### WheelNext Engineering Review

February 20, 2025





# Community Updates

Presented by Andy R. Terrel (NumFOCUS / NVIDIA)



















































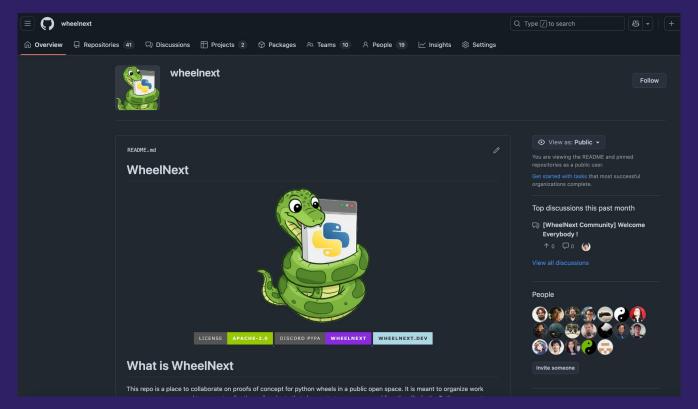








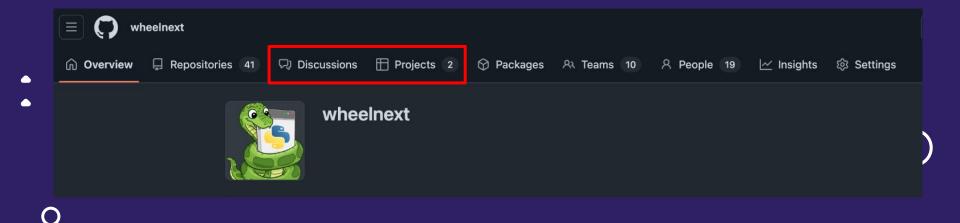
#### https://github.com/wheelnext







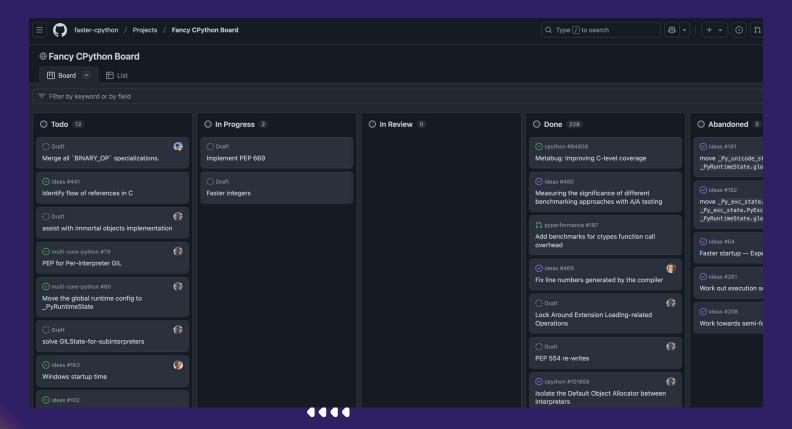
#### https://github.com/wheelnext





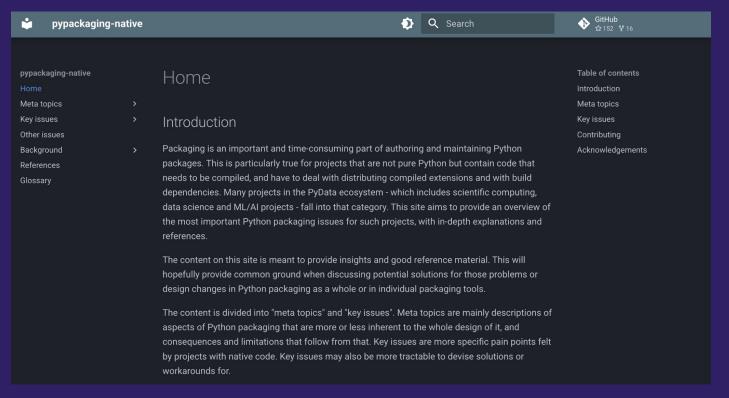


#### https://github.com/wheelnext





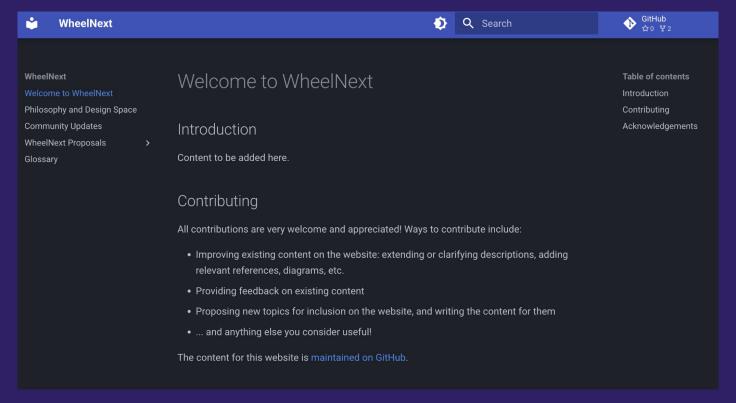
#### https://pypackaging-native.github.io/







#### https://wheelnext.dev





# PEP XXX: Wheel Variant





## 01

## Problem Statement

Presented by Andy R. Terrel (NumFOCUS / NVIDIA)



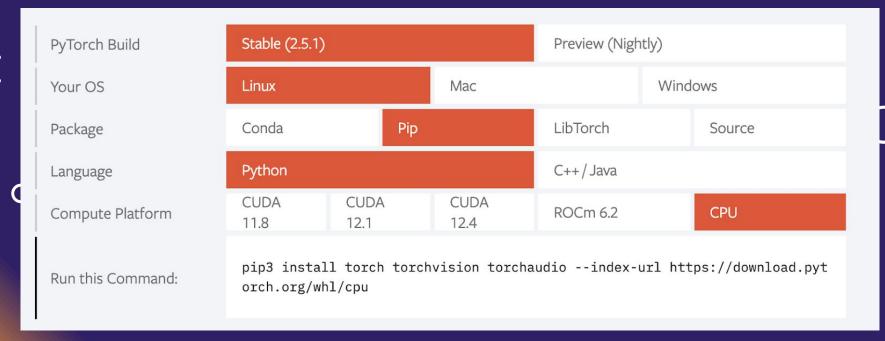
#### $\sim$

#### Why "Wheel Variants"?

- No way to accurately describe the "hardware platform"
  - What type of accelerators do you have (e.g. CUDA 11, CUDA 12, ROCM, TPU, etc.)
  - What "compute capability" (e.g. SM 90, SM 85, etc.)
  - What ARM version (e.g. ARMv7, ARMv8, etc.)
  - What X86 version (e.g. x86\_64-v2, x86\_64-v3, etc)
  - What special CPU instruction (e.g. AVX512, SSE, etc.)
- O
  - What about describing FPGA / ASIC support?
  - What about specific hardware function (e.g. AV1 encoding/decoding)?



#### Why "Wheel Variants"?



#### Why "Wheel Variants"?





#### Why "Wheel Variants"?

**Problem:** Which "flavor" of PyTorch is this command supposed to download?

\$ [uv] pip install transformers # a package from HuggingFace that depends on PyTorch





#### $\sim$

#### Why "Wheel Variants"?

- Some References:
  - <a href="https://pypackaging-native.github.io/key-issues/gpus/">https://pypackaging-native.github.io/key-issues/gpus/</a>
  - O- <a href="https://pypackaging-native.github.io/key-issues/simd\_support/">https://pypackaging-native.github.io/key-issues/simd\_support/</a>





## 02 Design Axioms

Presented by Barry Warsaw (Python Steering Council / NVIDIA)



