



PyCONUS 2025

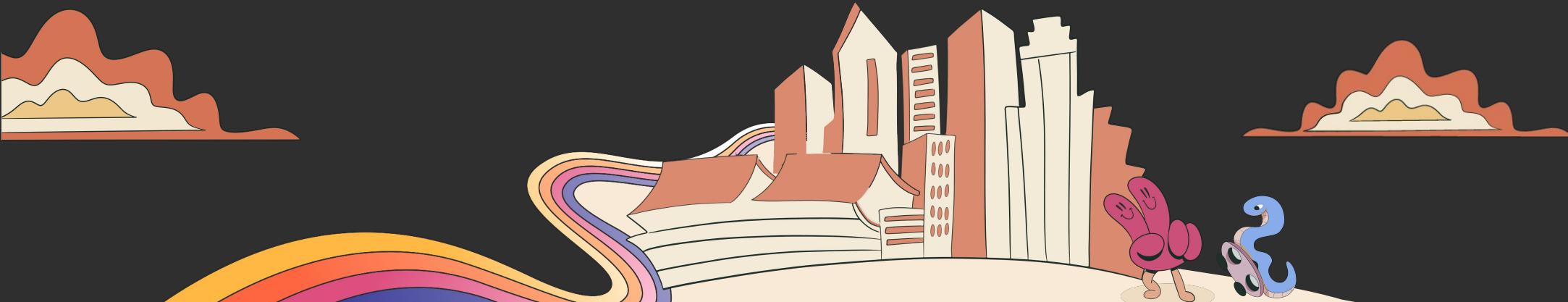
Pittsburgh



Reinventing the Wheel: A Community-Driven Roadmap for Python Packaging

Jonathan Dekhtiar, Barry Warsaw

PyCon 2025



Who we are

Jonathan Dekhtiar

WheelNext - NVIDIA



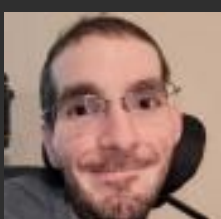
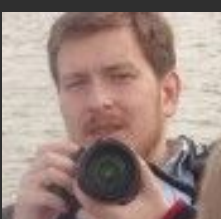
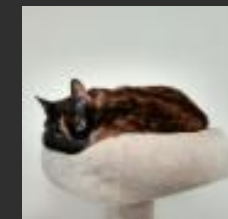
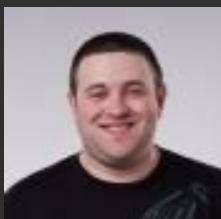
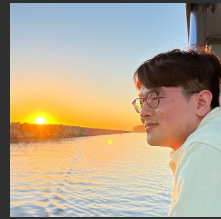
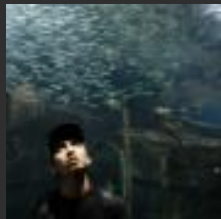
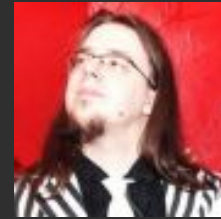
Barry Warsaw

Core Dev - WheelNext - NVIDIA



The work of so many

Alphabetic Order





1

Celebrating Wins

Celebrating our wins

633,415 projects

6,904,556 releases


14,162,240 files

920,172 users



The Python Package Index (PyPI) is a repository of software for the Python programming language.

PyPI helps you find and install software developed and shared by the Python community. [Learn about installing packages](#) .

Package authors use PyPI to distribute their software. [Learn how to package your Python code for PyPI](#) .

