehensive information on AR genes                               | Α      | 2020               | [12]      |
| CARD 2017 https://card.mcmaster.ca/  | Comprehensive information on AR genes                               | Α      | 2020               |           |
| CARD 2020 https://card.mcmaster.ca/  | Comprehensive information on AR genes                               | Α      | 2020               | [13]      |
| BARRGD https://www.ncbi.nlm.nih.gov/bioproject/313047  | Bacterial antibiotic resistance reference gene database.            | Α      | Frequently updated | [15]      |
| NDARO  https://www.ncbi.nlm.nih.gov/pioproject/31304/  https://www.ncbi.nlm.nih.gov/pathogens/antimicrobial- resistance/ | Antimicrobial resistance genes                                      | A      | 2020               |           |
| LacED  http://www.laced.uni-stuttgart.de/  | Database of TEM- $\beta$ -lactamases                                | Α      | 2017               | [16]      |
| MBLED http://www.mbled.uni-stuttgart.de/   | Contains class B $\beta$ -lactamases                                | Α      | 2012               | [17]      |
| BLAD   | Widely circulated $\beta$ -lactamases database                      | Α      | N/A                | [18]      |
| CBMAR http://proteininformatics.org/mkumar/lactamasedb/  | Facilitates molecular annotation of $\beta$ - lactamases            | Α      | 2014               | [19]      |
| BLDB<br>http://bldb.eu/  | Structural and functional information about β-lactamases            | Α      | 2020               | [20]      |
| β-lactamase database<br>http://ifr48.timone.univ-mrs.fr/beta-lactamase/public/   | Sequence, structure, function and phylogenetic tree of β-lactamases | Α      | N/A                |           |
| TBDReaMDB  | Tuberculosis drug resistance associated                             | N      | N/A                | [21]      |

HOME

- SEARCH

- BROWSE

- TOOLS

▼ INFORMATION

- DOWNLOADS

→ DEVELOPERS

HELP

#### Welcome to Home Page of THPdb

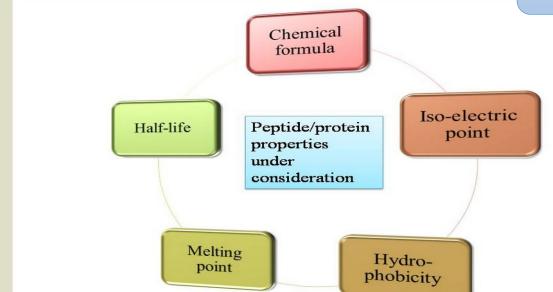
#### **Therapeutic Proteins**

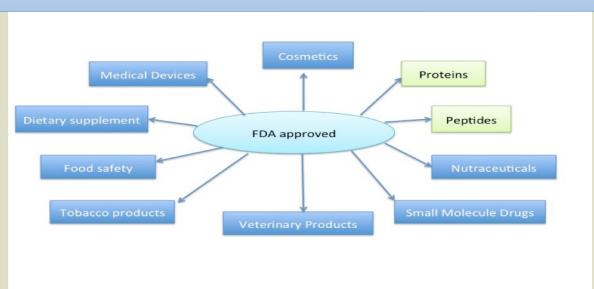
On therapeutic prespective, there is tremendous opportunity in terms of harnessing protein therapeutics to alleviate disease. Once a rarely used subset of medical treatments, protein therapeutics have increased dramatically in number and frequency of use since the introduction of the first recombinant protein therapeutic — human insulin — about 30 years ago. The pharmaceutical industry is viewing therapeutic proteins with a renewed interest. On going research is investigating a myriad of therapeutic peptides to study and improve their availability and efficacy.

#### What is THPdb?

THPdb is a comprehensive database based on approved and approved/investigational therapeutic peptides compiling important information about these peptides, like their description, sequence, indication, mechanism of action, pharmacodynamics, toxicity, metabolism, absorption, half life, volume of distribution, clearance rate, patent information, interaction with other drugs, targets, physicochemical properties, etc. These peptides have been classified into four categories according to their application, making it easy for the user to access them. Therapeutic peptides are modified in different ways so as to alter their properties and then sold under different brand names by various companies. THPdb provides detailed description of such brands in a user-friendly way to enable quick access of relevant information.