#### $\wedge \wedge$

#### **WheelNext - Design Axioms**

https://wheelnext.dev/philosophy\_and\_design\_space/

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### WheelNext - Design Axioms

https://wheelnext.dev/philosophy and design space/#evolution-not-revolution

#### <u>~ Axiom 1 ~</u>

"Evolution Not Revolution"



#### **WheelNext - Design Axioms**

https://wheelnext.dev/philosophy and design space/#if-you-dont-care-now-you-wont-care-later

#### ~ Axiom 2 ~

"If you don't care now, you won't care later"



#### 

#### **WheelNext - Design Axioms**

https://wheelnext.dev/philosophy and design space/#dont-focus-on-a-single-tool-or-service

#### ~ Axiom 3 ~

"Don't focus on a single tool or service"



#### 

#### **WheelNext - Design Axioms**

https://wheelnext.dev/philosophy and design space/#favor-backward-compatible-changes-whenever-possible

#### ~ Axiom 4 ~

"Favor backward compatible changes whenever possible"



#### $\sim$

#### **WheelNext - Design Axioms**

https://wheelnext.dev/philosophy\_and\_design\_space/#be-intentful-and-explicit-on-what-is-being-broken-and-why

#### ~ Axiom 5 ~

"Be intentful & explicit on what is being broken and why"



#### 

#### **WheelNext - Design Axioms**

https://wheelnext.dev/philosophy and design space/#complexity-in-the-tooling-rather-than-user-experience

#### ~ Axiom 6 ~

"Complexity in the tooling rather than user experience"





# O3 Mode Of Operation

Presented by Barry Warsaw (Python Steering Council / NVIDIA)



#### 

#### WheelNext - Mode of Operation

https://wheelnext.dev/philosophy\_and\_design\_space/#proof-of-concept-minimum-viable-product-first-pep-second

"Proof of Concept First - PEP Second"



#### $\sim$

#### WheelNext - Mode of Operation

https://wheelnext.dev/philosophy and design space/#avoid-mission-creep

"Avoid mission creep"





## 04 User Rationale

Presented by Emma Smith (MyPy Core / NVIDIA)



#### $\wedge \wedge$

#### Wheel Variant - User Rationale

https://wheelnext.dev/proposals/pepxxx wheel variant support/#rationale

- A user wants to install a version of NumPy that is accelerated for their CPU architecture
  - A user wants to install PyTorch / JAX / vLLM that is accelerated for their GPU architecture
  - A user wants to install a version of mpi4py that has certain features enabled (e.g. specific MPI implementations for their hardware)
  - SciPy wants to provide packages built against different BLAS libraries, like OpenBLAS and Accelerate on macOS. This is something they <u>indirectly do today</u> using different macOS platform tags

#### $\wedge \wedge$

#### Wheel Variant - User Rationale

https://wheelnext.dev/proposals/pepxxx wheel variant support/#rationale

- A library maintainer wants to build their library for wasm32-wasi with and without pthreads
- support
  - A library maintainer wants to build their library for Pyodide on an Emscripten platform with extensions for graphics compiled in
  - A library maintainer wants to provide packages of their game library using different graphics backends
    - Manylinux cannot express x86-64-v2 requirements in Manylinux\_2\_34



### 05

# Design & Feature Space

Presented by Jonathan Dekhtiar (NVIDIA)



#### $\sim$

#### Design Requirement - "Arbitrary Variant Definition"

- <u>We need:</u> Needs to allow "arbitrary metadata" => (not GPU, CPU, TPU, FPGA, ASIC etc. or even hardware-focused)
- We do not want: not a "pre-approved list of tags" (e.g. CPU: arm64, x86\_64, etc.)
  - <u>Why:</u>
    - We can't know today the use cases of tomorrow (python for quantum compute?)
  - The compute landscape is becoming more complex, more optimized everyday.
    - We cannot hope to maintain a list of tags [too many, too many sources]
    - Different python communities might use this feature for different purposes



#### $\wedge \wedge$

#### Design Requirement - "Arbitrary combination of METADATA"

- We need: We need to be able to combine variant information coming from different sources [e.g. GPU Driver version & CPU support for AVX]
- We do not want: Wheel Variants to only be able to include WV information from one source.
  - <u>Why:</u>
  - $oldsymbol{\mathsf{O}}$  Wheel Variant "plugins" should be able to "simultaneously describe" a .whl file.
    - We need to be able to combine information from different sources [GPU, CPU, etc.]



