



# Current practice is substandard

- At large, economists are not too sophisticated with software development
- Programming language, coding style and code is often inherited from the supervisors
- Inefficient code sharing
- “Reinventing the wheel” + replication of bugs
- Workflow can be greatly improved by learning from other disciplines

# The brighter future

- Modularization, sharing and reuse of developed code
- Collection of canonical implementations
- Reliability through independent use by many researchers + means of communication
- Agreement on good software engineering practices
- $\Rightarrow$  Accumulation of knowledge and skills in software development in/for economics

# Value of good software engineering

“The systematic application of scientific and technological knowledge, methods, and experience to the design, implementation, testing, and documentation of software”

- Version control and the ability to undo and trace any problem back
- Version control and efficient collaboration
- Incremental development and continuous integration
- Unit testing and test driven development

Significant increase in productivity

# A number of lone warriors

- 1 Econ-ARK [econ-ark.org/](http://econ-ark.org/)
- 2 QuantEcon [quantecon.org/](http://quantecon.org/)
- 3 Projects run by Richard Evans
- 4 VFI toolkit by Robert Kirkby
- 5 Dolo language by Pablo Winant
- 6 NFXP code + manual by John Rust
- 7 OpenSourceEconomics by Philipp Eisenhauer
- 8 Atomized developers of open source code in economics (publishing specific projects code)

# What are the right incentives

Profession does not acknowledge community work  
such as good code development in tenure process

## PUBLICATIONS

- Add to publication list
- Collect citations
- Trouble-free publication process  
conditional on well written code
- CrossRef + DOI = proper publication



# Use cases

## Computational economist/Developer

- Go extra mile in own code development
- Submit **main paper** in parallel with **code paper**

## Student

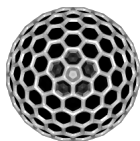
- Replication project → learn + **code publication**
- Start own project from bug-free verified code

## Editor/Referee

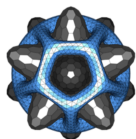
- Consult the community for **quality check**
- Outsource **code review** for accepted papers



# Modern open source journals



Open Journals [theojs.org](http://theojs.org)



The J of Open Source Software

- The Journal of Open Source Education
- The Open Journal of Astrophysics
- The Journal of Brief Ideas

# The Open Journals

- Collection of open source, open access journals
- Creates infrastructure for open access publishing under MIT license
- Fiscally sponsored project of the NumFOCUS
- Individual journals are responsible for their own editorial process, but must
  - Be open access
  - Have an open review process
  - Use the Open Journals open source toolchain

# 10.21105.joss.00615



## Optim: A mathematical optimization package for Julia

Patrick K Mogensen<sup>1</sup> and Asbjørn N Riseth<sup>2</sup>

<sup>1</sup> University of Copenhagen <sup>2</sup> University of Oxford

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### Software

- Review
- Repository
- Archive

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### Summary

*Optim* provides a range of optimization capabilities written in the Julia programming language (Benamou et al. 2017). Our aim is to enable researchers, users, and other Julia packages to solve optimization problems without writing such algorithms themselves. The package supports optimization on manifolds, functions of complex numbers, and input types such as arbitrary precision vectors and matrices. We have implemented routines for derivative free, first-order, and second-order optimization methods. The user can provide derivatives themselves, or request that they are calculated using automatic differentiation or finite difference methods. The main focus of the package has currently been on unconstrained optimization, however, less-constrained optimization is supported, and a more comprehensive support for constraints is underway.

Similar to *Optim*, the C library *NLopt* (Johnson 2008) contains a collection of nonlinear optimization routines. In Python, *scipy.optimize* supports many of the same algorithms as *Optim* does, and *Pymanopt* (Toscarini, Niklas, and Weichwald 2016) is a toolbox for manifold optimization. Within the Julia community, the packages *BlackBoxOptim.jl* and *Optim.jl* provide optimization capabilities focusing on derivative-free and large-scale smooth problems respectively. The packages *Concave.jl* and *JuliaOpt.jl* (Dunning, Huettenlocher, and Lathin 2017) define modelling languages for which users can formulate optimization problems. In contrast to the previously mentioned optimization codes, *Concave* and *JuliaOpt* work as abstraction layers between the user and solvers from other packages.

