

**MOJO** 🔥

**A NEW HOPE FOR AI ?**

**MOJO** 🔥

**THE NEXT AI LANGUAGE ?**



The image shows two men in a room. The man on the left is wearing a dark suit and tie, looking towards the right. The man on the right is wearing a dark polo shirt, gesturing with his hands. In the center, a tablet device displays a blue screen with a yellow double-headed arrow logo followed by the word "python" and the version number "4.0".

python  
4.0

CONCLUSION

Use Case

Value Proposition

AI in 2024

What is  
The current language of  
AI ?

# C3-GPTo ADVISOR

L'IA, ou intelligence artificielle, peut être développée et programmée dans différents langages de programmation. Certains des langages les plus couramment utilisés pour créer des systèmes d'IA incluent Python, Java, C++, et R, entre autres. Python est particulièrement populaire dans le domaine de l'IA en raison de sa simplicité, de sa flexibilité, de sa large gamme de bibliothèques et de frameworks dédiés à l'IA (comme TensorFlow, PyTorch, scikit-learn, etc.), et de sa communauté active de développeurs.



# STACKOVERFLOW ADVISOR



## 2023 Developer Survey

In May 2023 over 90,000 developers responded to our annual survey about how they learn and level up, which tools they're using, and which ones they want.

[Read the overview →](#)

[Methodology →](#)