#### $\wedge \wedge$

#### Design Requirement - "If you don't need, you shouldn't care"

- We need: Wheel Variants should not interfere with the normal "python packaging/installer" workflow & ecosystem.
- We do not want: Wheel Variants to impact packages that don't need it.
- <u>Why:</u>
  - This is a niche feature that only affect a small percentages of project
  - Not every Python users/maintainers should have to care

#### $\sim$

#### Design Requirement - "Do not break old installers"

- <u>We need:</u> Wheel Variant design should include a mechanism to ensure these "special wheels" will be ignored by installers (e.g. uv, pip) that don't support them:
- Not yet implement
  - Old release who didn't support them
  - We do not want: To confuse an installer that doesn't support Wheel Variants.
  - <u>Why:</u>
    - It will be very hard to get the PEP accepted if it breaks any previous release of every installers: uv, pip, etc.



#### $\wedge \wedge \wedge$

#### Design Requirement - "No Public API inside PIP"

- <u>We need:</u> We need a standardized "plugin API" that all "build-backends" [setuptools], "installers" [pip, uv], "workflow managers" [pdm, poetry, uv] can use and rely on.
- We do not want: To depend on a public API inside of PIP: `from pip import XYZ`
- <u>Why:</u>
  - To guarantee "tool agnosticism", we can not depend on a public API in one tool.
    - PyPA has consistently refused to maintain any "public user code-API" inside PIP.

#### $\wedge \wedge$

#### Design Requirement - "Externally Defined: Plugin centric"

- <u>We need:</u> Ability to define "arbitrary metadata/tag" from outside the standard packaging tooling ecosystem (installers, build backends, etc.)
- We do not want: Have to send PRs to any number projects to "declare" the
   existence of a new metadata / tag.
  - <u>Why:</u>
  - Maintainers of the installer/packaging ecosystem can not be expected to become expert on hardware (CPUs, GPUs, TPUs, ASIC, FPGAs, etc.)

    => they can't be expected to review "FPGA-related code"
    - The maintenance load to review all these PRs would be significant



- We need:
  - We need a way for users to specify:
    - pluginA > pluginB (e.g. I care more about my GPU support than AVX support)
  - Plugins needs a way to specify:
    - featureA > featureB (e.g. x86-64-v2 is more important than AVX support)
- We do not want: a flat list of plugins and features with no relative priorities
- <u>Why:</u>
  - Not all features have the same relative importance
  - Multiple variants can match a given system (e.g. a generic and a specific)



#### Design Requirement - "Scaling should be cheap"

- We need: It shouldn't matter how many different variants are possible or exists. Deciding which Variant to install should be near instant.
- We do not want: As we scale the number of variant / metadata, the install command take significant time.
  - <u>Why:</u>
  - O The search space can become very large very fast
    - Combinatorial Products of features



#### Design Requirement - "Caching is important or critical"

- <u>We need:</u> A way to cache, manage cache, void cache of the "platform detection and variant resolution".
- We do not want: Want to re-analyze the entire platform for every single `pip install package` command
  - <u>Why:</u>
  - 2 Loading a bunch of libraries to check versions can be expensive
    - System calls to detect X, Y, Z can also be expensive



#### $\wedge \wedge$

#### Design Requirement - "Forced variant installation"

- We need: A way for an "expert user" to specify: they desire a specific variant or set of variants in this specific order. Don't do perform automatic resolution.
   [uv] pip --variant=ABC package`
- We do not want: Have no way for the user to overwrite the automatic resolution if they so wishes.

