# Structural bioinformatics

# Foldit Standalone: a video game-derived protein structure manipulation interface using Rosetta

Robert Kleffner<sup>1</sup>, Jeff Flatten<sup>2</sup>, Andrew Leaver-Fay<sup>3</sup>, David Baker<sup>4,5,6</sup>, Justin B. Siegel<sup>7,8,9</sup>, Firas Khatib<sup>10</sup> and Seth Cooper<sup>1,\*</sup>

<sup>1</sup>College of Computer and Information Science, Northeastern University, Boston, MA 02115, USA, <sup>2</sup>Department of Computer Science and Engineering, University of Washington, Seattle, WA 98195, USA, <sup>3</sup>Department of Biochemistry, University of North Carolina at Chapel Hill, Chapel Hill, NC 27599, USA, <sup>4</sup>Department of Biochemistry, <sup>5</sup>Institute for Protein Design, <sup>6</sup>Howard Hughes Medical Institute, University of Washington, Seattle, WA 98195, USA, <sup>7</sup>Genome Center, <sup>8</sup>Department of Chemistry, <sup>9</sup>Department of Biochemistry and Molecular Medicine, University of California Davis, Davis, CA 95616, USA and <sup>10</sup>Department of Computer and Information Science, University of Massachusetts Dartmouth, Dartmouth, MA 02747, USA

\*To whom correspondence should be addressed. Associate Editor: Alfonso Valencia

Received on December 26, 2016; revised on March 17, 2017; editorial decision on April 22, 2017; accepted on May 4, 2017

## Abstract

**Summary**: Foldit Standalone is an interactive graphical interface to the Rosetta molecular modeling package. In contrast to most command-line or batch interactions with Rosetta, Foldit Standalone is designed to allow easy, real-time, direct manipulation of protein structures, while also giving access to the extensive power of Rosetta computations. Derived from the user interface of the scientific discovery game Foldit (itself based on Rosetta), Foldit Standalone has added more advanced features and removed the competitive game elements. Foldit Standalone was built from the ground up with a custom rendering and event engine, configurable visualizations and interactions driven by Rosetta. Foldit Standalone contains, among other features: electron density and contact map visualizations, multiple sequence alignment tools for template-based modeling, rigid body transformation controls, RosettaScripts support and an embedded Lua interpreter.

**Availability and Implementation:** Foldit Standalone is available for download at https://fold.it/stand alone, under the Rosetta license, which is free for academic and non-profit users. It is implemented in cross-platform C ++ and binary executables are available for Windows, macOS and Linux. **Contact:** scooper@ccs.neu.edu

### **1** Introduction

Graphical, interactive tools for molecular modeling are becoming accessible to the general public through citizen science projects. The interface of the game Foldit, one such project, was designed to make manipulating protein structures accessible to non-experts, while still maintaining scientific accuracy (Cooper *et al.*, 2010). In order to make Foldit's interface more useful as a biochemistry application, we have developed Foldit Standalone by removing game-specific features while adapting and adding features catering to experienced biochemists, including allowing users to load and manipulate their own molecular structures—mainly proteins. Figure 1 shows a Foldit Standalone screenshot.

Foldit Standalone's manipulations are driven by the powerful Rosetta molecular modeling package (Leaver-Fay *et al.*, 2011; Rohl *et al.*, 2004), which has been used in a variety of computational modeling applications. This includes the prediction and design of protein structures (Kuhlman *et al.*, 2003), protein–protein interfaces (Gray *et al.*, 2003) and protein-small molecule interfaces (Meiler and Baker, 2006). As Rosetta is implemented in C++, a number of other front-ends have been developed to support easier authoring and use of scientific protocols. These include PyRosetta (Chaudhury

2765

<sup>©</sup> The Author 2017. Published by Oxford University Press.

This is an Open Access article distributed under the terms of the Creative Commons Attribution Non-Commercial License (http://creativecommons.org/licenses/by-nc/4.0/), which permits non-commercial re-use, distribution, and reproduction in any medium, provided the original work is properly cited. For commercial re-use, please contact journals.permissions@oup.com

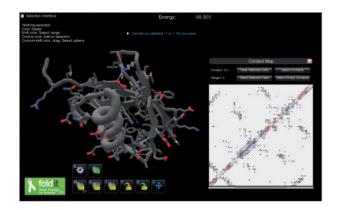


Fig. 1. A screenshot of the Foldit Standalone interface, with the contact map shown for the currently loaded structure. There are a variety of options to customize the visualization

*et al.*, 2010), which provides Python bindings for much of the Rosetta C++ API, and RosettaScripts (Fleishman *et al.*, 2011), which allows various aspects of protocols to be specified in XML format. Graphical interfaces to Rosetta include Interactive ROSETTA (Schenkelberg and Bystroff, 2015) and the PyRosetta toolkit (Adolf-Bryfogle and Dunbrack, 2013), both of which provide extensive means for setting up, running and viewing the results of Rosetta protocols. In contrast, Foldit Standalone focuses on providing simplicity of use and does not require previous knowledge of Rosetta to get started.

### 2 Features

Foldit Standalone is implemented in C++ within the Rosetta codebase. It consists of additional libraries and an executable in the architectural style of the rest of Rosetta. The code is cross-platform and builds and runs on Windows, macOS and Linux. Foldit Standalone contains a custom rendering engine built with OpenGL that handles display of 2D interface elements and 3D geometry, along with a custom input event system. Most features are shared with the Foldit game; Foldit Standalone replaces the game's terminology with more standard terminology. Although the interface, visualizations and tools are focused on proteins, there is basic support for DNA, RNA and small molecules.