**Overview**

**Developer Profile**

**Technology**

**AI**

**Work**

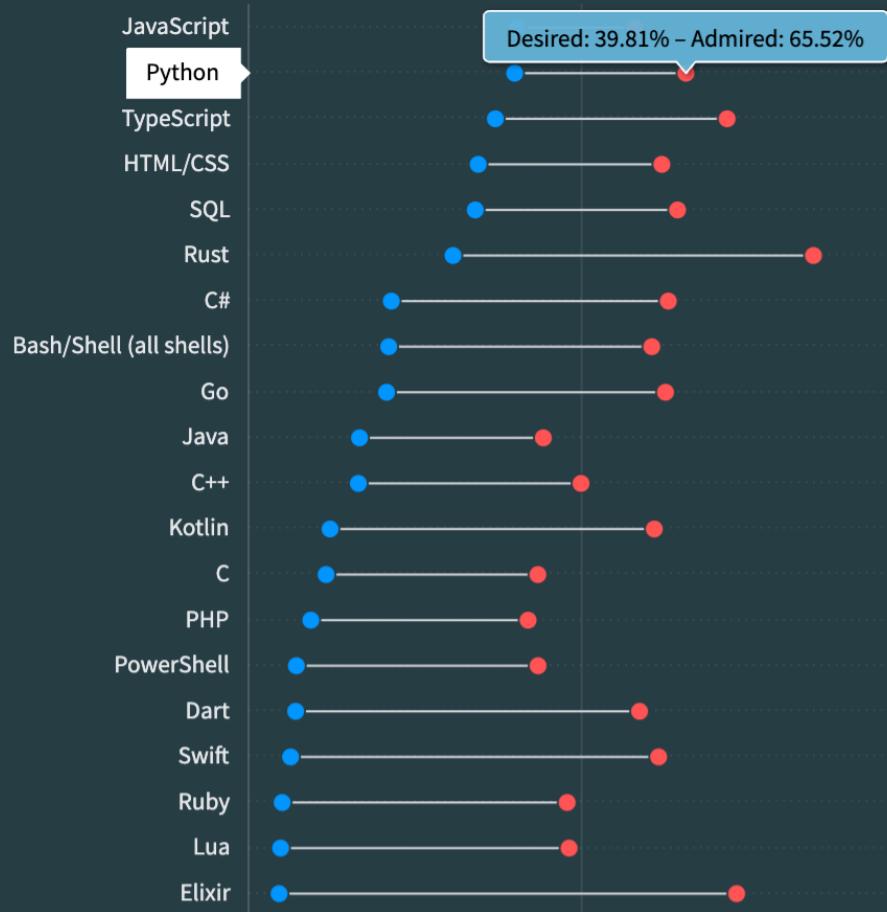
**Community**

**Professional Developers**

**Methodology**

# STACKOVERFLOW ADVISOR

87,510 responses



## Overview

## Developer Profile

## Technology

Most popular technologies

Admired and Desired

Worked with vs. want to work with

Top paying technologies

## AI

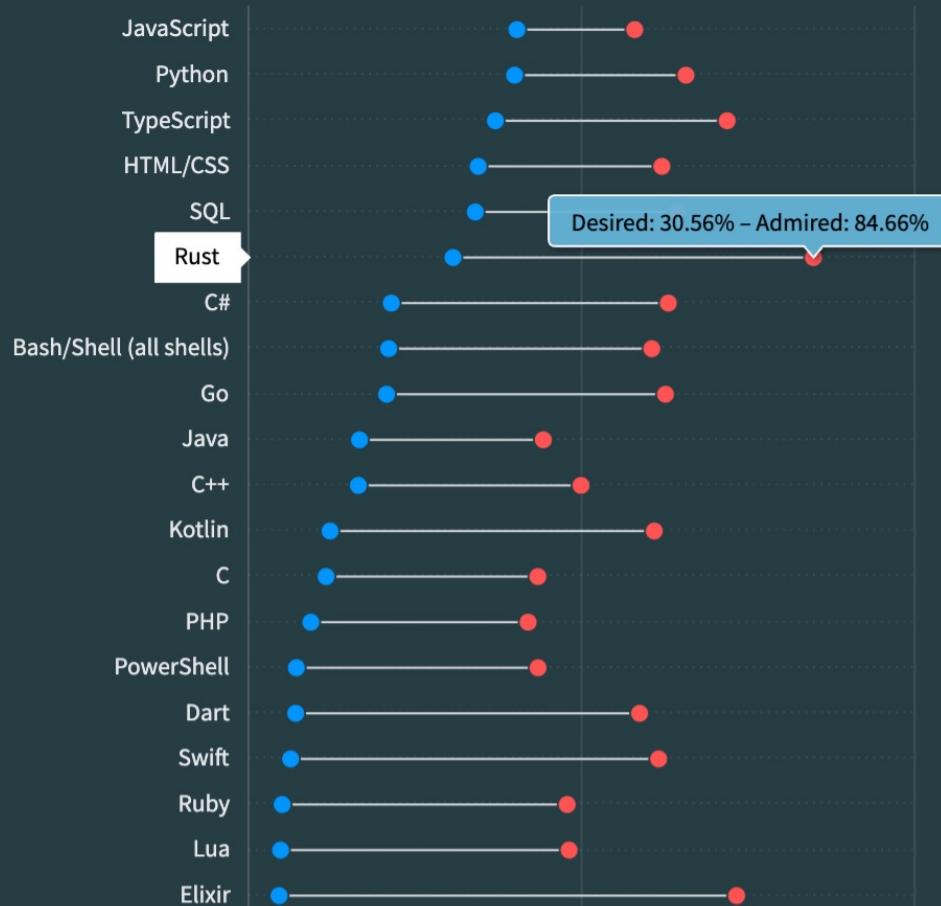
## Work

## Community

Professional Development

# STACKOVERFLOW ADVISOR

87,510 responses



## Overview

## Developer Profile

## Technology

Most popular technologies

Admired and Desired

Worked with vs. want to work with

Top paying technologies

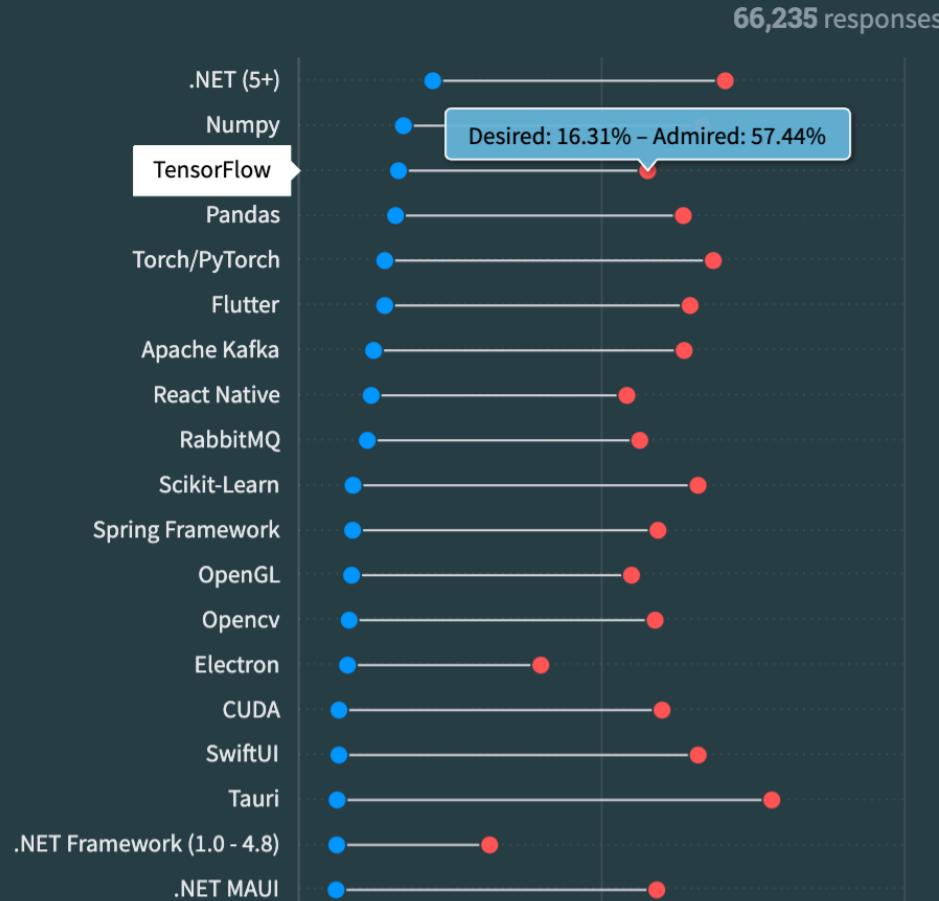
## AI

## Work

## Community

Professional Development

# STACKOVERFLOW ADVISOR



## Overview

## Developer Profile

## Technology

Most popular technologies

Admired and Desired

Worked with vs. want to work with

Top paying technologies

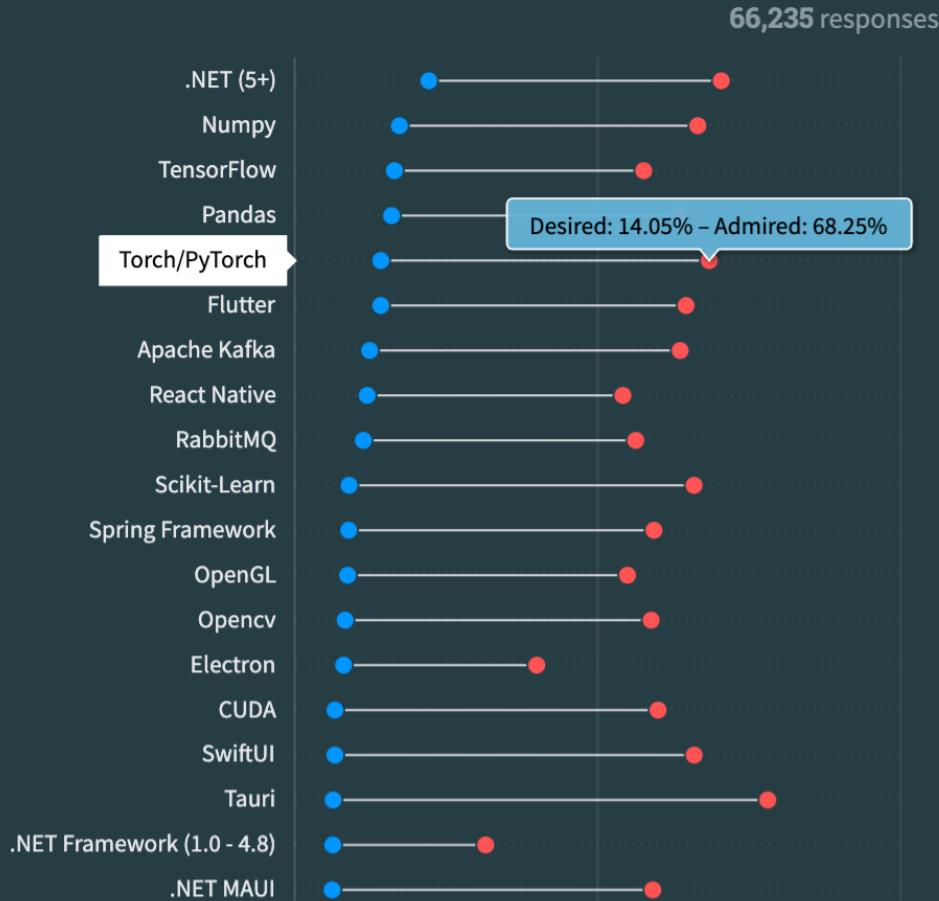
## AI

## Work

## Community

Professional Development

# STACKOVERFLOW ADVISOR



## Overview

## Developer Profile

## Technology

Most popular technologies

Admired and Desired

Worked with vs. want to work with

Top paying technologies

## AI

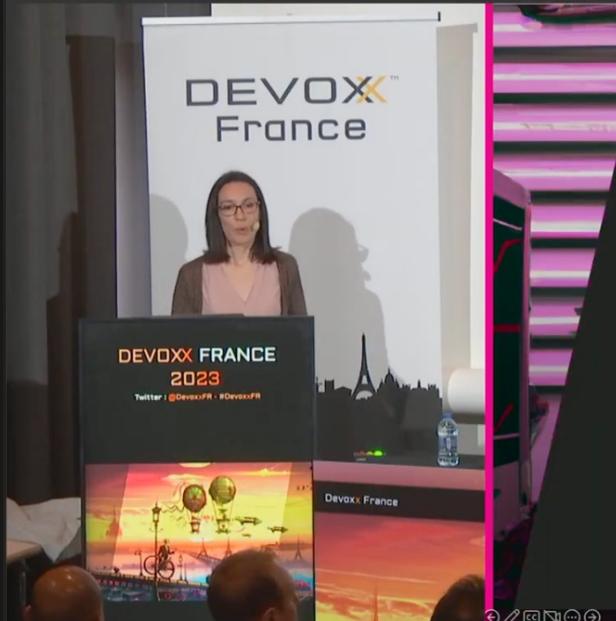
## Work

## Community

Professional Development

# HOW TO CHOOSE A FRAMEWORK?

DEVOXX FRANCE 2023  
11<sup>e</sup> Édition - 12 AU 14 AVRIL 2023



Devoxx France 2023

## Deep learning en Python : comment choisir un framework ?

Justine Bel-Létoile  
HelloWork

jeudi 13 avril 2023

@Devoxxfr



<https://www.youtube.com/watch?v=k4Tfg6-7cyQ>

# AI PROGRAMMING LANDSCAPE

Model



System



Hardware

CUDA, OpenCL, ROCm

NEW  
KID IN  
TOWN!

Mojo 🔥  
02/05/2023

# MOJO IS BORN!

Modular

