



Universidade do Minho Escola de Ciências

Introduction to the **Julia** programming language

Bruno Amorim



Disclaimer:

I am a bad programmer (in python, C and Fortran)
I am slightly better with Julia



- **Easy** languages to write code:
 - Python
 - Mathematica
 - Matlab

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But slow!



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- C
- C++

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 - ...

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Fast languages:

- Fortran
- C
- C++
- ...

But hard!



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Compromise:

- 1) Prototype in easy language
- 2) When performance becomes critical, rewrite parts/whole code in fast language



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- Mathematica
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But slow!



Fast languages:

- Fortran
- C
- C++

But hard! (XX)

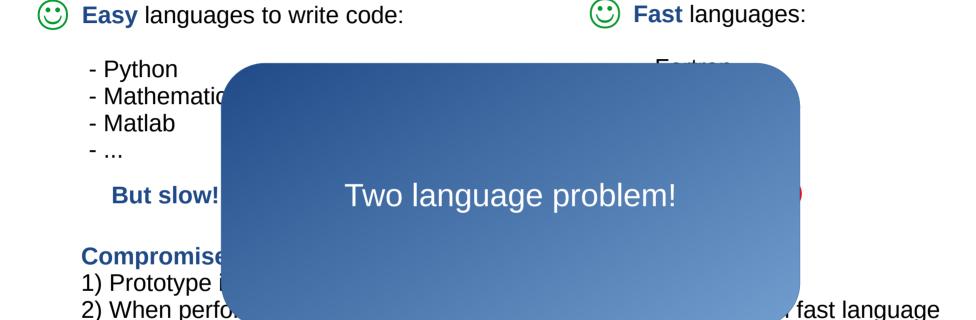


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- 1) Prototype in easy language
- 2) When performance becomes critical, rewrite parts/whole code in fast language

Problems:

- Duplication of effort
- Need to learn two languages or fast parts become a blackbox!



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" Why We Created Julia



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So what is Julia?

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New language: 1st public realease in 2012, stable 1.0 version in 2018 Current version: 1.6.0 (released yesterday!) Initially development at MIT:

- Julia: A Fast Dynamic Language for Technical Computing, arXiv:1209.5145 Jeff Bezanson, Stefan Karpinski, Viral B. Shah, Alan Edelman
- Julia: A Fresh Approach to Numerical Computing, arXiv:1411.1607 Jeff Bezanson, Alan Edelman, Stefan Karpinski, Viral B. Shah
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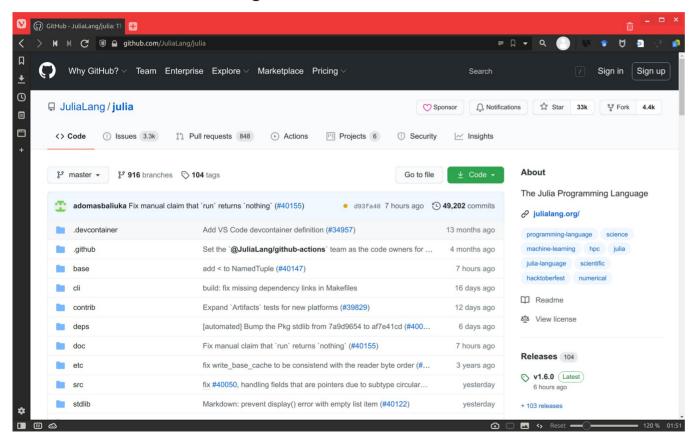
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 Jeff Bezanson
- Open source
- Solves the two language problem
- Interactive
- High performance
- Simple syntax
- Aimed at scientific computing

