

# PyTorch in Google3

Kiuk Chung (CoreML, Google)

May 26, 2024

# Agenda

1. Intro & Background
2. PyTorch in Google3
  - a. Import Process
  - b. Building, Packaging, Running
3. Usage
4. Work in Progress



# Intro & Background

The background features a large green area on the left and a yellow area on the right, separated by a curved boundary. A dark green curved shape is also visible on the right side, overlapping the yellow area.

# PyTorch For Alphabet

Make PyTorch a fully supported option for research at Google and targeted production use-cases



DeWitt Clinton



Kiuk Chung



Qianli (Scott) Zhu



Greg Brosman



Julia Guo



Pooja Agarwal



Michael Voznesensky



Jake Harmon



Zoe Wang

## Team

Part of CoreML at Google. 9 and growing!

## Mission

Accelerate ML innovation by supporting a community-driven path from research to production in PyTorch

## Problem

External AI innovation happens in PyTorch but has not been supported in google3. AI builders need it to evaluate/adopt external innovation and publish internal innovation.

# PyTorch at Google

Past

## Use at your own risk

Ad-hoc imported by researchers on need-to basis. Poor documentation. Flaky community-driven support.

2024

## Officially supported by CoreML

Maintained and updated by the PyTorch team. Documentation revamped with gotchas, workarounds, examples. Offered at Special Availability [beta] for research and experimentation.

Q2

## PyTorch as 3rd Party in Google3

Get vanilla PyTorch running smoothly at Google. Integrations to AI infrastructure (Borg, profiling, logging, data, etc).

Q3

## PyTorch as 1st Party in Google3

Setup to develop and contribute to PyTorch. Easily PR [public portions] to GitHub. Similar to Meta's setup of PyTorch in FBCode.

Q4

## Contribute Features to PyTorch and Ecosystem

JAX backend for PyTorch, quantization algorithms, better support PyTorch in Colab, etc

Future

# PyTorch in Google3



# PyTorch in Google3

## Repository (g3)

Mono-repo. Must import third\_party libs as source. PyTorch imported and built from source.

## google3/third\_party/py/torch

Imported from PyTorch GitHub at a release tag.

torch/google/\*\* sub-dir for g3 specific extensions.

## Patches

~50 patches on upstream code. Deals with uniqueness [compared to OSS standards] of Google's internal infrastructure, filesystem, multiprocessing, logging, compiler toolchain.

## Prefer Extensions over Patching

Sub-class interfaces or author custom hooks and register where PyTorch allows. No custom behaviors [yet].

## google3 ~ fbcode

google3 and fbcode are similar in many ways. We run tests with `PYTORCH_TEST_FBCODE=1`