Contact sales Sign In Menu



BLOG / COMPANY

## The future of AI depends on Modularity

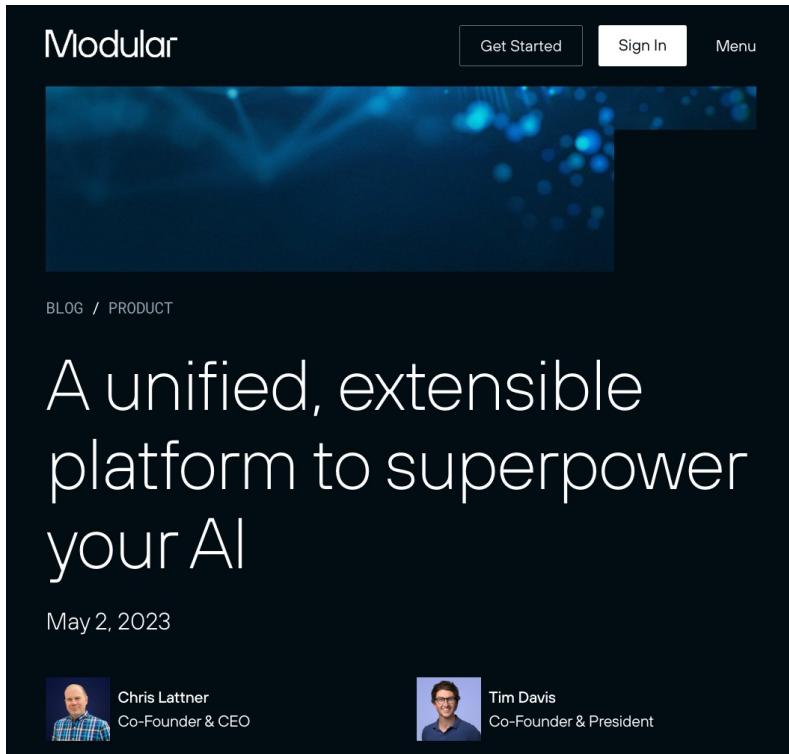
April 26, 2022

 Chris Lattner  
Co-Founder & CEO

 Tim Davis  
Co-Founder & President

<https://www.modular.com/blog/the-future-of-ai-depends-on-modularity>

# Mojo IS BORN!

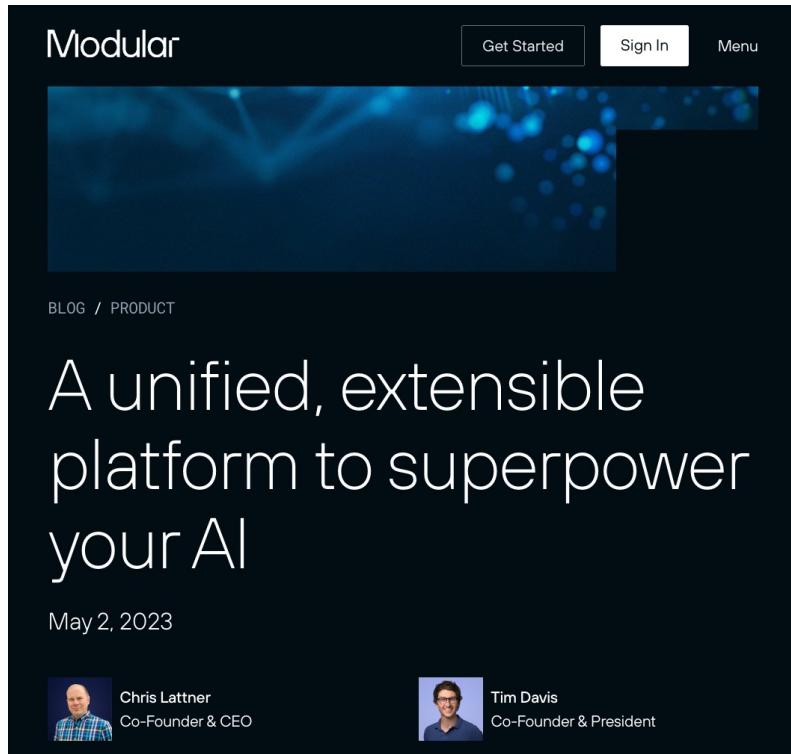


The screenshot shows the Modular website homepage. At the top, there's a dark header with the word "Modular" in white. To the right are three buttons: "Get Started", "Sign In", and "Menu". Below the header is a large, dark blue banner with abstract light patterns. Underneath the banner, the text "BLOG / PRODUCT" is displayed. The main content area features a large, white, sans-serif font that reads: "A unified, extensible platform to superpower your AI". At the bottom left, the date "May 2, 2023" is shown. At the bottom right, there are two small profile pictures with names: "Chris Lattner Co-Founder & CEO" and "Tim Davis Co-Founder & President".

# Modular Accelerated eXecution platform

<https://www.modular.com/blog/a-unified-extensible-platform-to-superpower-your-ai>

# MOJO IS BORN!



The screenshot shows the Modular website homepage. At the top, there's a dark header with the word "Modular" in white. Below it is a large, dark blue banner with abstract light patterns. In the top right corner of the banner are three buttons: "Get Started", "Sign In", and "Menu". Below the banner, the text "BLOG / PRODUCT" is visible. The main title "A unified, extensible platform to superpower your AI" is centered in a large, white, sans-serif font. At the bottom left, the date "May 2, 2023" is shown. At the bottom right, there are two small profile pictures with names: "Chris Lattner Co-Founder & CEO" and "Tim Davis Co-Founder & President".