Open source

source code hosted on github

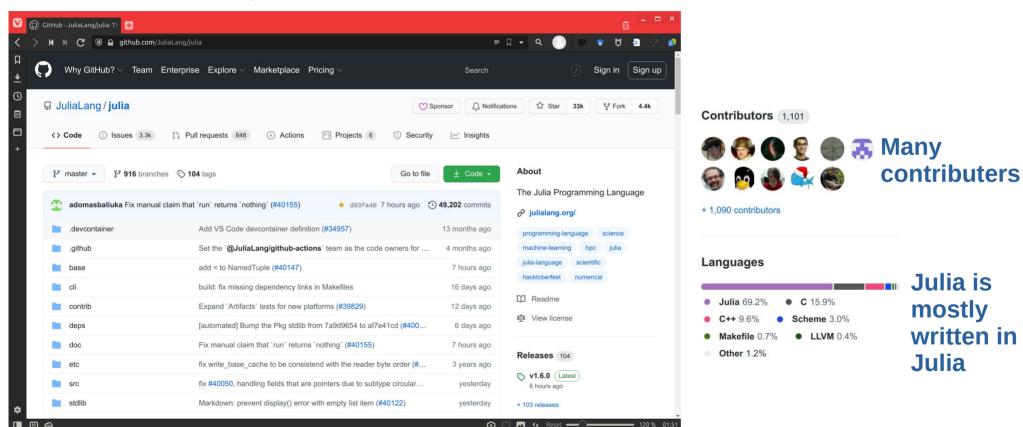
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This is true for most packages!

Solving the two language problem

Julia packages are mostly written in Julia

Solving the two language problem

11 Pull requests

Actions

<> Code

Issues 110

| Projects

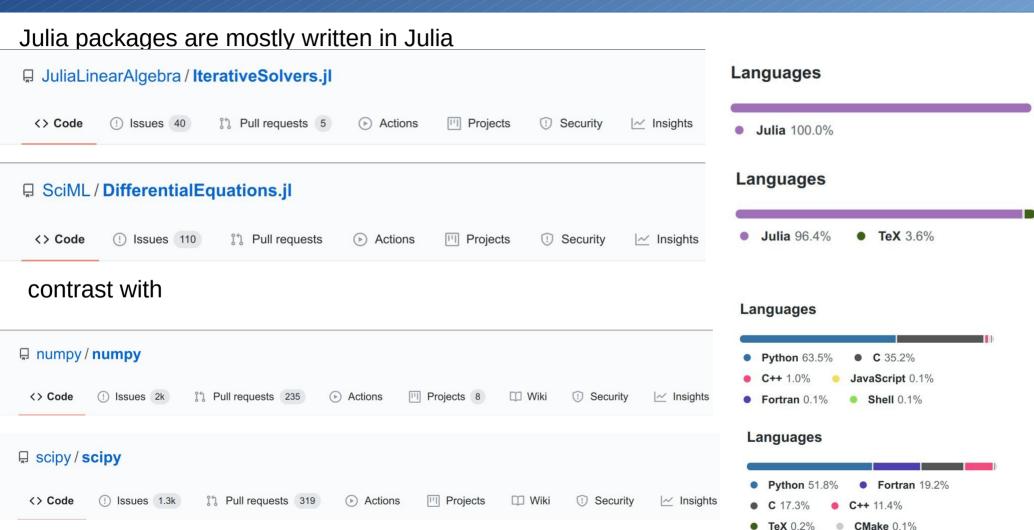
(!) Security

// Insights

Julia 96.4%

TeX 3.6%

Solving the two language problem





Julia is an interactive language

REPL (Read Eval Print Loop shell)

```
Ficheiro Editar Ver Favoritos Configuração Ajuda

-: julia

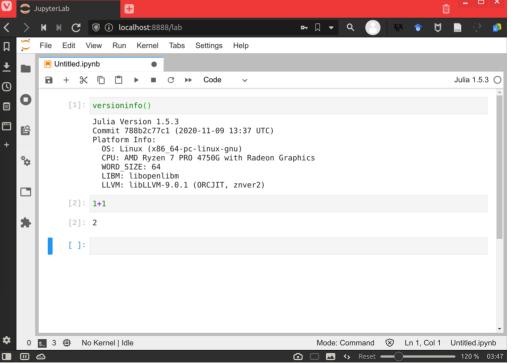
-: jul
```