# https://webs.iiitd.edu.in/raghava/thpdb/





### Functional Classification of Peptide and Protein Therapeutics Based on Mode of Activity

Group I: Therapeutics with enzymatic or regulatory activity Group II:
Therapeutics with special targeting activity

Group III: Vaccines

la : Replacing a protein that is deficient or abnormal

Ila: Augmenting an existing pathway

Illa: Providing a novel function or activity

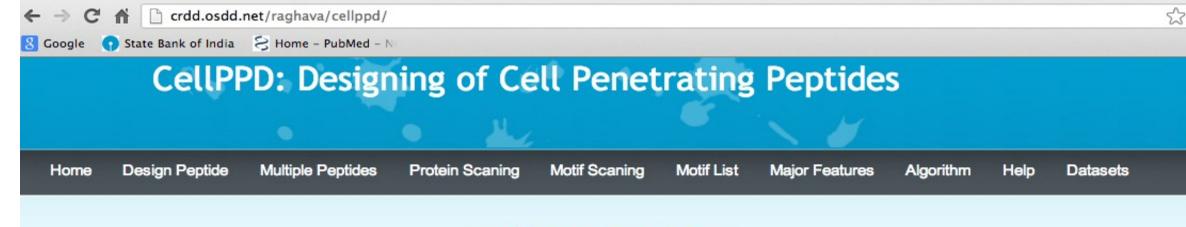
IIa: Interfering with a molecule or organism

IIb: Delivering other compounds or proteins Illa: Protecting
against a
deleterious agent

IIIb: Treating an autoimmune disease

IIIc: Treating cancer

Group IV: Diagnostic agents



#### Welcome to CellPPD

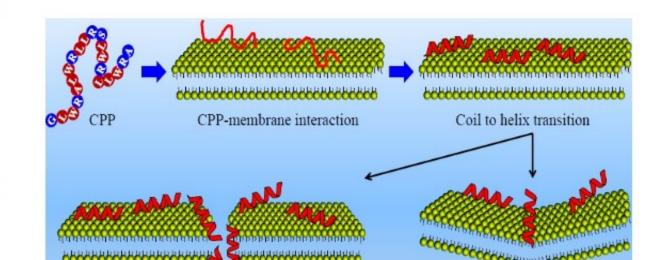
utam et al.: In silico approaches for designing highly effective cell penetrating peptides. Journal of Translational Medicine

3 11:74.Link

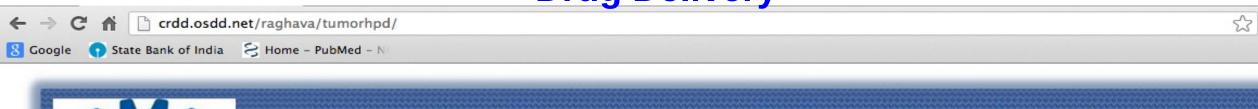
**CellPPD** is an *in silico* method, which is developed to predict and design efficient cell penetrating peptides (CPPs). The main dataset used in this method consists of 708 experimentally validated CPPs.

Major Features include:

- (1) Desing Peptide: This module allows user to generate all possible single mutant analogues of their peptides and predict whether the analogue is cell penetrating or not.
- (2) Multiple Peptides: This module of CellPPD allows user to predict number of CPPs in peptides submitted by the



# **Drug Delivery**





# TumorHPD: Designing of Tumor Homing Peptides (Institute of Microbial Technology, Chandigarh, India)

| Home | Peptide | Protein | Batch | Download | Algorithm | Features | Help |

#### Welcome to TumorHPD

**Tumor homing peptides** are the short peptides having average length between 7 to 12 residues. These peptides h bind to tumor cells or tissues. These peptides can be used to deliver target specific drugs and as imaging agents for thus prediction of tumor homing peptide is important for managing cancer treatment effectively.