*Exercise: search for "fbcode" on PyTorch GitHub.*

## Packaging

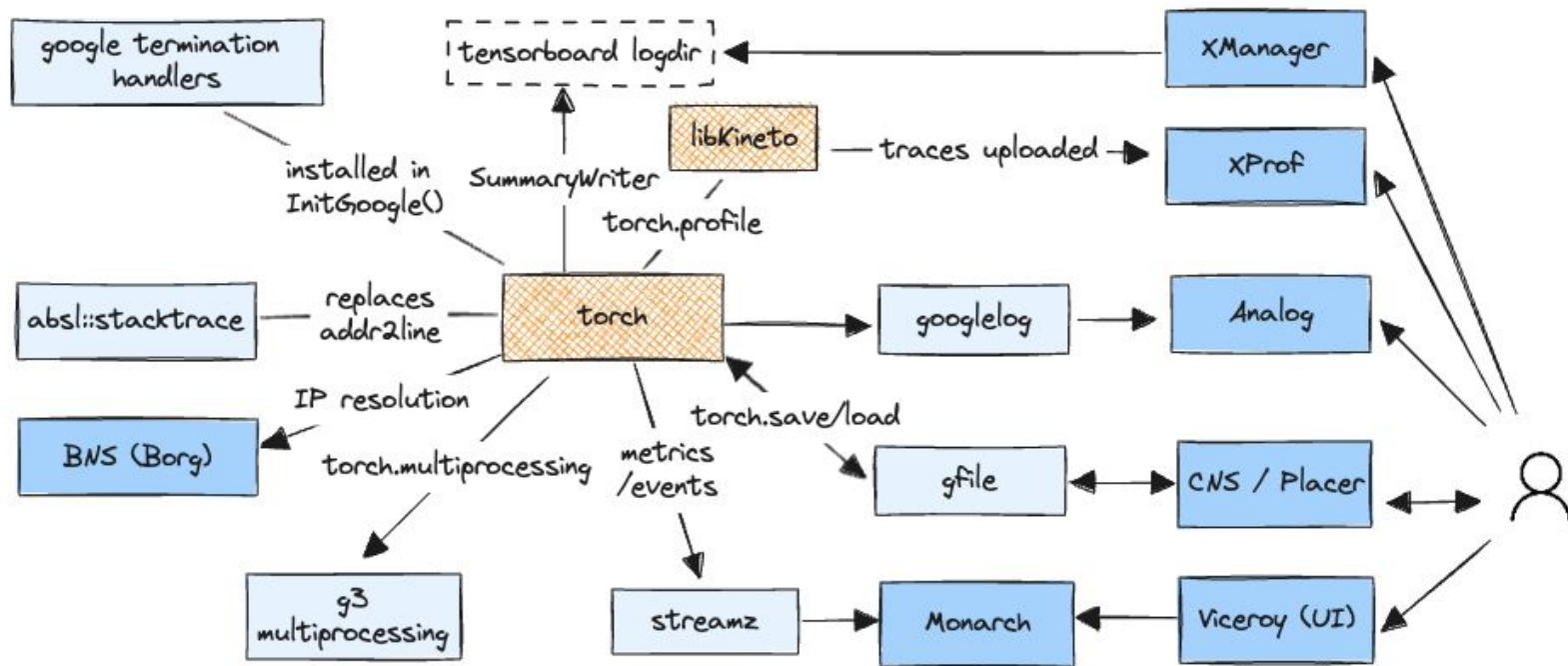
Statically link [most] binaries. Hermetic PAR for Python binaries. All the C-extensions (e.g. libtorch) are statically linked into the interpreter itself.

## PyTorch in Google3 vs OSS

	Google3	OSS
Repository	Mono-repo	Multi-repo
Build System	Blaze (Bazel)	CMake
Packaging	hermetic PAR	pip / conda
CUDA Compiler	Clang	NVCC
Logging Library	Abseil	Python built-in, glog (C++)
Flags Library	Abseil	gflags
Multiprocessing Library	g3_multiprocessing	Python built-in
Filesystem API	GFile	Python built-in