- Member of the python family (superset of python)
- Support modern chip architectures (thanks to MLIR)
- Predictable low level performance

# MOJO IS BORN!



## Chris Lattner

- 2000 beginning of the project LLVM
- 2003 release of LLVM 1.0
- 2007 release of CLang 1.0
- 2008 XCode 3.1
- 2011 Clang replace gcc on macos
- 2014 release of Swift 1.0
- G 2018 beginning of the MLIR
- 2022 creation of Modular cie
- 2023 🔥

# MOJO IS BLAZING FAST!

Modular

Contact sales Sign In Menu



BLOG / DEVELOPER

## How Mojo🔥 gets a 35,000x speedup over Python – Part 1

August 18, 2023

 Abdul Dakkak  
AI Compiler Engineer

<https://www.modular.com/blog/how-mojo-gets-a-35-000x-speedup-over-python-part-1>



# MOJO IS BLAZING FAST!



The screenshot shows the Modular website's blog section. At the top, there's a navigation bar with 'Modular' on the left, and 'Contact sales', 'Sign In', and 'Menu' buttons on the right. Below the navigation is a large image of a road at night with blurred lights. Underneath the image, the text 'BLOG / DEVELOPER' is visible. The main title of the post is 'How Mojo🔥 gets a 35,000x speedup over Python – Part 1'. Below the title is the date 'August 18, 2023'. At the bottom left is a photo of a man and his name 'Abdul Dakkak' with the title 'AI Compiler Engineer'.

Modular

Contact sales Sign In Menu

BLOG / DEVELOPER

## How Mojo🔥 gets a 35,000x speedup over Python – Part 1

August 18, 2023

Abdul Dakkak  
AI Compiler Engineer

<https://www.modular.com/blog/how-mojo-gets-a-35-000x-speedup-over-python-part-1>

## Changelog

2022/01 incorporation

2022/07 seed round (30 M\$)

2023/05 announce MAX & Mojo

2023/08 serie B (100 M\$)

🐧 2023/09 release mojo 0.2.1

🍎 2023/10 release mojo 0.4.0

..

2024/01 release mojo 0.7.0

2024/02 release MAX & mojo 24.1

🍎 2024/06 release MAX & mojo 24.4

# MOJO IS BLAZING FAST!

Modular

Contact sales Sign In Menu



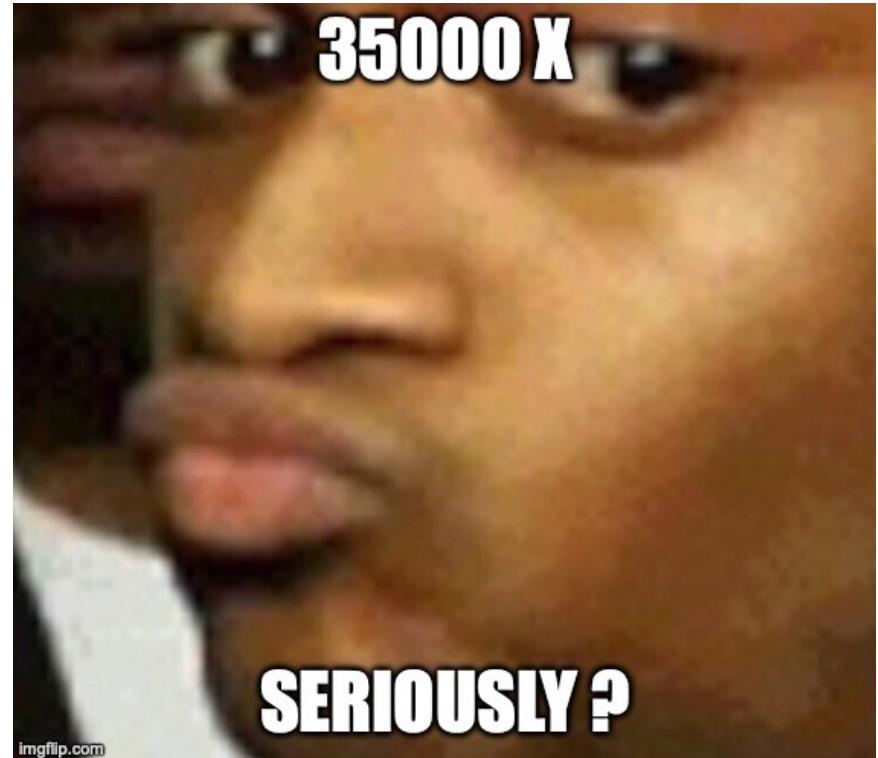
BLOG / DEVELOPER

## How Mojo🔥 gets a 35,000x speedup over Python – Part 1

August 18, 2023

 Abdul Dakkak  
AI Compiler Engineer

<https://www.modular.com/blog/how-mojo-gets-a-35-000x-speedup-over-python-part-1>



# PERFORMANCE MATTERS!

## Performance matters :

- for our users

PERFORMANCE MATTERS!

Your resume is being processed



# PERFORMANCE MATTERS!

Performance matters :

- for our users
- for (artificial) intelligence

# PERFORMANCE MATTERS!

CodinGame<sup>®</sup>  
by CoderPad

ÉVÉNEMENTS SOLO MULTI COMMUNAUTÉ

Rechercher

SE CONNECTER S'INSCRIRE

**ABALONE**  
Par DomiKo

97 CodinGamers dans l'arène de Abalone

Approuvé par trictrac, field3, VulpesCorsac

REJOINDRE

DÉTAILS CLASSEMENT DISCUSSIONS PARTAGER

Monde

Rechercher un ami, une école, ...

Ligue CodinGamer Langage Score École / Entreprise Pays

Rank	User	Level	Score	University / Company	Country
1	trictrac	C	46,24	Centrale Lille / Thales	FR
2	LeRenard	C++	44,24	N/A	FR
3	MuddySneakers	Rust	42,74	Cornell University - Ithaca, NY	US
4	EricSMSO	C++	42,70	Ensimag - Grenoble INP	FR
5	KaluTheFrog	C	36,68	ISAE-ENSMA / Mensa France	FR
6	Benoit_Belasco	Python 3	34,11	FANB - Monaco-Ville / Mensa France	FR
7	field3	Python 3	31,26	Chiba University - Chiba-shi / freelance	JP
8	_Royale	C++	30,96	N/A	FR

# PERFORMANCE MATTERS!

## Performance matters :

- for our users
- for (artificial) intelligence
- for the planet

# PERFORMANCE MATTERS!

## Ranking Programming Languages by Energy Efficiency

Rui Pereira<sup>a,b</sup>, Marco Couto<sup>c,b</sup>, Francisco Ribeiro<sup>c,b</sup>, Rui Rua<sup>c,b</sup>, Jácome Cunha<sup>c,b</sup>, João Paulo Fernandes<sup>d</sup>, João Saraiva<sup>c,b</sup>

<sup>a</sup>C4 — Centro de Competências em Cloud Computing (C4-UBI), Universidade da Beira Interior, Rua Marquês d'Ávila e Bocage, 6200-001, Covilhã, Portugal

<sup>b</sup>HASLab/INESC TEC, Portugal

<sup>c</sup>Universidade do Minho, Portugal

<sup>d</sup>Departamento de Engenharia Informática, Faculdade de Engenharia da Universidade do Porto & CISUC, Portugal

### Abstract

This paper compares a large set of programming languages regarding their efficiency, including from an energetic point-of-view. Indeed, we seek to establish and analyze different rankings for programming languages based on their energy efficiency. The goal of being able to rank programming languages based on their energy efficiency is both recent, and certainly deserves further studies. We have taken rigorous and strict solutions to 10 well defined programming problems, expressed in (up to) 27 programming languages, from the well known Computer Language Benchmark Game repository. This repository aims to compare programming languages based on a strict set of implementation rules and configurations for each benchmarking problem. We have also built a framework to automatically, and systematically, run, measure and compare the energy, time, and memory efficiency of such solutions. Ultimately, it is based on such comparisons that we propose a series of efficiency rankings, based on single and multiple criteria.