Celebrating our wins

PyPI Stats

__all__

[Search](#)

[All packages](#)

[Top packages](#)

[Track packages](#)

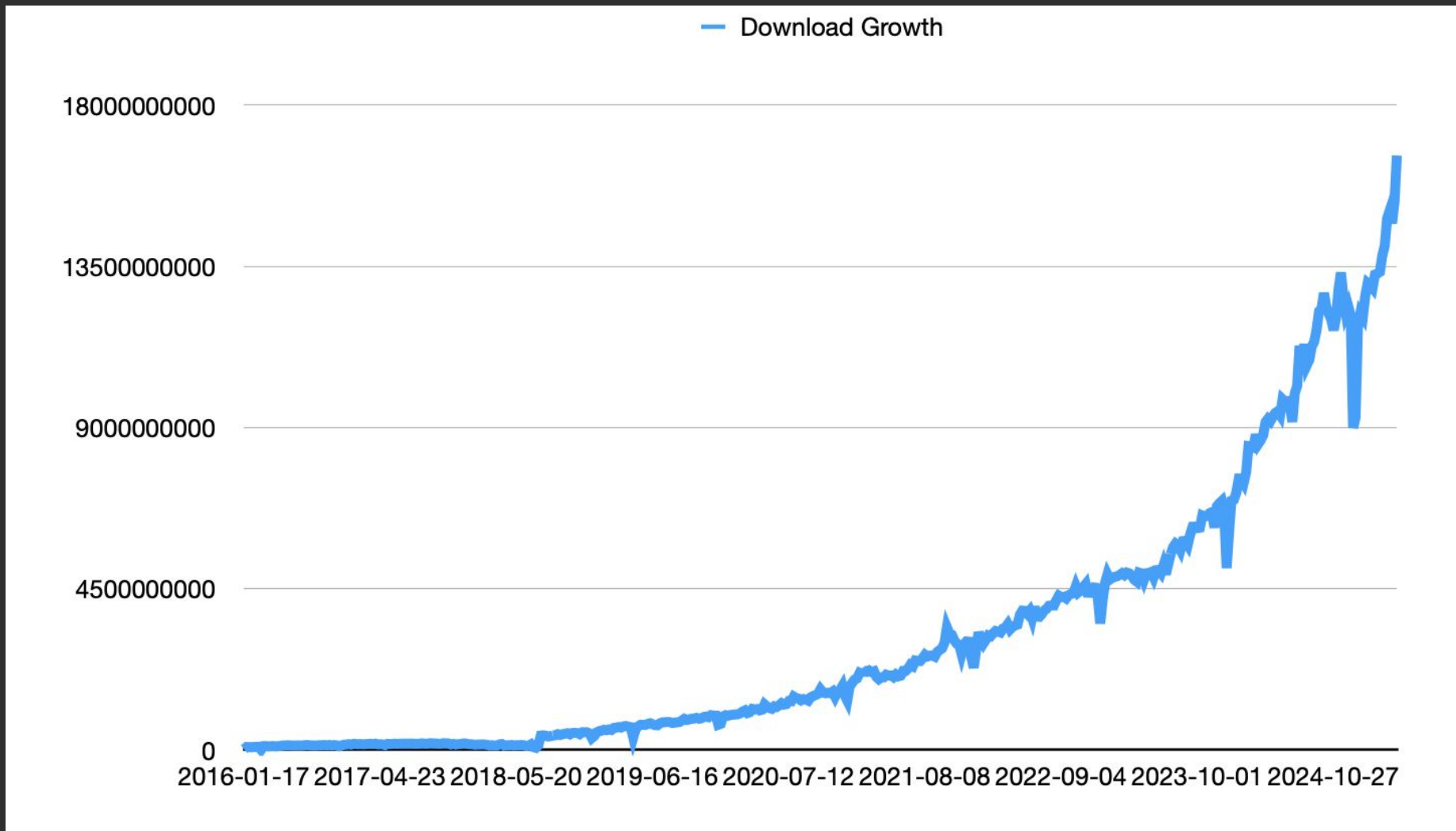
Download stats for __all__ indicate downloads across all packages on PyPI.

