

# Izhar Wallach

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## Education

### Ph.D. Candidate

*Computer Science*

University of Toronto

*Jan 2009 – Jun 2012 (expected)*

My research focuses on improving posing and ranking of molecular docking. Particularly, developing algorithms for:

- Small-molecule binding-mode prediction
- Reduce bias in structure-based high-throughput screening
- Pharmacophore inference and protein binding-site similarity

Additionally, I have worked on analyzing large quantities of chemical genomics and genetic interaction data. Particularly, developing algorithms for:

- Genome-wide drug combination effect
- Combining structure- and pathway-based network models for the analysis of adverse drug reactions
- Synthetic Genetic Array analysis (yeast/E.coli)

Advisor: Ryan Lilien

### M. Sc.

*Computer Science*

University of Toronto

*Sep 2007 – Jan 2009*

Algorithms for predicting binding site similarities and inference of protein-small-molecule interaction patterns

Advisor: Ryan Lilien

### B. Sc. (4-year track)

*Computer Science*

Israel Institute of Technology (Technion)

*Sep 1999 – Apr 2004*

Developed a framework for computational inference of RNA secondary structure similarity

Advisor: Zohar Yakhini

## Work Experience

### Researcher

*Michael Brudno's group*

University of Toronto

*May 2011 – Present*

Develop novel structure-based algorithms to identify the effect of genomic variation in heterogeneous population on the efficacy of drugs. Worked on integrating genomic and proteome information into a framework that identifies drugs that may show altered efficacy profiles due to variation in the binding sites of their primary targets. My research involved:

- Identifying of potential genomic variants in drug targets and building alternative structural models
- Developing novel docking algorithms and decoy-based normalization techniques
- Performing molecular-dynamics simulations and calculating binding-free energies of potentially affected drugs

### Algorithm Developer

*Keddem Bioscience*

Ashkelon, Israel

*May 2004 – Jul 2007*

Algorithm developer at *Keddem Bioscience*, a small-molecule drug discovery company. Experience with cheminformatics technologies for drug design such as pharmacophore analysis, molecular similarity and scaffold hopping, computational QSAR, molecular clustering and docking optimization.

Specifically, I led or was involved in the following projects:

- Design of a chemical universal screening library for protein binding site probing
- Algorithms for protein active site mapping using protein-ligand interaction analysis
- Algorithm for active site reconstruction that utilizes information obtained from high-throughput screening
- Pharmacophore-based small-molecule docking algorithm

### Unix System Administrator

*Intel Development Center*

Haifa, Israel

*Aug 2001 – May 2004*

- UNIX/Linux system administration
- Development of internal data management tools
- Development of monitoring and administration scripts

## Skills

**Cheminformatics/Bioinformatics** Solid theoretical and practical knowledge of 2D and 3D methods of cheminformatics, statistical modeling, pharmacophore inference, ligand- and structure-based virtual screening, small-molecule-protein interaction, docking and scoring, genetic and protein interactions, pathway analysis, molecular network models, and large-scale -OMICS data.

**Molecular modeling tools** Accelrys, Schrodinger, OpenEye, Tripos

**Docking packages** Extensive experience with Glide, eHiTS, Dock, AutoDock, Amber

**Cheminformatics/Bioinformatics software development** OpenBabel Chemical ToolBox, Bioperl, PerlMol, Pymol scripting interface

**Programming languages** High proficiency in C/C++, R, Perl, UNIX Shells, L<sup>A</sup>T<sub>E</sub>X

Others: Matlab, Python/NumPy/SciPy, Java, SQL.

**Databases** Extensive work with: PDB, MMDB, PubChem, ChEMBL, KEGG, DrugBank

**Operating systems** High proficiency in development under UNIX and Linux

## Publications

- **Izhar Wallach**, Navdeep Jaitly, Kong Nguyen, Matthieu Schapira, Ryan Lilien, *Normalizing Molecular Docking Rankings using Virtually Generated Decoys*, Journal of Chemical Information and Modeling, 51(8):1817-1830, (2011)
- **Izhar Wallach** and Ryan Lilien, *Virtual Decoy Sets for Molecular Docking Benchmarks*, Journal of Chemical Information and Modeling, 51(2):196-202, (2011)
- **Izhar Wallach**, *Pharmacophore Inference and its Application to Computational Drug Discovery*, Drug Development Research, 72(1):17-25, (2010)
- **Izhar Wallach**, Navdeep Jaitly, Ryan Lilien, *A Structure-Based Approach for Mapping Adverse Drug Reactions to the Perturbation of Underlying Biological Pathways*, PLoS ONE 5(8), (2010)
- **Izhar Wallach** and Ryan Lilien, *Predicting Multiple Ligand Binding Modes Using Self-Consistent Pharmacophore Hypotheses*, Journal of Chemical Information and Modeling, 49(9):2116-2128, (2009)
- **Izhar Wallach** and Ryan Lilien, *Prediction of Sub-Cavity Binding Preferences Using an Adaptive Physicochemical Structure Representation*, Bioinformatics, 25:i296-304 (2009)  
Article also appeared as:  
**Izhar Wallach** and Ryan Lilien, *Prediction of Sub-Cavity Binding Preferences Using an Adaptive Physicochemical Structure Representation*, Proc. International Conference on Intelligent Systems for Molecular Biology (ISMB), Stockholm, Sweden, (2009)
- **Izhar Wallach** and Ryan Lilien, *The protein – small-molecule database, a non-redundant structural resource for the analysis of protein-ligand binding*, Bioinformatics, 25(5):615-20 (2009)

## Oral Presentations

- *Virtual Decoy Sets for Molecular Docking Benchmarks and Ranking*, The American Chemical Society (ACS) meeting, Anaheim, California (2011)
- *Predicting Multiple Ligand Binding Modes Using Self-Consistent Pharmacophore Hypotheses*, The American Chemical Society (ACS) meeting, San-Francisco, California (2010)
- *Prediction of Sub-Cavity Binding Preferences Using an Adaptive Physicochemical Structure Representation*, International Conference on Intelligent Systems for Molecular Biology (ISMB), Stockholm, Sweden, (2009).

## Awards & Fellowships

- C.C. Gotlieb (Kelly) Graduate Fellowship in the Department of Computer Science (2008).
- Helen Sawyer Hogg Graduate Admission Award (2007).

## Teaching Experience

### Teaching Assistant

University of Toronto  
*Sep 2007 – Present*

- CSC209 – Software Tools and Systems Programming
- CSC192 – Computer Programming, Algorithms, Data Structures and Languages
- CSC148 – Introduction to Computer Science
- CSC108 – Introduction to Computer Programming