#### O Why:

- CI Systems may use this
- Advanced users with specific use-cases
- Going around a bug in a specific variant



#### $\wedge \wedge$

#### Design Requirement - "Forced variant deactivation"

- We need: A way for a user to "disable variant behavior":
   [uv] pip install –no-variant package`
- We do not want: Have no way for the user to disable variant installation.
- <u>Why:</u>
- CI Systems may use this
  - Advanced users with specific use-cases
  - Going around a bug in a specific variant



# 06

# Technical Proposal

Presented by Jonathan Dekhtiar (NVIDIA)





#### Design Requirement - "Arbitrary Variant Definition"

```
# Wheel Variant: dummy_project-0.0.1~36266d4d-py3-none-any.whl
 # MFTADATA File
                                                              Plugin Name: `fictional_hw`
 Variant-hash: 36266d4d
 Variant:
          fictional hw
                        : architecture :: HAL9000
 Variant:
          fictional hw
                        : compute_accuracy :: 0
 Variant:
          fictional hw
                        : compute_capability :: 6
Variant:
          fictional_hw
                        : humor :: 2
```



#### Design Requirement - "Arbitrary Variant Definition"

```
# Wheel Variant: dummy_project-0.0.1~36266d4d-py3-none-any.whl
# METADATA File

Variant-hash: 36266d4d

Variant: fictional_hw :: architecture :: HAL 9000

Variant: fictional_hw :: compute_accuracy :: 0

Variant: fictional_hw :: compute_capability

Variant: fictional_hw :: humor :: 2
```

- Plugin Name: `fictional\_hw`
- Defines "4 variables"



#### Design Requirement - "Arbitrary Variant Definition"



```
# Wheel Variant: dummy_project-0.0.1~36266d4d-py3-none-any.wh1
# METADATA File

Variant-hash: 36266d4d

Variant: fictional_hw :: architecture :: HAL9000

Variant: fictional_hw :: compute_accuracy :: 0

Variant: fictional_hw :: compute_capability :: 6

Variant: fictional_hw :: humor :: 2

• W
```

- Plugin Name: `fictional\_hw`
- Defines "4 variables"
- With "1 value assigned per variable"

#### Design Requirement - "Arbitrary combination of METADATA" 🕢



```
# Wheel Variant: dummy_project-0.0.1~36266d4d-py3-none-any.whl
# METADATA File

Variant-hash: 6b4c8391

Variant: fictional_hw :: architecture :: deepthought
Variant: fictional_hw :: compute_accuracy :: 10

Variant: fictional_hw :: compute_capability :: 10

Variant: fictional_hw :: humor :: 0

Variant: fictional_tech :: quantum :: foam
```

 Legal to combine "metadata" from different sources/plugin.

=> Example: CUDA 12 with AVX

 Can really be anything so long it follows the "standard format"
 provider\_name> :: <variable> :: <value>

# Design Requirement - "If you don't need, you shouldn't care"

Design Requirement - "Do not break old installers"

```
# https://github.com/pypa/pip/blob/main/src/pip/_internal/models/wheel.py#L22
wheel_file_regex = r"""^
    (?P<namever>
        (?P<name>[^\s-]+?)
        -(?P<ver>[^\s-]+?)
    (\-(?P<build>\d[^\s-]*))?
    -(?P<pyver>[^\s-]+?)
    -(?P<abi>[^\s-]+?)
    -(?P<plat>\S+)
match = wheel_file_regex.match(filename)
if not match:
      raise InvalidWheelFilename(f"{filename} is not a valid wheel filename.")
```