Downloads last day: 1,674,365,442

Downloads last week: 3,413,878,375

Downloads last month: 19,365,157,143

Celebrating our wins

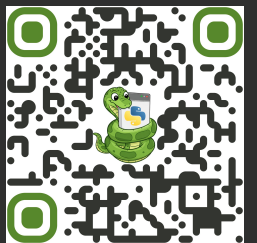


Celebrating our wins



Celebrating our wins

- Hard to argue that Python packages and wheels aren't hugely successful
- The results of much hard work spanning years across the ecosystem
- Wheels serve the needs of most users most of the time
- But...
- ...cracks are beginning to show for some important use cases



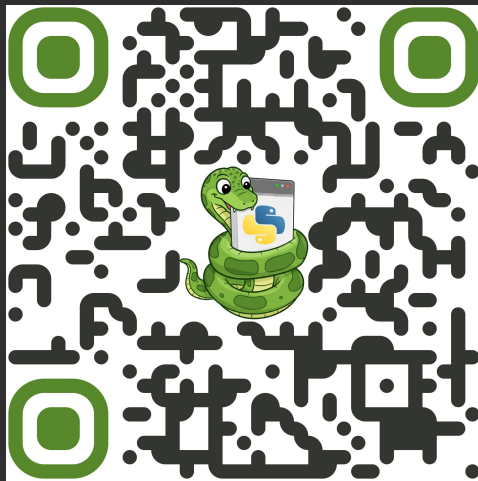


2

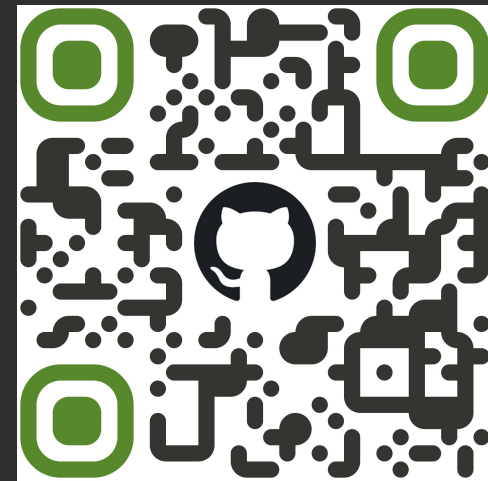
WheelNext

What is “WheelNext”?

- **Open-Source initiative** aiming to “**Reinvent the Wheel**”
- **Evolving** the Python packaging ecosystem
- Many participants across:
 - Companies, organizations, and individuals
 - Users, tool makers, consumers/installers, producers/builders



contribute.wheelnext.dev



github.com/wheelnext

WheelNext - Who are we ?

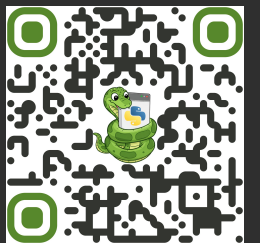


RAPIDS



WheelNext Inspiration

- pypackaging-native.github.io
- GPUs, CPU microarchitectures, OpenMP/MPI/BLAS/LAPACK
- Wheel hosting size limitations on PyPI
- Native dependencies



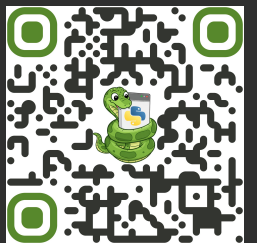
WheelNext Design Axioms

- If it works for you now, it'll work for you later



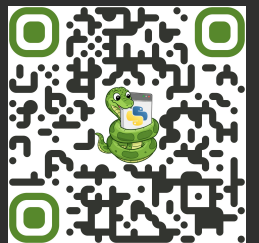
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- If it works for you now, it'll work for you later
- Prioritize the UX; push complexity into the tooling



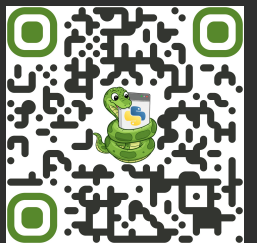
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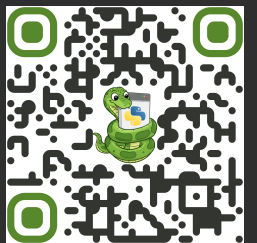
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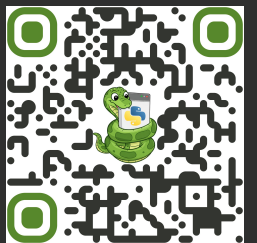
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- **Prioritize backward compatibility**