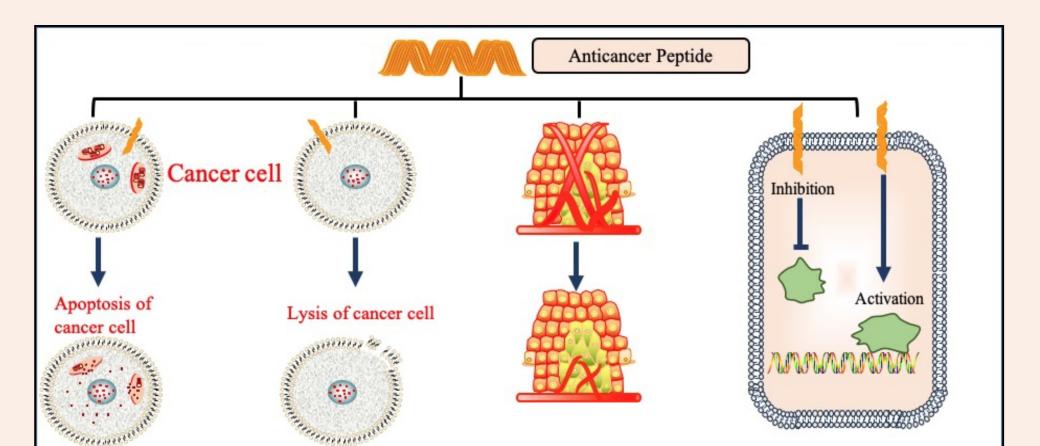
**TumorHPD** is a web server for predicting and designing tumor homing peptides. This server is extremely useful for the field of therapeutic peptides. This server allows the users to design tumor homing peptides and their mutants and physicochemical properties.

ference: Sharma, A. et al. Computational approach for designing tumor homing peptides. Sci. Rep. 3, 1607; DOI:10.

Predict

#### Welcome To AntiCP 2.0

AntiCP 2.0 is an updated version of AntiCP, developed to predict and design anticancer peptides with high accuracy. This study utilize largest possible dataset of anticancer and non-anticancer peptides. Main dataset consists of experimentally validated 861 anticancer peptides and 861 non-anticancer or validated antimicrobial peptides. Alternate dataset comprises of 970 anti-cancer peptides and 970 non-anticancer peptides (randomly pickup from Swiss-Prot).





# **AHTpin**

ANTIHYPERTENSIVE PEPTIDE INHIBITORS

HOME

ALGORITHM

**DATASETS** 

HELP

TEAM

CONTACT

designing of antihypertensive peptides. Sci. Rep. 5, 12512.

#### **Dipeptide**

Tripeptide

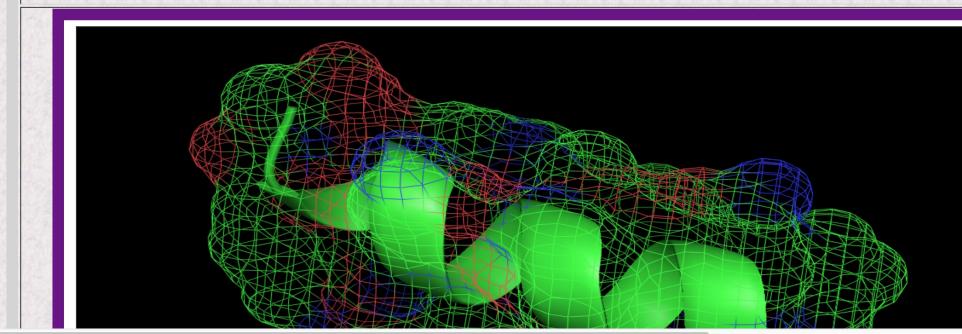
**Tetrapeptide** 

**Pentapeptide** 

Hexapeptide

7-12 residues

# **Welcome to Home Page of AHTpin**



# Antifp: A Prediction server for Antifungal Peptide

Home Predict Mutational Series sliding Window Prediction Download Help Developers Contact

# Welcome to Antifp

=== If you are using this webserver, please cite, Agrawal et al. (2018) In silico approach for prediction of antifungal peptides. Front. Microbiol., 9:23. ===

Antifp is an in silico method, which is developed to predict and design antifungal peptides. The main dataset used in this method consists of 1459 antifungal peptides.