Our results show interesting findings, such as how slower/faster languages can consume less/more energy, and how memory usage influences energy consumption. We also present a simple way to use our results to provide software engi-

Email addresses: rui.a.pereira@inesctec.pt (Rui Pereira), marco.l.couto@inesctec.pt (Marco Couto), francisco.j.ribeiro@inesctec.pt (Francisco Ribeiro), rui.a.rua@inesctec.pt (Rui Rua), jacome@di.uminho.pt (Jácome Cunha), jpfd@dei.uc.pt (João Paulo Fernandes), jas@di.uminho.pt (João Saraiva)

	Energy
(c) C	1.00
(c) Rust	1.03
(c) C++	1.34
(c) Ada	1.70
(v) Java	1.98
(c) Pascal	2.14
(c) Chapel	2.18
(v) Lisp	2.27
(c) Ocaml	2.40
(c) Fortran	2.52
(c) Swift	2.79
(c) Haskell	3.10
(v) C#	3.14
(c) Go	3.23
(i) Dart	3.83
(v) F#	4.13
(i) JavaScript	4.45
(v) Racket	7.91
(i) TypeScript	21.50
(i) Hack	24.02
(i) PHP	29.30
(v) Erlang	42.23
(i) Lua	45.98
(i) Ruby	46.54
(i) Ruby	69.91
(i) Python	75.88
(i) Perl	79.58



# MEETUP PYTHON-RENNES

Meetup [Créer un groupe](#)  
- 30 % de réduction !

PRO [Essayer gratuitement](#)

Contacts Messages Notifications

**Python Rennes**

Rennes, France  
339 membres · Groupe public  
Organisé par Nicolas Ledez and 1 other

Partager:

[À propos](#) [Événements](#) [Membres](#) [Photos](#) Vous êtes membre

**De quoi s'agit-il**  
Tu débutes le fourchelangue ou tu le pratiques depuis longtemps ? Retrouve-nous pour échanger autour :

[En savoir plus](#)

**Événements passés (10)** [Tout voir](#)

VEN. 23 FÉVR. 2024, 18:30 CET  
**Python : il buono, il brutto, il cattivo**  
L'événement est passé

**Organizers**  
Nicolas Ledez and 1 other [Message](#)

**Membres (339)** [Tout voir](#)

<https://www.meetup.com/fr-FR/python-rennes/>

YouTube FR

10<sup>ème</sup> EDITION

DATADOG webvert

**Breizh C@mp**  
La conférence à l'Ouest.

**cym**

**L'eco-conception, c'est bien, mais si on parlait un peu du backend ? (Jérémie Drouet, Youen Chéné)**

BreizhCamp 5.06K subscribers [Subscribe](#) 23 Share ...

1K views 1 year ago  
A l'heure actuelle, l'éco-conception des applications web est un domaine qui monte.  
Vous pouvez faire des tests de performance de vos pages web sous diverses conditions.

<https://www.youtube.com/watch?v=gE6HUsmh554>

# PERFORMANCE MATTERS!

## Performance matters :

- for our users
- for (artificial) intelligence
- for the planet

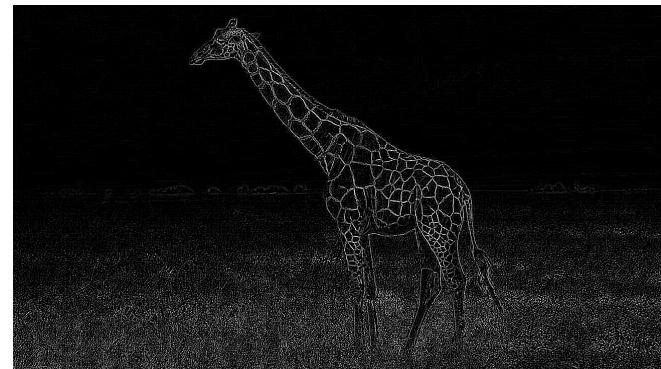
IT'S  
DEMO TIME!

Laplacian filter  
(edge detection)

# EDGE DETECTION



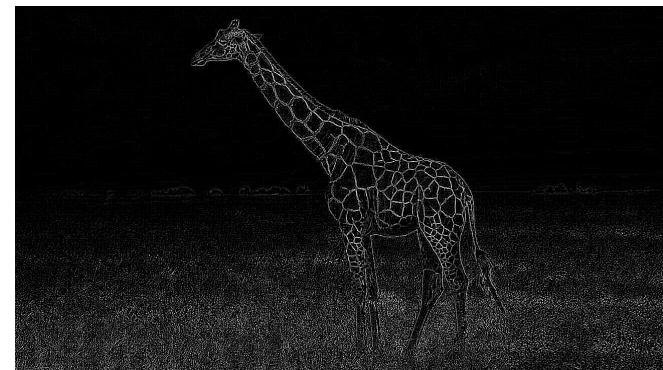
$$\Delta = \nabla^2 = \frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}$$