WheelNext Design Axioms

- If it works for you now, it'll work for you later
- Prioritize the UX; push complexity into the tooling
- Meet users where they are
- Ecosystem-wide; no single tool or service focus
- Prioritize backward compatibility
- If something *must* break, do so intentionally and explicitly



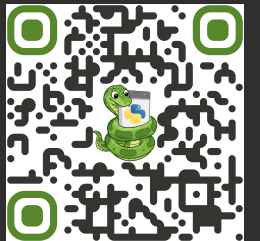


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Problems

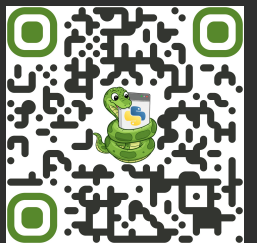
Problem: PyPI quotas

- Package size limitation
 - 100 MiB / file by default
 - 1GB / file hard limit
- Project size limitation
 - 10 GiB / project by default



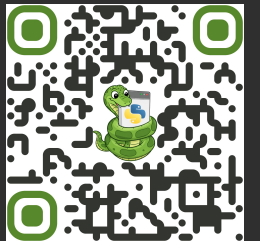
Problem: Multiple Indexes

- Why use multiple indexes?
- Installing from multiple indexes can be unintuitive
 - Users expect installer flags to express priority, but that does not match reality
 - How do users ensure that they are getting what they want?
 - How do projects provide instructions for reliable package installation?
- **Confusing at best. Prone to exploitation at worst.**
 - Name collision across different indexes; dependency confusion attacks



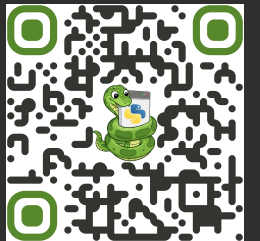
Problem: Wheel 1.0

- Difficult to adopt new features, e.g.
 - symlinks
 - Zstandard compression
 - METADATA.json
- Backward compatibility
- Long tail of adoption



Problem: “shared libraries”

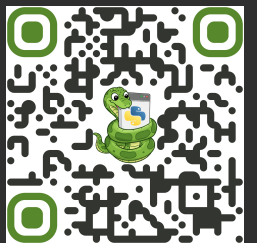
- **No symlinks** in Python wheels => reducing “packaging bloat”
https://pypackaging-native.github.io/other_issues/#lack-of-support-for-symlinks-in-wheels
- No **safe, robust, and portable** approach for **sharing native libraries**
 - Ensuring all dependents load “the right” shared library
- **Duplication** (in whls) of common **Dynamic Shared Objects (DSOs)**
 - Increase “package bloat” and load on PyPI infrastructure.



Problem: Default Extras

```
pip install package[default_extra]
```

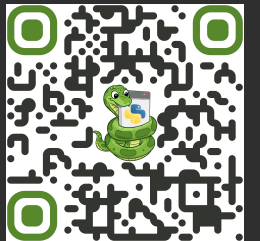
- Optional dependencies often used to express different “backends”
- Some packages *require at least one extra* to be installed
- But which one?
- Make it easy by *providing a default extra* if none is specified
- `pip install pkg == pip install pkg[default_extra]`



Problem: Specialized “Hardware”

Going beyond Python version + ABI + Platform

- No way to more finely describe the operating environment
 - What type of **hardware** do you have (*e.g. GPU, FPGA, ASIC, etc.*) ?
 - What **x86-64 / ARM version** (*e.g. x86-64v3, ARMv7, ARMv8, etc.*)?
 - What **special instruction sets** (*e.g. AVX512*)?
 - Specialized libraries (BLAS, MPI, etc.)