#### **Major features includes:**

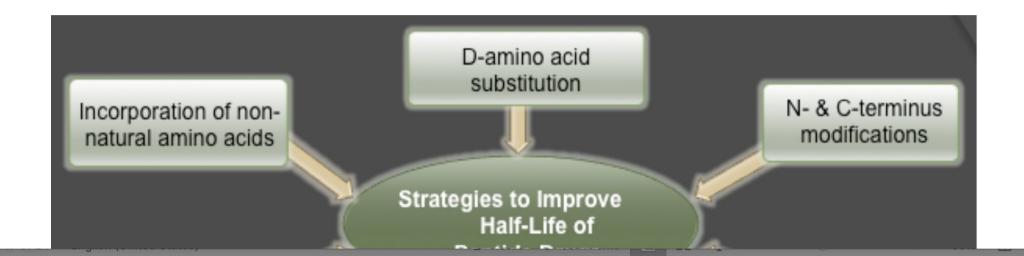
1. **Predict :** This module allows user to predict whether the given sequence or number of sequences is antifungal or not.

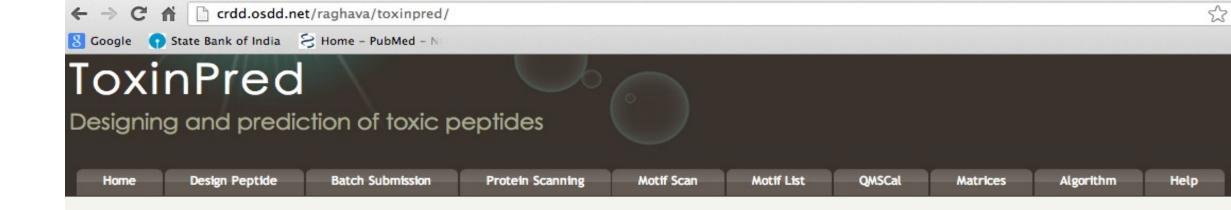
### A Database of Half-life of Peptides

Home Search → Browse → Tools → Download → Important → Team Contact Us

# Welcome to the Home Page of PEPlife

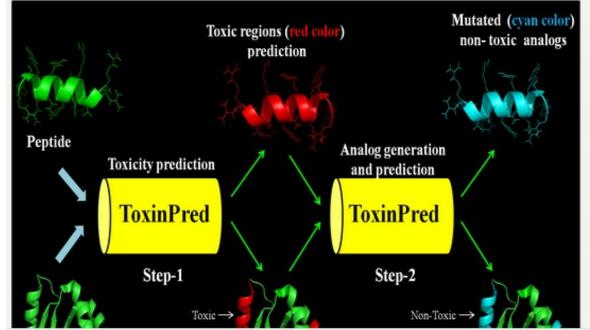
==== If you are using this database, please cite: Mathur, D. et al. PEPlife: A Repository of the Half-life of Peptides. Sci. Rep. 6, 36617; doi: 10.1038/srep36





#### Welcome to ToxinPred

ToxinPred is an *in silico* method, which is developed to predict and design toxic/non-toxic peptides. The main dataset used in this method consists of 1805 toxic peptides (<=35 residues).

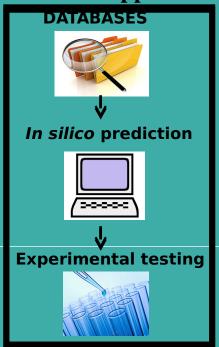


#### Major Features include:

- (1) **Desing Peptide:** This module allows user to generate all possible single mutant analogs of their peptides and predict whether the analog is toxic or not.
- (2) **Batch Submission:** This module of ToxinPred allows user to predict number of toxic peptides submitted by the user.
- (3) **Protein Scanning:** This module generates all possible overlapping peptides and their single mutant analogs of protein submitted by the user. It also predicts whether overlapping peptide/analog is toxic or not.
- (4) QMS Calculator: This tool allows the users to submit query peptide in FASTA format and to optimize the peptide sequence to get maximum/minimum/desired toxicity based upon the Quantitative Matrix based position specific scores. It will help the user to tweak any residue from the predecessor peptide to attain the analog with desired property (highest/lowest toxicity).