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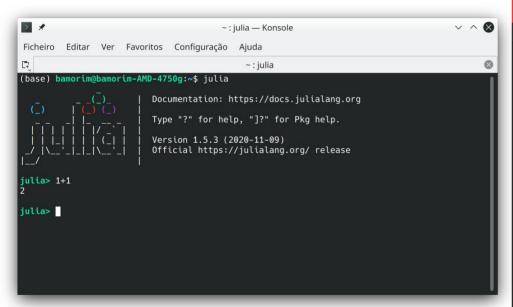




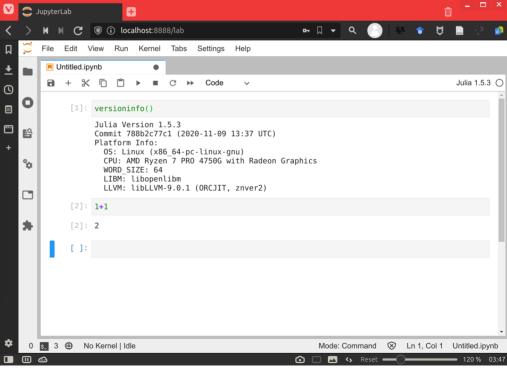


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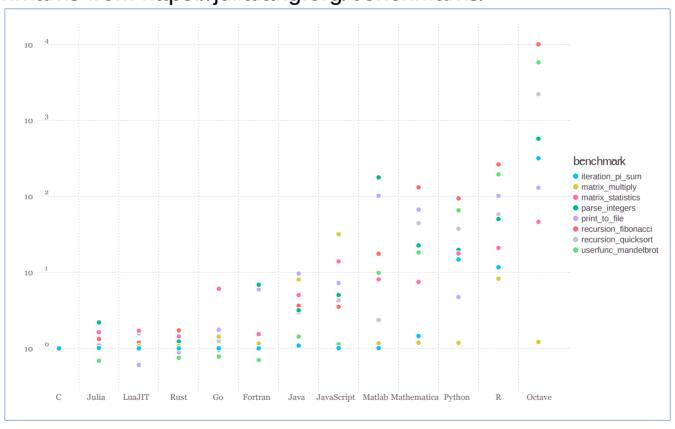






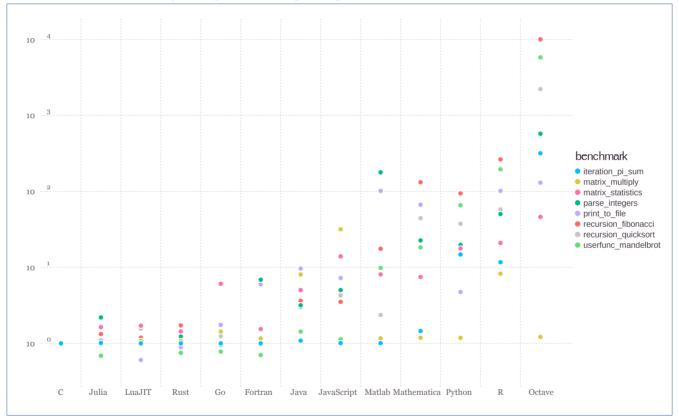
Julia is a high performance language

Julia microbenchmarks from https://julialang.org/benchmarks/



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Julia is actually a compiled language!
It uses LLVM (same backend as the Clang C compiler)

Let us define a function that returns a rotation by an angle that is a multiple of 2pi/6:

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Python code:

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Julia code:

```
c6rotation(n) = [
cos(2\pi*n/6) - sin(2\pi*n/6);
sin(2\pi*n/6) cos(2\pi*n/6)
]
```

Python code:

```
import numpy as np

def c6rotation(n):

    return np.array([
        [np.cos(2*np.pi*n/6), -np.sin(2*np.pi*n/6)],
        [np.sin(2*np.pi*n/6), np.cos(2*np.pi*n/6)]
])
```

Maybe this sparked your interest

But you might be asking:

"Is anyone using Julia?"