Problem: Specialized “Hardware”

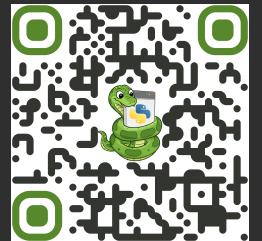
Going beyond Python version + ABI + Platform

| | | | | |
|------------------|----------------|-------------------|----------|-----|
| PyTorch Build | Stable (2.5.1) | Preview (Nightly) | | |
| Your OS | Linux | Mac | | |
| Package | Conda | Pip | Source | |
| Language | Python | C++ / Java | | |
| Compute Platform | CUDA 12.1 | CUDA 12.4 | ROCm 6.2 | CPU |

Run this Command:

```
pip3 install torch torchvision torchaudio --index-url https://download.pytorch.org/whl/cpu
```

This can not be the best answer our community has - We must do better.

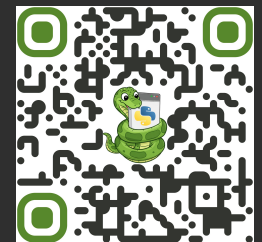


Problem: Specialized “Hardware”

Going beyond Python version + ABI + Platform

| | Linux, x86_64 | Linux, aarch64 | Mac, x86_64 | Mac, aarch64 | Windows, x86_64 | Windows WSL2, x86_64 |
|---------------------|------------------------------|---------------------|---|------------------------------|---------------------|------------------------------|
| CPU | yes | yes | jax<=0.4.38 only | yes | yes | yes |
| NVIDIA GPU | yes | yes | no | n/a | | experimental |
| Google Cloud TPU | yes | n/a | | n/a | n/a | n/a |
| AMD GPU | yes | no | experimental | n/a | no | no |
| GPU | n/a | no | n/a | experimental | n/a | |
| Intel GPU | experimental | n/a | n/a | n/a | no | |

This can not be the best answer our community has - We must do better.





04

WheelNext Proposals

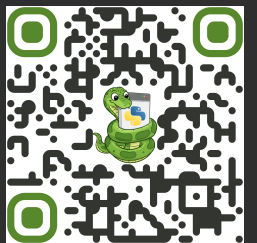
Proposals: Honorable Mentions

| PEP | Title |
|---------|--|
| PEP 759 | External wheel hosting |
| PEP 771 | Default extras for Python software packages |
| PEP 777 | How to re-invent the wheel |
| PEP 778 | Supporting symlinks in wheels |
| PEP XXX | Build isolation bypass for specific dependencies |

Proposed: PEP 772

Packaging governance process

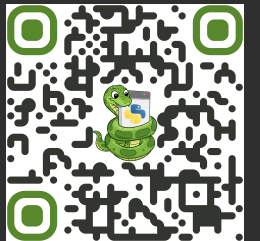
- A **formal packaging governance council**, like the PSC
- Transfer standing delegations for Packaging PEPs
- Works with PyPA, dissolves and replaces Packaging WG
- **Large voting community:**
 - PyPA members
 - Packaging WG
 - core devs, wider community members, etc.



Proposed: Informational PEP 766

Explicit Priority Choices Among Multiple Indexes

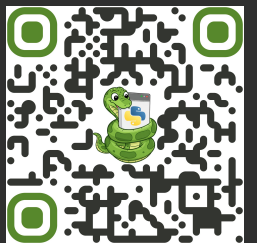
- Defines “**version priority**” and “**index priority**”:
 - Version priority (like pip): combines indexes then finds the highest version
 - Index priority (like uv and conda): resolves packages one-index-at-a-time
- Terminology and descriptions are provided to help package providers and end users differentiate installer behaviors.
- Avoids rigid implementation requirements to allow innovation
 - Expect that pip, uv, and other installers would follow user demand



Proposed: Future PEP

Native Library Loader

- Safely use shared libraries distributed in wheels
- No conflict between wheels and system libraries (if present)
- Multiple approaches exist to address this problem
 - ⇒ **Help us converge and test**
- We want a standardized comprehensive solution
- “Good enough” is better than “nothing at all”