# **Cell-Penetrating Peptide for Drug Delivery**

#### **Overall Approach**



#### **CPPs Collection and Compilation**

**CPPsite1** (Database (Oxford). 2012; 2012:bas015) **CPPsite2** (Nucleic Acids Res. 2016; 44(D1):D1098-103)



#### **CPP Prediction tool: CellPPD**

(J Transl Med. 2013 Mar 22;11:74)

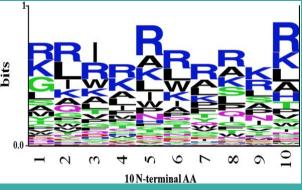


**Virtual Screening** 

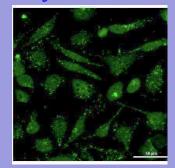
IMT-P8 (Patented\*)

**Experimental Validation** 





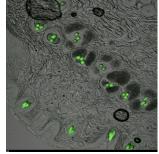
#### **Delivery in Cancer Cells**



Eur J Pharm Biopharm. 2015;89:93-106

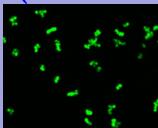
#### **Topical Delivery in Mouse Skin**



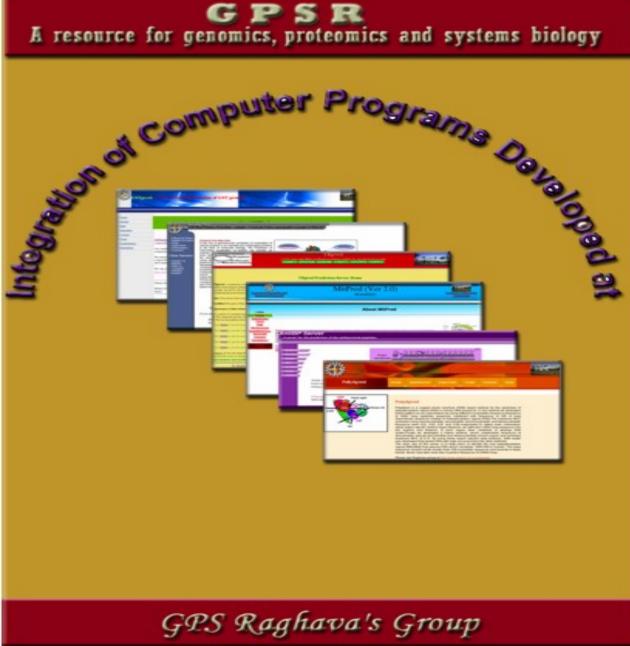


**Scientific Reports 2016** 

Overcome drug resistance in MRSA (combination therapy)



Appl Microbiol Biotechnol. 2016;(9):4073-83



Bioinformatics Centre,

Institute of Microbial Technology, Chandigarh

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#### Introduction

OSDD-Linux integrates open softwares. libraries . source workflows and webservices for creating environment for drug discovery. First attempt made to customize linux to provide services to community of drug discovery. OSDD-Linux may bring down cost as well as increase speed of drug discovery.

#### **Features**

≽A single platform bioinformatics for and cheminformatics.

#### Webserver

A separate apache runs all web-servers as local host in the SDD-Linux CD.

#### Softwares

GPSR packages, webservers. standalone, galaxy versions of tools developed in Dr.Rahghava's lab along with third party softwares like rasmol. pymol are integrated

#### **Features**

>User can customize according to need. **≽**Easv to install and free of cost. ≽lt can be launched using LiveCD. Liive server, USB and virttualldesk top like virtualbox. > Provides source codes for various

### **OSDDLinux: A Platform** for Open Source Drug **Discovery**

available in ird party softwares formats e.g. three

webservers. standalone and galaxy.

have been integrated.