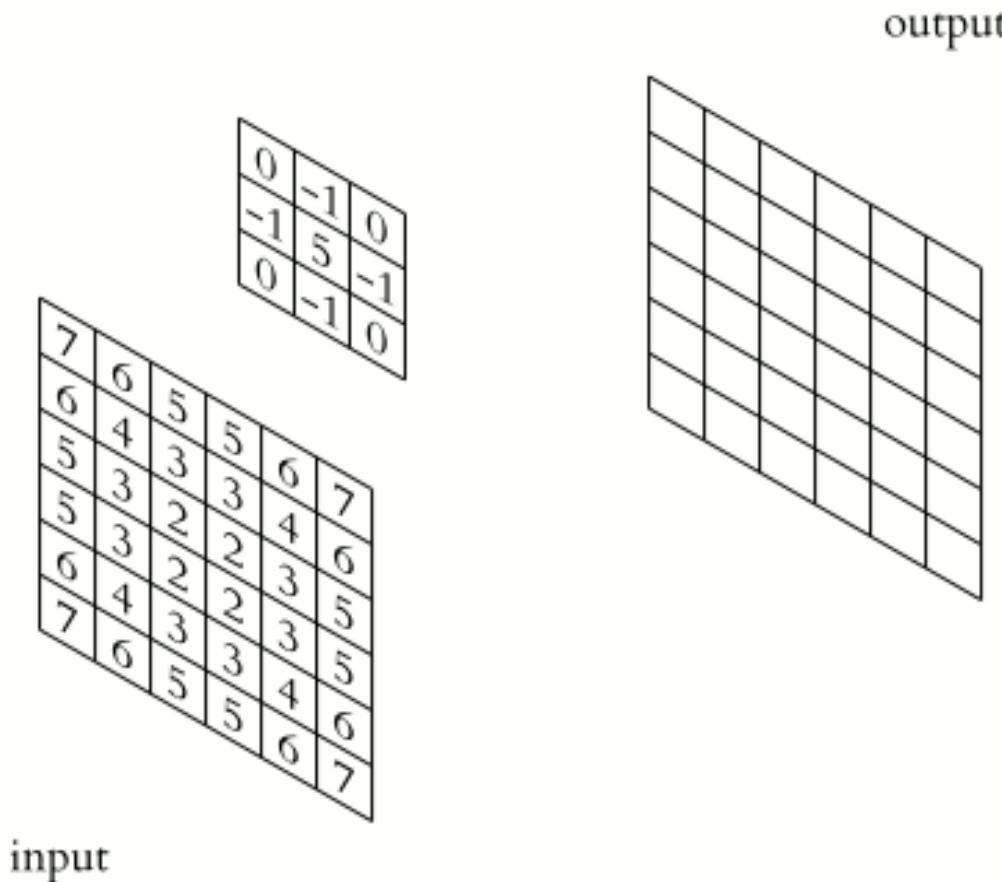
# EDGE DETECTION



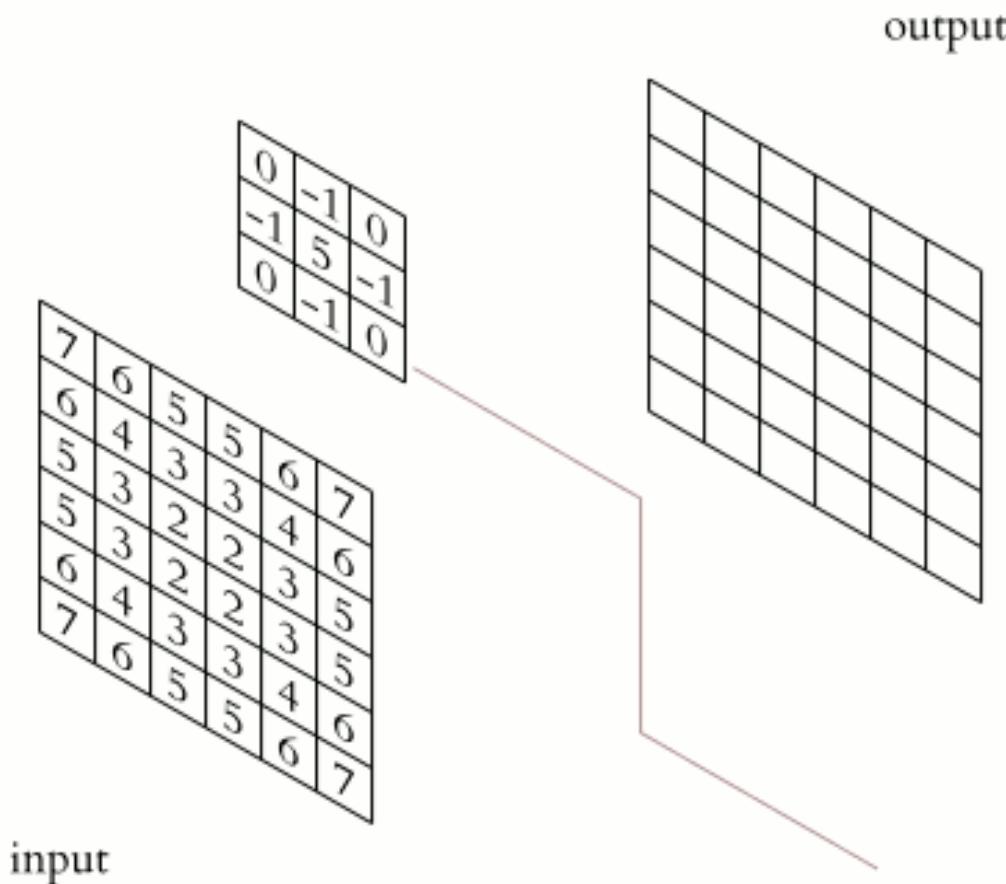
Convolve  $\xrightarrow{\text{kernel}}$

$$\begin{bmatrix} 0 & 1 & 0 \\ 1 & -4 & 1 \\ 0 & 1 & 0 \end{bmatrix}$$


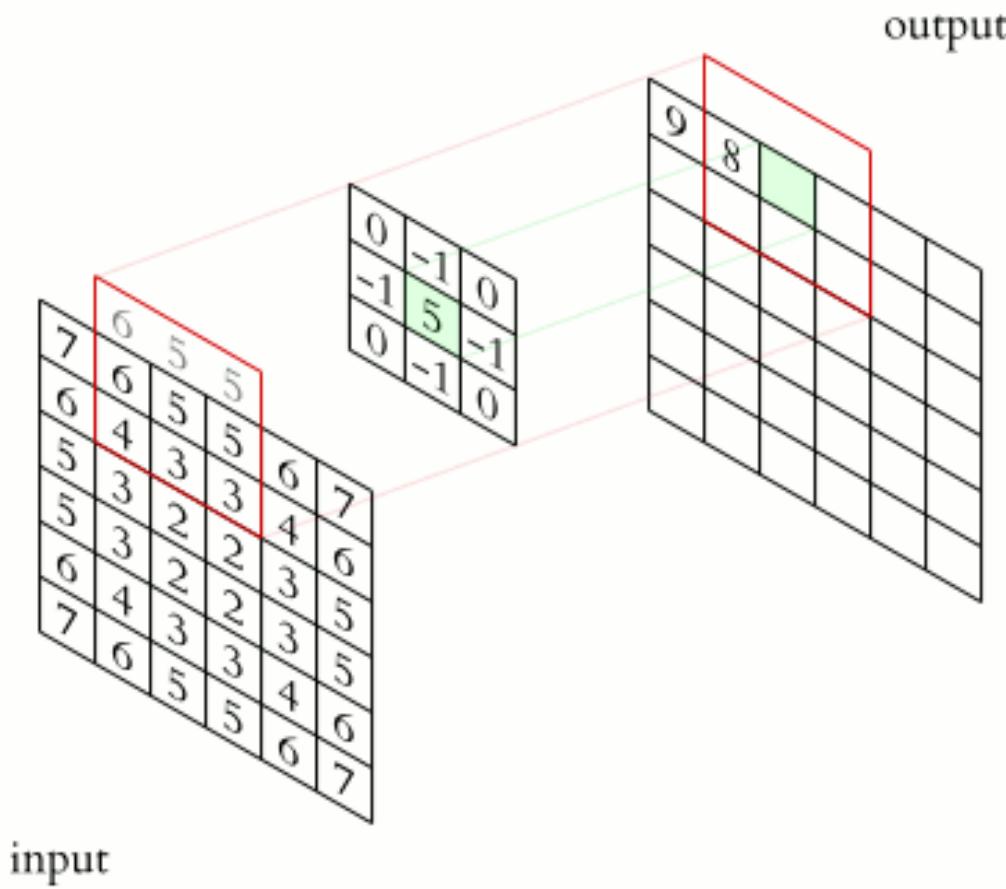
# HOP HOP HOP



# EDGE DETECTION



# EDGE DETECTION



# RECAP

naïve version : 500 ms	
numpy mul : 250 ms	x 2
numpy+numba : 50 ms	x 10
opencv : 0.5 ms	x 1000

And now in mojo ?