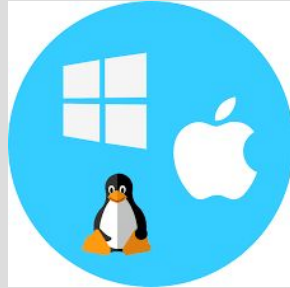
Proposed: Future PEP

Wheel Variants

Today's (**partial**) Platform (tags)



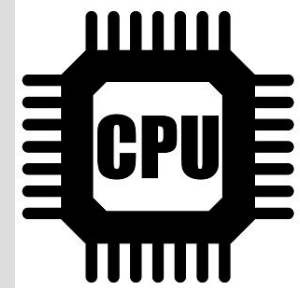
Python (+ ABI)



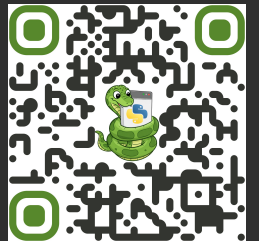
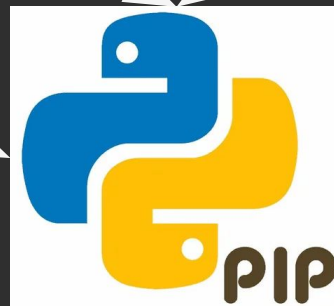
OS



Glibc



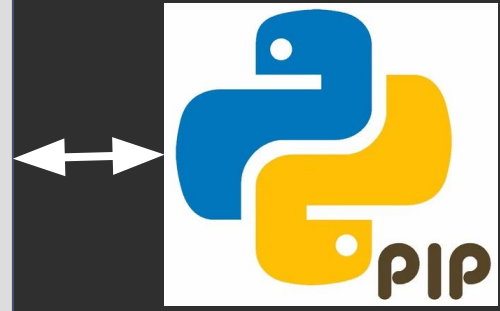
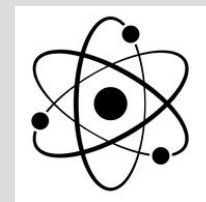
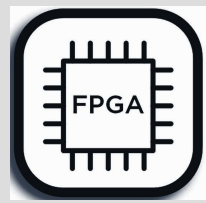
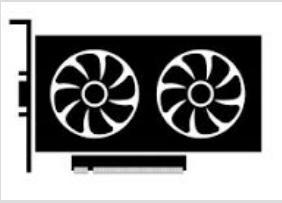
CPU Arch



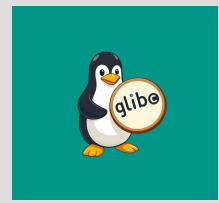
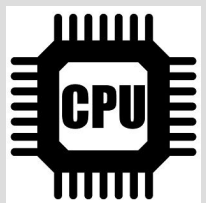
Proposed: Future PEP

Wheel Variants

Complete Platform



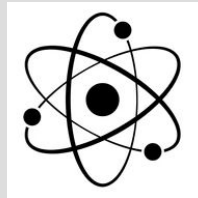
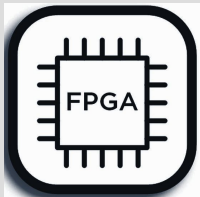
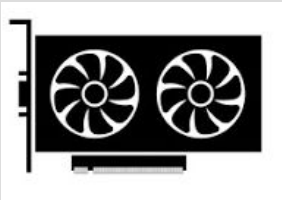
MPI



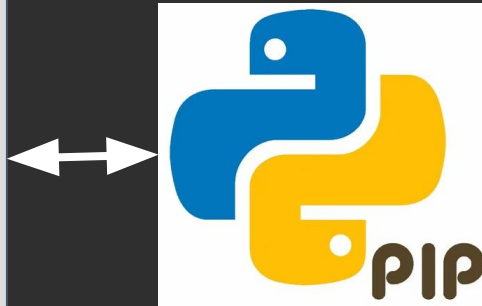
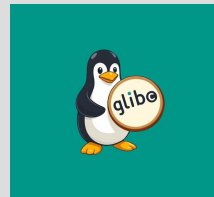
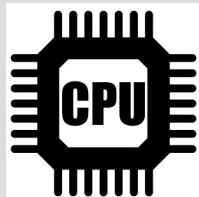
Proposed: Future PEP