### System Requirements

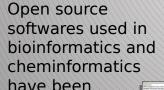
The user may use OSDDLinux from portable devices like CD/DVD, USB drive etc or install on local machine or virtual machine depending upon requirement.



All softwares are integrated in galaxy servers for making the workflows.

#### tools. **Future** directions

More webservices, modules, debian packages will be updated on regular basis.





**OSDDLin** 

Standalone

Command line

integrated for

scale data.

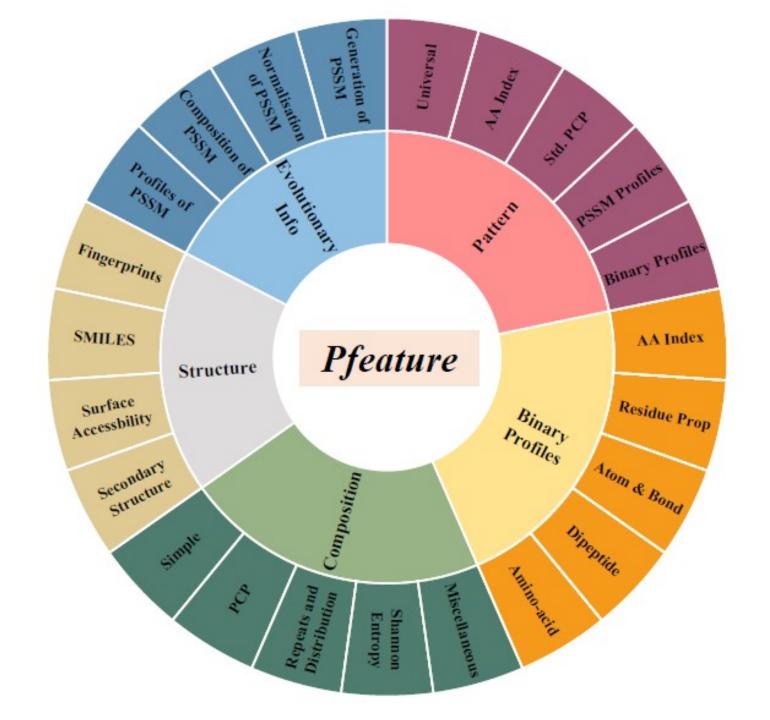
analysing large

tools have been

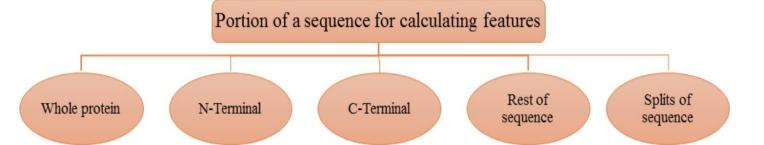
INDRA **INFOR DELHI** 



## computing /pfeature 4 ptid pe ghava, for DO er ש Ser ote edu. web 0 <del>J</del>O /webs.iiit 4 4 Pfeature: featu

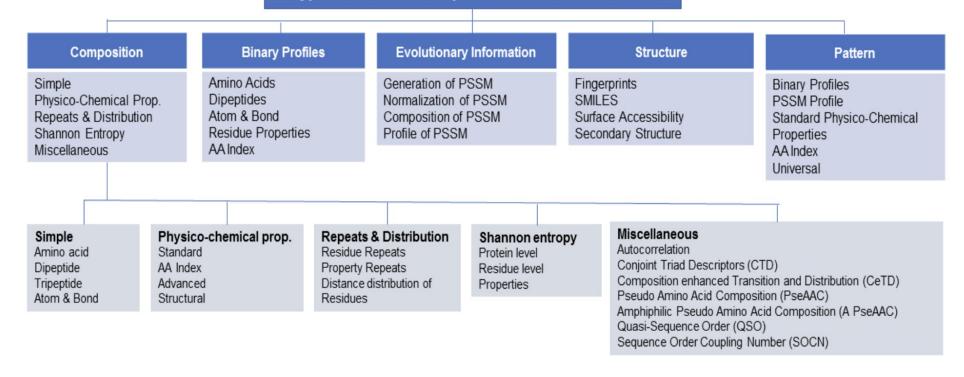








#### Types of Protein/Peptide Feature Generation



# https://webs.iiitd.edu.in/gpsrdocker/



**GPSRdocker** 

eature Generation

& Selection

Bioinformati

Method's Evaluation

Common Bioinformatic Tools Important Links

Docker

Application in Real Life

Protein General

Home Installation Modules GPSRdocker / Miscellaneous Contact / / /



#### **★**DOWNLOAD GPSRDOCKER MANUAL

# Welcome to GPSRdocker A

resource for Genomics, Proteomics and Systems biology



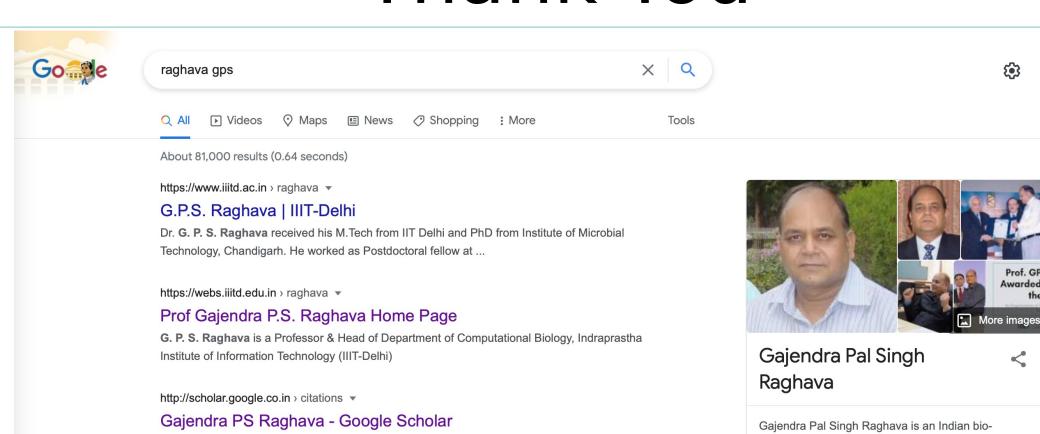
GPSRdocker is a docker-based container that provides a resources on Genomics, Proteomics and System Biology. In last two decades Prof G. P. S. Raghava group developed more than 200 web-based services, which are heavily used by scientific community. There are number of challenges in