### Optimization routines

As of version 0.14, the following optimization routines are available.

- Second-order methods
  - Newton
  - Newton with trust region
  - Hessian-vector with trust region
- First-order methods
  - BFGS
  - L-BFGS (with linear preconditioning)
  - Conjugate gradient (with linear preconditioning)
  - Gradient descent (with linear preconditioning)
- Acceleration methods
  - Nonlinear GMRES
  - Objective acceleration
- Derivative-free methods
  - Nelder-Mead
  - Stochastic annealing
  - Particle swarm
- Interval bound univariate methods



- Brent's method
- Golden-section search

The derivative based methods use line searches to assist convergence. Multiple line search algorithms are available, including interpolating backtracking and methods that aim to satisfy the Wolfe conditions.

### Usage in research and industry

The optimization routines in this package have been used in both industrial and academic contexts. For example, parts of the internal work in the company Ternary Intelligence Inc. (Parmanour 2017) rely on the package. Notably, an upcoming book on optimization (Kochenderfer and Woolden Forthcoming, 2018) uses *Optim* for its examples. *Optim* has been used for a wide range of applications in academic research, including optimal control (Riseth, Dreyman, and Farmer 2017; Riseth 2017a), parameter estimation (Riseth and Taylor-King 2017; Bakasiewicz and Nie 2017; and Dany, He, and Stumpf 2018), quantum physics (Dams, Levitt, and Lin 2018), crystalline modelling (Chen and Ortner 2017; Braun, Buzs, and Ortner 2017), and the large-scale astronomical cataloguing project Cosmo (Rogier et al. 2015; Rogier et al. 2016). A new acceleration scheme for optimization (Riseth 2017b), and a preconditioning scheme for geometry optimization (Puckwood et al. 2016) have also been tested within the *Optim* framework.

### Acknowledgements

John Myklo White initiated the development of the *Optim* code base in 2012. We owe much to him and Timothy Holy for creating a solid package for optimization that the rest of the Julia community could further improve upon. We would also like to thank everyone who has contributed with code and discussions to help improve the package. In particular, Antoine Levitt, Christoph Ortner, and Chris Bakasiewicz have been helpful in providing suggestions and code contributions towards more modularity and greater support for non-trivial inputs and decision spaces.







### Funding

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### References

- Breneman, Jeff, Alan Edelman, Stefan Karpinski, and Viral B Shah. 2017. "Julia: A Fresh Approach to Numerical Computing." *SIAM Review* 59 (1). SIAM: 65–98. <https://doi.org/10.1137/13S086871>.
- Bram, Julius, Macing Buzs, and Christoph Ortner. 2017. "The Effect of Crystal Symmetry on the Locality of Screw Dislocation Cores." *arXiv Preprint arXiv:1710.07708*.
- Chen, Huijie, and Christoph Ortner. 2017. "QM/MM Methods for Crystalline Defects. Part 2: Consistent Energy and Force-Mixing." *Multiscale Modeling & Simulation* 15 (1). SIAM: 184–214. <https://doi.org/10.1137/15M1041259>.
- Dams, A., A. Levitt, and L. Lin. 2018. "Variational formulation for Wannier functions with entangled band structures." *ArXiv E-Prints*, January.

# joss.00615 editorial process

- Submission received 
  - Submission form 
- Referee report 
- Revision 
- Acceptance 
- Publication 

# JOSEcon Fundamental principles

- Open source + open access
- Multilingualism, including proprietary languages
- Open reviewing process with objective publication criteria
- Novelty in implementation rather than method

Draft of the JOSEcon project charter [↗](#)

# JOSEcon Publication criteria

## Necessary conditions

- Code documentation
- Proper coding style
- Illustrative examples
- Open source license

## Good to have

- Public repository (where updates will appear)
- Unit tests, continuous integration, etc.

# JOSEcon Advisory board

- 1 Christopher Carroll
- 2 John Stachurski
- 3 John Rust
- 4 Felix Kubler
- 5 Serguei Maliar

# Where we are

## Years prior to 2018

The idea of publishing economics code discussed by Chris Carroll and others

## 2018

Discussions and collection of thoughts and opinions from various target groups

## 2019

Setting up and testing the infrastructure  
Start production by the end of the year



# Thank you!