Wheel Variants

Complete Platform



MPI



```
# ===== dependent on ===== #
```

- x86_64: v1, v2, v3, v4
- ARM: v7, v8, v9
- BLAS: OpenBLAS, MKL, etc.

```
pip install numpy
```

```
# ===== dependent on ===== #
```

- NVIDIA CUDA: 11.8, 12.6, 12.8
- TPU: v4, v5
- CPU Instr. : AVX512 Yes/No

```
pip install jax/torch
```

Proposed: Future PEP

Wheel Variants



<https://variants-demo.wheelnext.dev>

Proposed: Future PEP

Wheel Variants

```
$ pip install numpy
```

```
Installing variant-provider-plugins in current environment:
```

```
- provider-variant-aarch64 == 0.0.1;
```

```
Variant `09300f2f` rejected `[aarch64 :: version :: 8.4a]` is not supported.
```

```
Variant `c87a4099` rejected `[aarch64 :: version :: 8.5a]` is not supported.
```

```
Total Number of Compatible Variants: 4
```

```
##### Selected Variant: `522ebbc7` #####
```

```
Variant-property: aarch64 :: version :: 8.3a
```

```
#####
```

```
Collecting numpy
```

```
numpy-2.2.5-cp312-cp312-macosx_14_0_arm64-522ebbc7.whl (5.1 MB)
```

```
Installing collected packages: numpy
```

```
Successfully installed numpy-2.2.5-522ebbc7
```



Proposed: Future PEP

Wheel Variants

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ARM v8.3a



Proposed: Future PEP

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ARM v8.3a



Proposed: Future PEP

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Variant-property: aarch64 :: version :: 8.3a
```

```
#####
```

```
Collecting numpy
```

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```

```
Installing collected packages: numpy
```

```
Successfully installed numpy-2.2.5-522ebbc7
```



ARM v8.3a



Proposed: Future PEP

Wheel Variants

```
$ pip install numpy
```

```
Installing variant-provider-plugins in current environment:  
- provider-variant-x86-64 == 0.0.1;  
  
Variant `fa7c1393` rejected `[x86_64 :: level :: v3]` is not supported.  
Variant `cfdbe307` rejected `[x86_64 :: level :: v4]` is not supported.  
  
Total Number of Compatible Variants: 2
```

```
##### Selected Variant: 40aba78e #####  
Variant-property: x86_64 :: level :: v2  
#####
```

```
Collecting numpy  
  numpy-2.2.5-cp312-cp312-linux_x86_64-40aba78e.whl (17.6 MB)
```

```
Installing collected packages: numpy  
Successfully installed numpy-2.2.5-40aba78e
```



X86-64 v2



Proposed: Future PEP

Wheel Variants

```
$ pip install torch
```

```
Installing variant-provider-plugins in current environment:
```

```
- nvidia-variant-provider == 0.0.1;
```

```
Variant `1065b45d` rejected `[nvidia :: cuda :: 11.8]` is not supported.
```

```
Total Number of Compatible Variants: 3
```

```
##### Selected Variant: `d5784ad6` #####  
Variant-property: nvidia :: cuda :: 12.8  
#####
```

```
Collecting torch
```

```
torch-2.7.0-cp312-cp312-manylinux_2_28_x86_64-d5784ad6.whl (1096.4 MB)
```

```
Installing collected packages: numpy
```

```
Successfully installed torch-2.2.5-d5784ad6
```



CUDA 12.8



Proposed: Future PEP

Wheel Variants