Foldit Standalone supports a variety of visualization options, including different geometries (including line, sphere and cartoon); different colorings (including energy-based, CPK and rainbow); and different levels of abstraction (hiding or showing hydrogens and protein sidechains). Additional custom visualizations include *clashes* where atoms' van der Waals volumes overlap; *voids* showing empty, desolvated space; marking solvent-exposed hydrophobics; and hydrogen bonds and disulfides. Electron density maps can be loaded and visualized with their own set of visualization options.

Foldit Standalone's custom interactive manipulations have been implemented specifically for real-time molecule manipulation. These manipulations include clicking and dragging to pull on the backbone or sidechains; adding *rubber bands* or *freezing* portions of a molecule, which use soft and hard constraints that impact other manipulations; fragment insertion; amino acid insertion, deletion and mutation; and rigid body controls for docking. Users can also launch interactive versions of minimization and rotamer optimization, which update the display as they run and can be canceled. Longlived or computationally intensive manipulations run in a background thread so that the interface remains responsive. Using Foldit Standalone's selection interface, the user can select regions of the molecule, and then perform different manipulations on their selection. Additional tools allow more advanced manipulations, including a Ramachandran map panel, a multiple sequence alignment panel, and a contact map panel. Foldit Standalone supports protocol automation through both RosettaScripts and an embedded Lua interpreter.

Foldit Standalone can import several standard and Rosettaspecific file formats. A session can be started by importing at least a PDB or FASTA file; other files imported at the same time—such as constraints, electron density, Rosetta-based symmetry definitions, or template structures—will customize the session setup. Session states can be saved and loaded using a custom file format, and PDBs can be exported. While it is possible to load large structures into Foldit Standalone, we have found that smaller structures (fewer than 500 residues) are preferable for smooth interactions.

#### **3 Conclusion**

Throughout the years, a number of expert-oriented tools for visualizing and interacting with molecular structures have been developed, including Sculpt (Surles *et al.*, 1994), ProteinShop (Crivelli *et al.*, 2004) and Coot (Emsley and Cowtan, 2004). PyMOL (DeLano, 2002), a widely popular tool for molecule visualization, also supports some manipulation of input molecules. Foldit Standalone goes well beyond this body of software, providing an accessible graphical structure manipulation interface coupled to the powerful Rosetta energy function and sampling methods. As the tools improve and broader participation is elicited, there will almost certainly be new and significant scientific discoveries enabled through this innovative interface for modeling and design.

#### Acknowledgements

The authors would like to thank the Rosetta developers and RosettaCommons for their contributions to the Rosetta software used by Foldit Standalone. The authors also thank the Foldit development team for their work, and the Foldit players for providing feedback on the Foldit game interface.

#### Funding

This work was supported by the National Science Foundation [1629879]; the National Institutes of Health [1UH2CA203780]; and RosettaCommons.

Conflict of Interest: none declared.

#### References

- Adolf-Bryfogle, J. and Dunbrack, R.L. Jr. (2013) The PyRosetta toolkit: a graphical user interface for the Rosetta software suite. *PLoS One*, 8, e66856.
- Chaudhury, S. *et al.* (2010) PyRosetta: a script-based interface for implementing molecular modeling algorithms using Rosetta. *Bioinformatics*, 26, 689–691.
- Cooper, S. et al. (2010) Predicting protein structures with a multiplayer online game. Nature, 466, 756–760.
- Crivelli, S. et al. (2004) ProteinShop: a tool for interactive protein manipulation and steering. J. Comput. Aided Mol. Des., 18, 271–285.
- DeLano, W.L. (2002) The PyMOL molecular graphics system. DeLano Scientific, San Carlos, CA, USA.
- Emsley, P. and Cowtan, K. (2004) Coot: model-building tools for molecular graphics. Acta Crystallogr. D Struct. Biol., 60, 2126–2132.

- Fleishman, S.J. *et al.* (2011) RosettaScripts: a scripting language interface to the Rosetta macromolecular modeling suite. *PLoS One*, 6, e20161.
- Gray, J. J. et al. (2003) Protein-protein docking with simultaneous optimization of rigid-body displacement and side-chain conformations. J. Mol. Biol., 331, 281–299.
- Kuhlman,B. et al. (2003) Design of a novel globular protein fold with atomiclevel accuracy. *Science*, **302**, 1364–1368.
- Leaver-Fay, A. et al. (2011) ROSETTA3: an object-oriented software suite for the simulation and design of macromolecules. *Methods Enzymol.*, 487, 545–574.
- Meiler, J. and Baker, D. (2006) ROSETTALIGAND: protein-small molecule docking with full side-chain flexibility. *Proteins: Struct., Funct., Bioinf.*, 65, 538–548.
- Rohl,C.A. et al. (2004) Protein structure prediction using Rosetta. Methods Enzymol., 383, 66–93.
- Schenkelberg, C.D. and Bystroff, C. (2015) InteractiveROSETTA: a graphical user interface for the PyRosetta protein modeling suite. *Bioinformatics*, 31, 4023–4025.
- Surles, M.C. et al. (1994) Sculpting proteins interactively: continual energy minimization embedded in a graphical modeling system. Protein Sci., 3, 198–210.