Julia adoption

Julia adoption

Julia adoption evolution between 1st Jan 2020 and 1st Jan 2021:

	Total Cumulative as of Jan 1, 2020	Total Cumulative as of Jan 1, 2021	Change
Number of Julia Downloads (JuliaLang + Docker + JuliaPro)	12,950,630	24,205,141	+87%
Number of Julia Packages	2,787	4,809	+73%
GitHub stars (Julia language repo + registered packages)	99,830	161,774	+62%
YouTube views (Julia language channel)	1,562,223	3,320,915	+113%
Published citations of Julia: A Fast Dynamic Language for Technical Computing (2012) + Julia: A Fresh Approach to Numerical Computing (2017)	1,680	2,531	+51%
Discourse posts	137,399	211,888	+54%
TIOBE Index Rank	#47	#23	+24

from: https://juliacomputing.com/blog/2021/01/newsletter-january/

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From https://juliacomputing.com:

JULIA USERS AND JULIA COMPUTING CUSTOMERS

































































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JULIA USERS AND JULIA COMPUTING CUSTOMERS

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Covid?





























































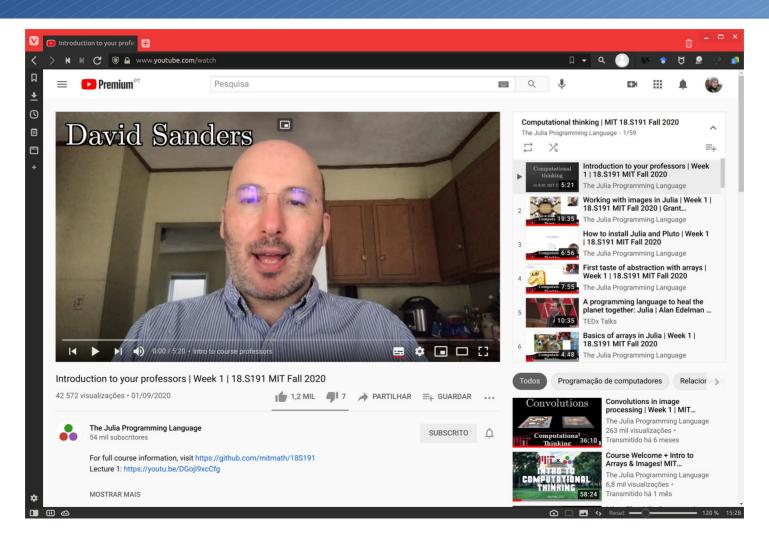




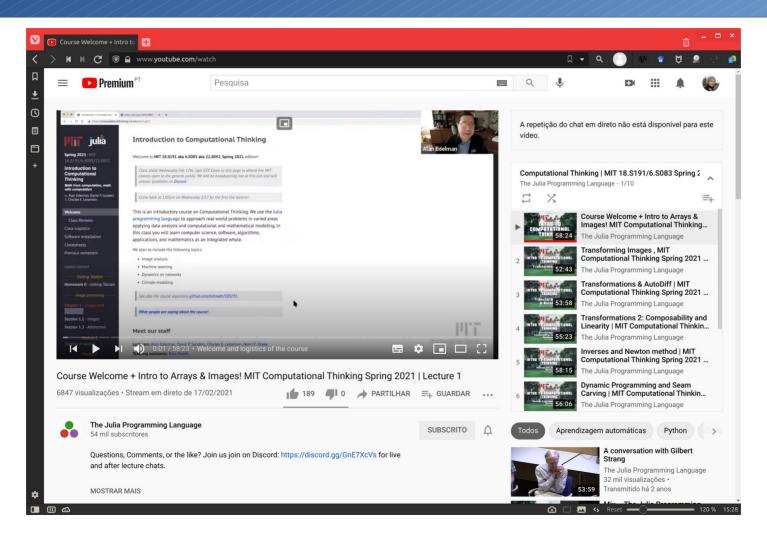
Most importantly:

Julia is being taugh at universities!