# AND NOW IN MOJO!

Modular

Get Started Sign In Menu

cn-2  
cn-1  
cn

Summary statistic

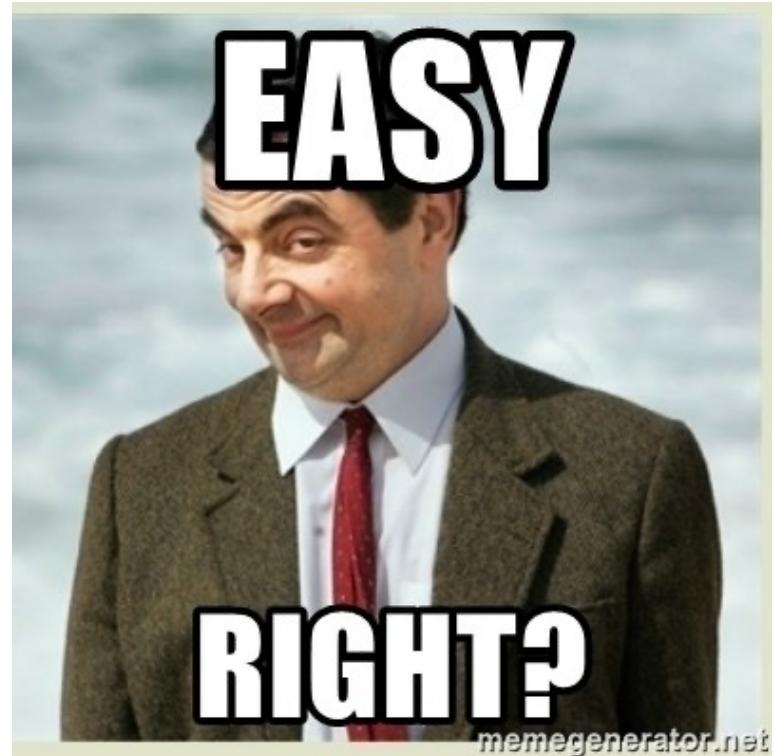
BLOG / DEVELOPER

## Implementing NumPy style matrix slicing in Mojo🔥

November 20, 2023

Shashank Prasanna  
AI Developer Advocate

<https://www.modular.com/blog/implementing-numpy-style-matrix-slicing-in-mojo>



# POWER! UNLIMITED POWER!



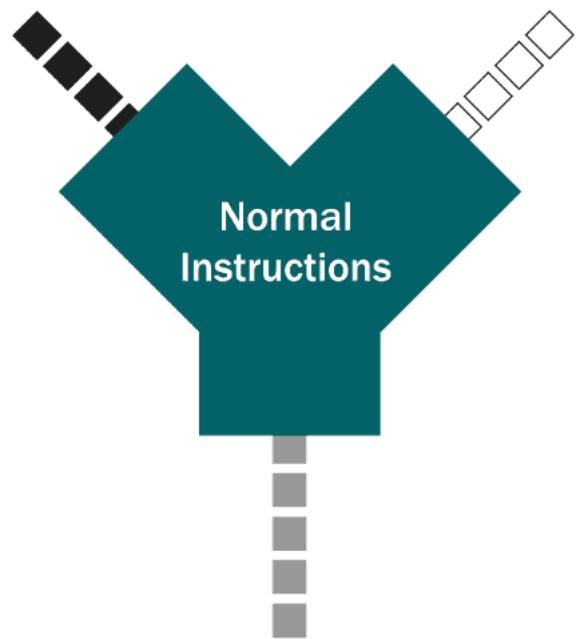
Credits to Georges L. and Corentin R.

*“The greatest teacher, failure is”*

IT'S  
DEMO TIME!

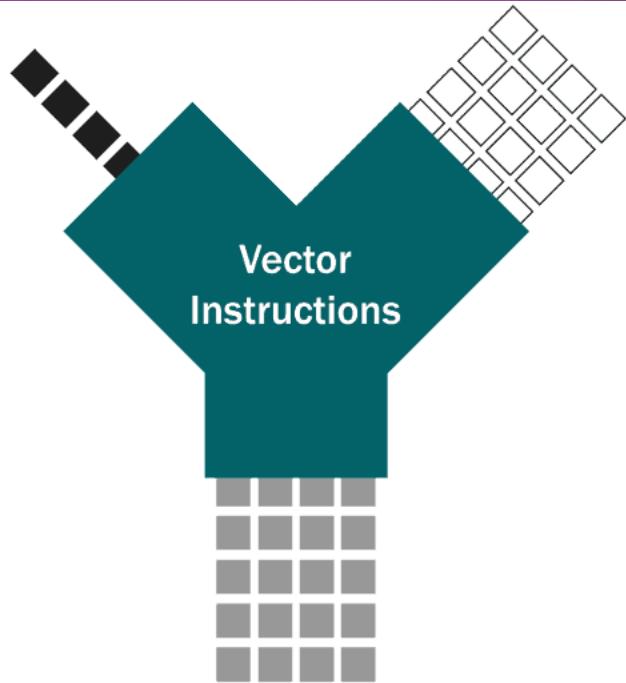
Let's optimize !