```
$ pip install torch
```

```
Installing variant-provider-plugins in current environment:
```

```
- nvidia-variant-provider == 0.0.1;
```

```
Variant `1065b45d` rejected `[nvidia :: cuda :: 11.8]` is not supported.
```

```
Variant `43331073` rejected `[nvidia :: cuda :: 12.6]` is not supported.
```

```
Variant `d5784ad6` rejected `[nvidia :: cuda :: 12.8]` is not supported.
```

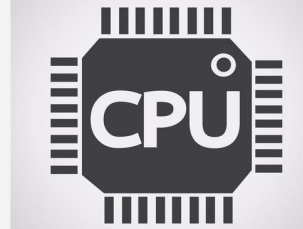
```
Total Number of Compatible Variants: 0
```

```
Collecting torch
```

```
torch-2.7.0-cp312-cp312-manylinux_2_28_x86_64.whl (175.4 MB)
```

```
Installing collected packages: numpy
```

```
Successfully installed torch-2.2.5
```



CPU “only”

“No variant found”

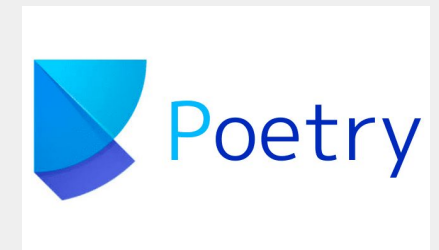


Proposed: Future PEP

Wheel Variants



(Hopefully) Very Soon - Work in Progress





05

Call to Action

Join us!

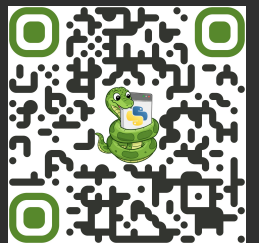
- Let's hear from you!
 - wheelnext.dev & GitHub (Use the **QR code**)
 - PyPA Discord #wheelnext
- PyCon 2025
 - Sprints
 - Language/Packaging Summits (read the blogs)
 - Stickers!
- Try `variants-demo.wheelnext.dev`



Grab a sticker and join the adventure



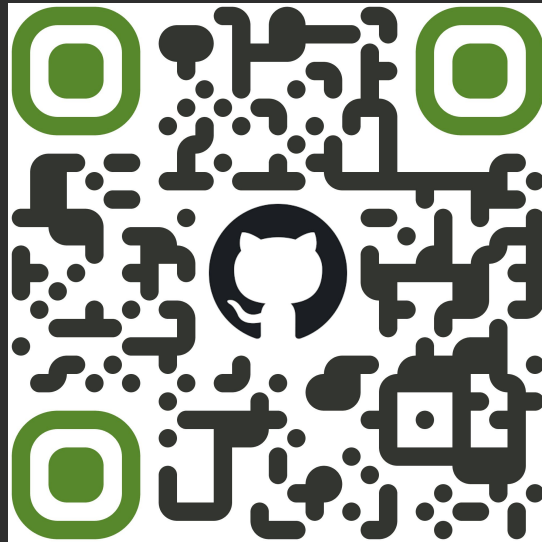
Reinventing the Wheel



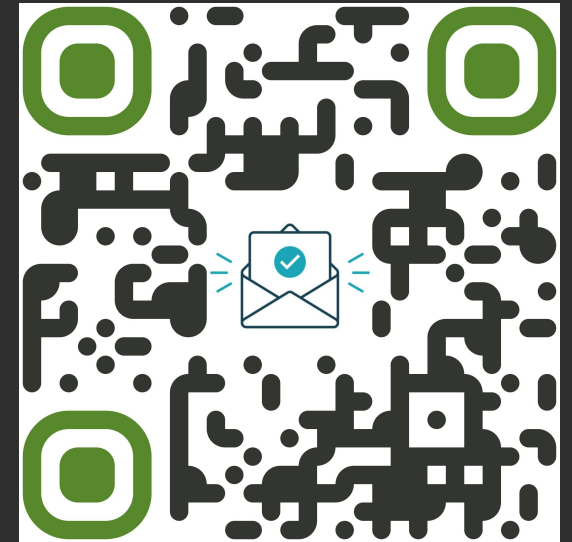
WheelNext Resources



<https://contribute.wheelnext.dev>



<https://github.com/wheelnext>



<https://mailing.wheelnext.dev>