# Design Requirement - "If you don't need, you shouldn't care"

Design Requirement - "Do not break old installers"

```
# https://github.com/pypa/pip/blob/main/src/pip/_internal/models/wheel.py#L22
wheel_file_regex = r"""^
                  (?P<namever>
                                                                                                                                                                                                                    A new capture group called "variant hash"
                                  (?P<name>[^\s-]+?)
                                 -(?P<ver>[^\s-]+?)
                                                                                                                                                                                                                    Illegal with the "former wheel filename regex"
                  (1 - (2D_{c}) + (2D_{c})
                    ~(?P<variant_hash>[0-9a-f]{8}))?
                                                                                                                                                                                                                    Uses special character "~" to guarantee:
                                                                                                                                                                                                                                             a variant_hash can't match: `build_id`
                  -(?P<abi>[^\s-]+?)
                                                                                                                                                                                                                                             only free special char RFC 3986 compliant
                 -(?P<plat>\S+)
                                                                                                                                                                                                                                                                      No escaping in bash, windows, macOS
                                                                                                                                                                                                                                                                      No escaping in URLs
match = wheel_file_regex.match(filename)
if not match:
                         raise InvalidWheelFilename(f"{filename} is not a valid wheel filename.")
```

### $\wedge \wedge$

Design Requirement - "If you don't need, you shouldn't care"

Design Requirement - "Do not break old installers"

```
# Wheel Variant: dummy_project-0.0.1~36266d4d-py3-none-any.whl

# METADATA File

Variant-hash: 36266d4d

Variant: fictional_hw :: architecture :: HAL9000

Variant: fictional_hw :: compute_accuracy :: 0

fictional_hw :: compute_capability :: 6

Variant: fictional_hw :: humor :: 2

HASH

36266d4d
```



## Design Requirement - "If you don't need, you shouldn't care" 🛹



#### Design Requirement - "Do not break old installers"



```
rw-r--r-- 1 user user 1266 Feb 20 06:50 dummy_project-0.0.1-py3-none-any.whl
                                                                                                      Standard Wheel
rw-r--r-- 1 user user 1778 Feb 20 06:50 dummy_project-0.0.1~36266d4d-py3-none-any.whl
-rw-r--r-- 1 user user <mark>1773</mark> Feb <mark>20 06:50</mark> dummy_project-<mark>0.0.1</mark>~4f8ae729-py3-none-any.whl
-rw-r--r-- 1 user user <del>1777</del> Feb <mark>20 06:50</mark> dummy_project-<mark>0.0.1</mark>~57768a46-py3-none-any.whl
                                                                                                           Wheel
-rw-r--r-- 1 user user 1795 Feb 20 06:50 dummy_project-0.0.1\sim6b4c8391-py3-none-any.wh1
-rw-r--r-- 1 user user 1779 Feb 20 06:50 dummy_project-0.0.1~9091cdc4-py3-none-any.whl
rw-r--r-- 1 user user 1760 Feb 20 06:50 dummy_project-0.0.1~e684be6f-py3-none-any.whl
```

Variant-hash: 36266d4d



#### Design Requirement - "No Public API inside PIP"

#### Design Requirement - "Externally Defined: Plugin centric"

```
[project.entry-points."variantlib.plugins"]
my_plugin = "my_plugin.plugin:MyVariantPlugin"
```

```
from variantlib.config import ProviderConfig
from my_plugin import __version__

class MyVariantPlugin:
    __provider_name__ = "my_plugin"
    __version__ = __version__

def run(self) -> ProviderConfig | None:
    """If the plugin is able to determine this platform/machine supports
    custom "attributes/metadata" (defined and known by this plugin):
    => It returns a `ProviderConfig`, otherwise `None` (aka. ignore me)."""
    return ...
```

#### Design Requirement - "No Public API inside PIP"



#### Design Requirement - "Externally Defined: Plugin centric"

```
from importlib.metadata import entry_points
plugins = entry_points().select(group="variantlib.plugins")
for plugin in plugins:
    logger.info(f"Loading plugin: {plugin.name} - v{plugin.dist.version}")
    # Dynamically load the plugin class
    plugin_class = plugin.load()
    # Instantiate the plugin
    plugin_instance = plugin_class()
    # Call the `run` method of the plugin
    ... = plugin_instance.run()
    # do something with the result of the plugins
```





```
# pip.conf or variant.toml
[variantlib]
provider_priority = ["fictional_tech", "fictional_hw"]
```