# SISD ARCHITECTURE



- Instructions
- Data
- Results

# SIMD ARCHITECTURE



- Instructions
- Data
- Results

# ALGORITHM VECTORIZATION

```
fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:  
    var result = Matrix[DType.float32](img.height, img.width)  
    # Loop through each pixel in the image  
    # But skip the outer edges of the image  
    for y in range(1, img.height-1):  
        for x in range(1, img.width-1):  
            # For each pixel, compute the product elements wise  
            var acc: Float32 = 0  
            for k in range(3) :  
                for l in range(3):  
                    acc += img[y-1+k, x-1+l] * kernel[k, l]  
            # Normalize the result  
            result[y, x] = min(255, max(0, acc))  
    return result
```

# ALGORITHM VECTORIZATION

```
alias nelts = SIMDWidthOf[DType.float32]()
```

```
fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:  
    var result = Matrix[DType.float32](img.height, img.width)  
    # Loop through each pixel in the image  
    # But skip the outer edges of the image  
    for y in range(1, img.height-1):  
        for x in range(1, img.width-1):  
            # For each pixel, compute the product elements wise  
            var acc: Float32 = 0  
            for k in range(3) :  
                for l in range(3):  
                    acc += img[y-1+k, x-1+l] * kernel[k, l]  
            # Normalize the result  
            result[y, x] = min(255, max(0, acc))  
    return result
```

# ALGORITHM VECTORIZATION

```
alias nelts = SIMDWidthOf[DType.float32]()
```

```
fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:  
    var result = Matrix[DType.float32](img.height, img.width)  
    # Loop through each pixel in the image  
    # But skip the outer edges of the image  
    for y in range(1, img.height-1):  
        for x in range(1, img.width-1): nelts:  
            # For each pixel, compute the product elements wise  
            var acc: Float32 = 0  
            for k in range(3) :  
                for l in range(3):  
                    acc += img[y-1+k, x-1+l] * kernel[k, l]  
            # Normalize the result  
            result[y, x] = min(255, max(0, acc))  
    return result
```

# ALGORITHM VECTORIZATION

```
alias nelts = SIMDWidthof[DType.float32]()

fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:
    var result = Matrix[DType.float32](img.height, img.width)
    # Loop through each pixel in the image
    # But skip the outer edges of the image
    for y in range(1, img.height-1):
        for x in range(1, img.width-1, nelts):
            # For each pixel, compute the product elements wise
            # var acc: Float32 = 0
            var acc: SIMD[DType.float32,nelts] = 0
                ...
                for l in range(3):
                    acc += img[y-1+k, x-1+l] * kernel[k, l]
                # Normalize the result
                result[y, x] = min(255, max(0, acc))
    return result
```

# ALGORITHM VECTORIZATION

```
fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:  
    var result = Matrix[DType.float32](img.height, img.width)  
    # Loop through each pixel in the image  
    # But skip the outer edges of the image  
    for y in range(1, img.height-1):  
        for x in range(1, img.width-1, nelts):  
            # For each pixel, compute the product elements wise  
            # var acc: Float32 = 0  
            var acc: SIMD[DType.float32,nelts] = 0  
            for k in range(3) :  
                for l in range(3):  
                    # acc += img[y-1+k, x-1+l] * kernel[k, l]  
                    acc += imgsimd_load[nelts](y-1+k, x-1+l) * kernel[k, l]  
            # result[y, x] = min(255, max(0, acc))  
            resultsimd_store[nelts](y, x, min(255, max(0, acc)))  
    return result
```

# ALGORITHM VECTORIZATION

```
fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:  
    var result = Matrix[DType.float32](img.height, img.width)  
    # Loop through each pixel in the image  
    # But skip the outer edges of the image  
    for y in range(1, img.height-1):  
        for x in range(1, img.width-1, nelts):  
            # For each pixel, compute the product elements wise  
            # var acc: Float32 = 0  
            var acc: SIMD[DType.float32,nelts] = 0  
            for k in range(3) :  
                for l in range(3):  
                    # acc += img[y-1+k, x-1+l] * kernel[k, l]  
                    acc += img SIMD_load[nelts](y-1+k, x-1+l) * kernel[k, l]  
            # Normalize the result  
            # result[y, x] = min(255, max(0, acc))  
            result SIMD_store[nelts](y, x, min(255, max(0, acc)))  
  
    # Handle remaining elements with scalars.  
    for n in range(nelts * (img.width-1 // nelts), img.width-1) :  
        var acc: Float32 = 0  
        for k in range(3) :  
            for l in range(3):  
                acc += img[y-1+k, n-1+l] * kernel[k, l]  
        result[y, n] = min(255, max(0, acc))
```

# ALGORITHM VECTORIZATION

```
alias nelts = SIMDWidthOf[DType.float32]()

fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:
    var result = Matrix[DType.float32](img.height, img.width)
    # Loop through each pixel in the image
    # But skip the outer edges of the image
    for y in range(1, img.height - 1):
        @parameter
        fn dot[nelts: Int](x: Int):
            # For each pixel, compute the product elements wise
            var acc: SIMD[DType.float32, nelts] = 0
            for k in range(3):
                for l in range(3):
                    acc += img SIMD_load[nelts](y-1+k, x-1+l) * kernel[k, l]
            # Normalize the result
            acc = acc / (3 * 3)
            result[y, x] = max(0, acc))
        vectorize[dot, nelts](size=img.width-1)

    return result
```

# ALGORITHM VECTORIZATION

```
alias nelts = SIMDWidthof[DType.float32]()

fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:
    var result = Matrix[DType.float32](img.height, img.width)
    # Loop through each pixel in the image
    # But skip the outer edges of the image
    for y in range(1, img.height-1):
        @parameter
        fn dot[nelts: Int](x: Int):
            # For each pixel, compute the product elements wise
            var acc: SIMD[DType.float32, nelts] = 0
            for k in range(3) :
                for l in range(3):
                    acc += img SIMD_load[nelts](y-1+k, x-1+l) * kernel[k, l]
            # Normalize the result
            result SIMD_store[nelts](y, x, min(255, max(0, acc)))
        vectorize[dot, nelts](size=img.width-1)

    return result
```

# ALGORITHM VECTORIZATION

```
alias nelts = SIMDWidthOf[DType.float32]()

fn naive(img: Matrix[DType.float32], kernel: Matrix[DType.float32]) -> Matrix[DType.float32]:
    var result = Matrix[DType.float32](img.height, img.width)
    # Loop through each pixel in the image
    # But skip the outer edges of the image
    for y in range(1, img.height-1):
        @parameter
        fn dot[nelts: Int](x: Int):
            # For each pixel, compute the product elements wise
            var acc: SIMD[DType.float32, nelts] = 0
            for k in range(3) :
                for l in range(3):
                    acc += img SIMD_load[nelts](y-1+k, x+l) * kernel[k, l]
            # Normalize the result
            result SIMD_store[nelts](y, x+1, min(255, max(0, acc)))
        vectorize[dot, nelts](size=img.width)
    return result
```

# RECAP

- Far from stable
- Compilation AOT or JIT
- Python friendly but not Python
- Dynamic Python vs Static Mojo
- Python interoperability
- Predictable behavior with semantic ownership
- Low level optimization
- Blazingly fast

Mojo 🔥  
The next AI Language?

# CONCLUSION

- Python is not yet dead !  
But he moves slowly
- This is a great team !  
Will they be able to deploy their platform strategy ?
- Will they be able to unite a community?  
To be open-source or not to be

# MERCI!



# Jean-Luc Tromparent

Principal Engineer @ **helloworld group** learn, work, move.

<https://linkedin.com/in/jltromparent>

[https://github.com/jiel/laplacian\\_filters\\_benchmark](https://github.com/jiel/laplacian_filters_benchmark)

<https://noti.st/jlt/qheMOM>



👉 I need your feedback 👈