Julia course at MIT



Julia course at MIT



Julia course at MIT

It is being taught for some time:

- Massachusetts Institute of Technology (MIT)
 - o 6.251 / 15.081, Introduction to Mathematical Programming (Prof. Dimitris J. Bertsimas), Fall 2015
 - o 18.06, Linear Algebra: Fall 2015, Dr. Alex Townsend; Fall 2014, Prof. Alexander Postnikov; Fall 2013, Prof. Alan Edelman
 - 18.303, Linear Partial Differential Equations: Analysis and Numerics (Prof. Steven G. Johnson), Fall 2013–2016.
 - o 18.337 / 6.338, Numerical Computing with Julia (Prof. Alan Edelman). Fall 2015 (IJulia notebooks). Fall 2013-
 - 18.085 / 0851, Computational Science And Engineering I (Prof. Pedro J. Sáenz)
 - 18.330, Introduction to Numerical Analysis (Dr. Homer Reid), Spring 2013–2015
 - 18.335, Introduction to Numerical Methods (Prof. Steven G. Johnson), Fall 2013, Spring 2015
 - 18.338, Eigenvalues Of Random Matrices (Prof. Alan Edelman), Spring 2015
 - o 18.S096, Performance Computing in a High Level Language (Steven G. Johnson, Alan Edelman, David Sanders, Jeff Bezanson), January 2017.
 - 15.093 / 6.255, Optimization Methods (Prof. Dimitris Bertsimas and Dr. Phebe Vayanos), Fall 2014
 - 15.S60, Software Tools for Operations Research (lain Dunning), Spring 2014
 - 15.083, Integer Programming and Combinatorial Optimization (Prof. Juan Pablo Vielma), Spring 2014

From: https://julialang.org/learning/classes/

Julia in other universities:

From: https://julialang.org/learning/



For a more detailed list: https://julialang.org/learning/classes/

Projects using Julia: Celeste project

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Project to catalog Sloan Digital Sky Survey

- processed ~ 178 terabytes of data in 14.6 minutes
- peak performance: 1.54 petaflops
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For more info:

- https://juliacomputing.com/case-studies/celeste/
- https://youtu.be/uecdcADM3hY
- https://github.com/jeff-regier/Celeste.jl



JuliaCon 2017 | Celeste.jl: Petascale Computing in Julia | Prabhat, Regier & Fischer

Projects using Julia: Clima project

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New climate model built from the ground up in Julia

Research consurtium:

- Caltech
- MIT
- Naval Postgraduate School
- Jet Propulsion Laboratory

https://clima.caltech.edu



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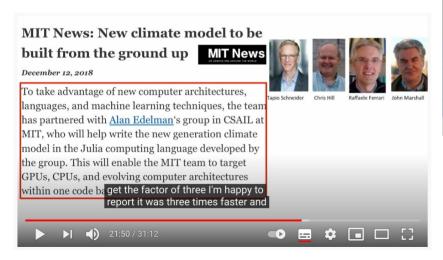
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https://clima.caltech.edu

Where OK with a 3x slowdown. Ended up being 3x faster!

https://youtu.be/nwdGsz4rc3Q?t=1238 https://www.hpcwire.com/2020/01/14/julia-programmings-dramatic-rise-in-hpc-and-elsewhere/

- Iterative Linear Solvers: IterativeSolvers.jl, KrylovKit.jl
- Eigensolvers: ArnoldiMethod.jl, KrylovKit.jl
- **Differential equations:** DifferentialEquations.jl
- Integration: QuadGK.jl, FastGaussQuadrature.jl, Quadrature.jl
- Optimization: Optim.jl, JuMP.jl
- Plotting: Plots.jl, Pyplot.jl, Vegalite.jl, Makie.jl, Gadfly.jl
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Physics related packages:

- Tensor Networks: Itensors.jl
- Quantum Computing: Yao.jl
- Quantum optics: QuantumOptics.jl
- DFT: DFTK.jl
- Quantum Monte Carlo: MonteCarlo.jl
- Tight-binding: Quantica.jl

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You can search for more using:

- juliahub.com/ui/Packages
- juliaobserver.com/packages
- just use google

More resources to learn about julia

- Julia page: julialang.org
- Julia documentation: docs.julialang.org
- Julia forum: discourse.julialang.org
- Julia youtube channel: www.youtube.com/user/JuliaLanguage/playlists

More tutorials and books are listed in julialang.org/learning