- Per project: `variant.toml` or inside `pyproject.toml`
- [Tool Specific] PIP directly inside `pip.conf`
- [Tool Specific] UV directly inside `uv.toml`





```
# variantlib
from attrs import field
from attrs import frozen
@frozen
class KeyConfig:
    key: str = field()
   values: list[str] = field()
# how to use it
KeyConfig(key="driver_version", values=["12.2.6", "12.2", "12"])
```





```
# variantlib
from attrs import field
from attrs import frozen
@frozen
class ProviderConfig:
    provider: str = field()
    configs: list[KeyConfig] = field()
# how to use it
ProviderConfig(
    provider="provider_name",
    configs=[
        KeyConfig(key="attr_nameA", values=["7", "4", "8", "12"]),
        KeyConfig(key="attr_nameB", values=["3", "7", "2", "18", "22"])
```





```
# variantlib
from variantlib.config import ProviderConfig
from my_plugin import __version__
class MyVariantPlugin:
    __provider_name__ = "my_plugin"
    __version__ = __version__
    def run(self) -> ProviderConfig | None:
        return ProviderConfig(
            provider="my_plugin",
            configs=[
                KeyConfig(key="attr_nameA", values=["7", "4", "8", "12"]),
                KeyConfig(key="attr_nameB", values=["3", "7", "2", "18", "22"])
```





```
# variantlib
from attrs import field
from attrs import frozen
@frozen
class VariantMeta:
    provider: str = field()
    key: str = field()
   value: str = field()
# Using it
VariantMeta(provider="OmniCorp", key="access_key", value="secret_value")
```

```
Variant: OmniCorp :: access_key :: secret_value
```







```
# variantlib
from attrs import field
from attrs import frozen
@frozen
class VariantDescription:
    data: list[VariantMeta] = field()
# how to use it
VariantDescription([
    VariantMeta(provider="qpu_provider", key="driver_version", value="A.B.C"),
    VariantMeta(provider="cpu_provider", key="avx512", value="true"),
])
```

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Variant: gpu\_provider :: driver\_version :: A.B.C
Variant: cpu\_provider :: avx512 :: true



**HASH** 



abcd1234





```
config_custom_hw = ProviderConfig(
    provider="custom_hw",
    configs=[
        KeyConfig(key="driver_version", values=["1.3", "1.2", "1.1", "1"]),
        KeyConfig(key="hw_architecture", values=["3.4", "3"]),
config_networking = ProviderConfig(
    provider="networking",
    configs=[
        KeyConfig(key="speed", values=["10GBPS", "1GBPS", "100MBPS"]),
```





#### **Ordering / Prioritization logic:**

- More metadata match => Better
- Plugin A > Plugin B => User defined
- PluginA.featureA > PluginA.featureB => Plugin defined

#### **Consequence:**

- A variant tagged by all plugin (e.g. GPU & CPU variant) is prioritized over "just GPU or just CPU"
- A variant with more "metadata" (e.g. feature1, feature2, feature3, etc.) is more specific => more prioritized













#### **Example:**

- Plugin A => featureA
- Plugin B => featureB

#### Order:

- [pluginA.featureA, pluginB.featureB] => hash => abcd1234
- [pluginA.featureA] => hash => 01234567
- [pluginB.featureB] => hash => ab12cd34