utilizing full potential of these services that includes; i) Internet speed, ii) limits on computing power, and iii) security of data. Thus, user needs standlone version of these web-based services, so they can run these services on their local machines. In past group has made attempt to fullfill requirement of users by providing perl script of routine program (GPSR) and customize or virtualize operating system (OSDDlinux). GPSRdocker is another attempt to provide standalone version corresponding to web services at our group. GPSRdocker, is based on docker suite where customized container of all our webservers are available.

# Thank You



(P)

Prof. GPS Awarded S



S Gupta, P Kapoor, K Chaudhary, A Gautam, R Kumar, GPS Raghava, ... PloS one 8 (9), e73957, 2013. 446, 2013. ProPred1: prediction of promiscuous MHC Class-I ... You've visited this page many times. Last visit: 17/7/21

https://en.wikipedia.org > wiki > Gajendra Pal Singh ... ▼

#### Gajendra Pal Singh Raghava - Wikipedia

Gajendra Pal Singh Raghava is an Indian bio-informatician and head of computational biology ... G P S Raghava receiving National Bioscience Award from Science and ...

Personal · Career and higher studies · Achievements and awards

Gajendra Pal Singh Raghava is an Indian bioinformatician and head of computational biology at the Indraprastha Institute of Information Technology. Wikipedia

Born: 25 May 1963 (age 58 years), Bulandshahr

Institutions: Indraprastha Institute of Information

Technology

Awards: Shanti Swarup Bhatnagar Prize for Science

and Technology (2008), MORE