#### Design Requirement - "Scaling should be cheap"



```
[D 2025-02-20 15:33:01.863 mockpip.commands.install:108 v0.1.0] [Variant: 0000] `109a2da5`: NOT FOUND ...
[D 2025-02-20 15:33:01.863 mockpip.commands.install:108 v0.1.0] [Variant: 0001] `c0111c07`: NOT FOUND ...
[D 2025-02-20 15:33:01.863 mockpip.commands.install:108 v0.1.0] [Variant: 0002] `b5789fbd`: NOT FOUND ...
[...]
[D 2025-02-20 15:33:02.065 mockpip.commands.install:108 v0.1.0] [Variant: 5984] `8a11085e`: NOT FOUND ...
[D 2025-02-20 15:33:02.065 mockpip.commands.install:108 v0.1.0] [Variant: 5985] `d0dff1f7`: NOT FOUND ...
[D 2025-02-20 15:33:02.065 mockpip.commands.install:108 v0.1.0] [Variant: 5986] `44da9896`: NOT FOUND ...
[I 2025-02-20 15:33:02.065 mockpip.commands.install:102 v0.1.0] ##### Best Variant: `9091cdc4` #####
[I 2025-02-20 15:33:02.065 mockpip.commands.install:104 v0.1.0] Variant-Data: fictional_tech :: quantum :: SUPERPOSITION
[I 2025-02-20 15:33:02.065 mockpip.commands.install:104 v0.1.0] Variant-Data: fictional_tech :: risk_exposure :: 25
[I 2025-02-20 15:33:02.065 mockpip.commands.install:104 v0.1.0] Variant-Data: fictional_tech :: technology :: auto_chef
[I 2025-02-20 15:33:02.065 mockpip.commands.install:130 v0.1.0] Installing: sandbox_project-0.0.1~9091cdc4-py3-none-any.whl ...
```

#### Design Requirement - "Forced variant deactivation"



[uv] pip install --no-variant dummy\_project





#### Design Requirement - "Forced variant installation"



[uv] pip install --variant=9091cdc4 dummy\_project





#### Design Requirement - "Caching is important or critical"



```
# First call - analyze the platform
[uv] pip install dummy_project

# Second call - reuse the platform analysis
[uv] pip install sandbox_project
```





07

# Parts that needs work

Presented by Jonathan Dekhtiar (NVIDIA)



#### $\wedge \wedge$

## Variant Build "user experience": Build Backend

- <u>We need:</u>
  - A build backend that support Wheel Variant to "demo the idea".
  - What should be standardized between build backends and what should not.



## Variant Build "user experience": Build Matrix

- We need: A smooth experience to build a large matrix of variants
   Let's build 200 variants of PyTorch.
- We do not want: A complicated process to do that
  - Packager experience should be simple and intuitive
- O No way to define a cross product of "features"

## Validating "plugin" design to work with `uv`

- We need: Plugin to be functional with both pip/poetry/pdm/hatch/uv/etc.

- Potential Problem (to verify):
  - "entrypoint" is a very python-based feature and plugins provide a Python interface. Let's ensure 'uv' can effectively call the python interface (from ruff) and cache the result.
  - If not, we need to find a better idea

## Is a "variant hash" the best approach?

#### - Pros:

- It's incredibly fast => hash table
  - Allows arbitrary combination of any arbitrary metadata

#### - Cons:

- I want the CUDA 12 and AVX512 package => which one is it?
  - No way to have "named configurations"

# MVP from `mockpip` to "real" `pip`

- We need: A real end-to-end implementation with pypa/pip
  - <u>We do not want:</u> A proof-of-concept using a super minimalist and narrow "mock"pip implementation.



# Verifying Scaling => QuanSight RETEX

- We need: Verify this approach scales to crazy size



## **Writing the PEP**





# **Community Engagement**

Presented by Jonathan Dekhtiar (NVIDIA)



## WheelNext & Community - OSS Community Engagement

Save-The-Date: Friday March 21st 2025 ~ 9am -> 1.30pm

WheelNext Community Summit @ META [Menlo Park]

- Validating and refining WheelNext's roadmap
- Aligning on proposals & problem statements
- Working together on common solutions for the Accelerated Compute Space

#### **Attendees:**

Companies: Anaconda, Astral.sh, Amazon/AWS, Bloomberg, Google, META, Microsoft, NVIDIA, Quansight, RedHat

OSS: Astropy, Jupyter, GPU-Mode, Numba, Numpy, Scikit-Learn, XGBoost, PSF (Python QSS)

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# https://github.com/wheelnext

https://wheelnext.dev

https://discuss.python.org/c/packaging/

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discord.com/channels/803025117553754132/

Contribute

Participate

Let's engage

•Join us on Discord



## Thank you for your attention

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