# PyTorch in Google3



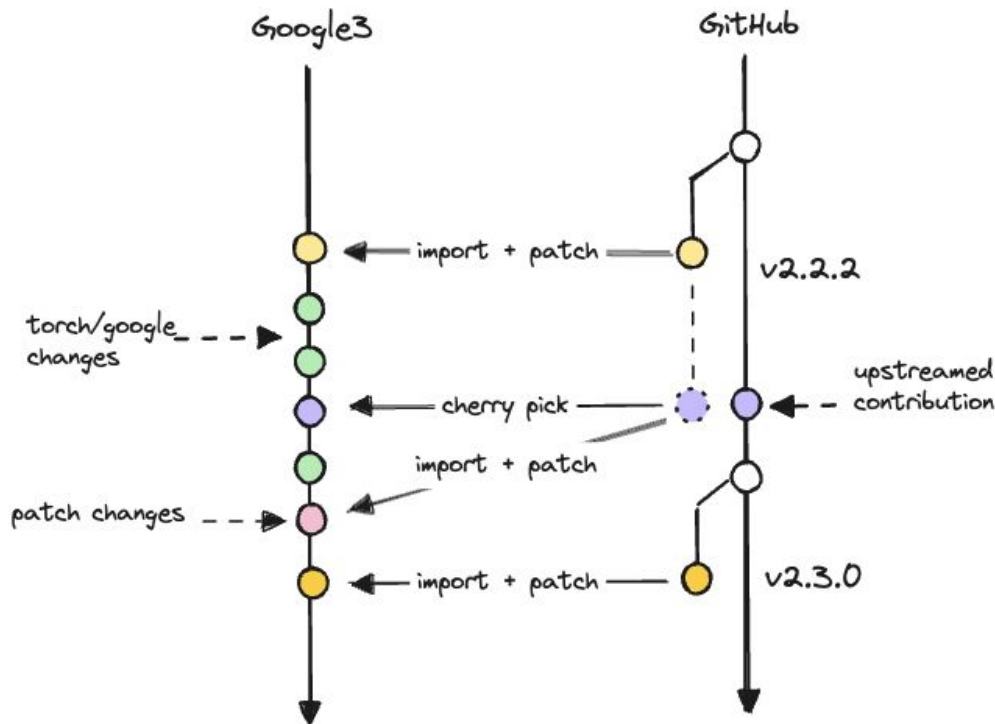
# PyTorch in Google3

Import Process



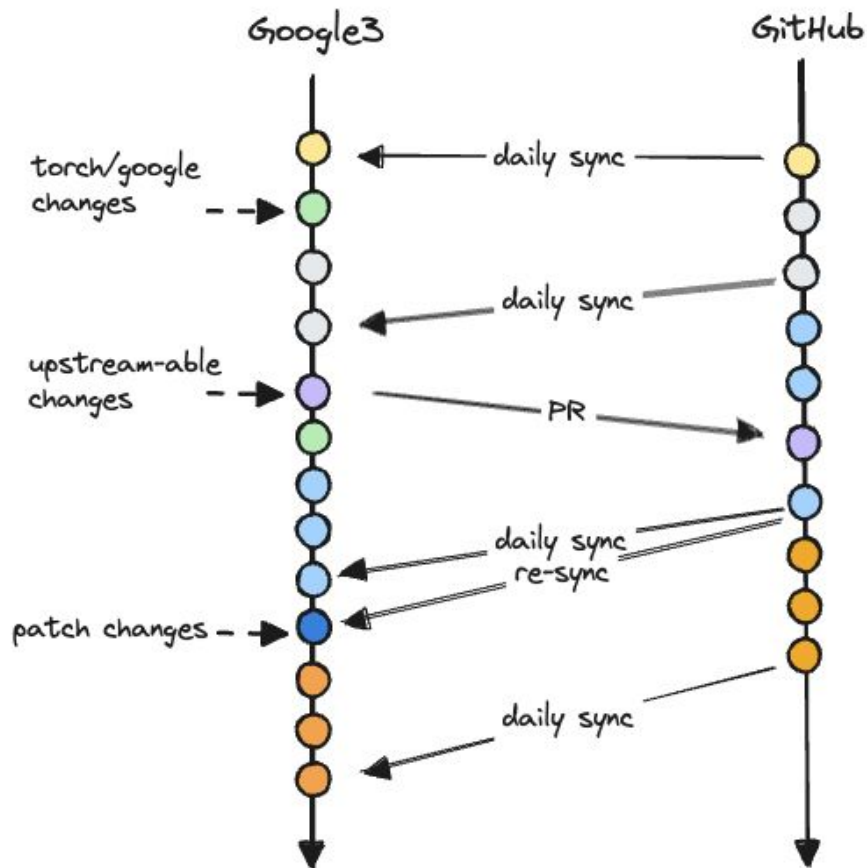
# PyTorch as 3rd party

- Copybara - tool for transforming and moving code between Google3 and GitHub
- Import at release tag. Patches to upstream source code applied during import process
- torch/google [google-specific] changes not upstreamed
- Upstreamed PRs are cherry-picked
- On patch change, re-import with changed patches
- PyTorch still effectively treated as 3rd party



## PyTorch as 1st party

- Still use Copybara
- Daily import from upstream main
- torch/google changes ignored by Copybara as usual
- Upstream-able changes exported as PR
- Patches still exist. Re-sync if changed)



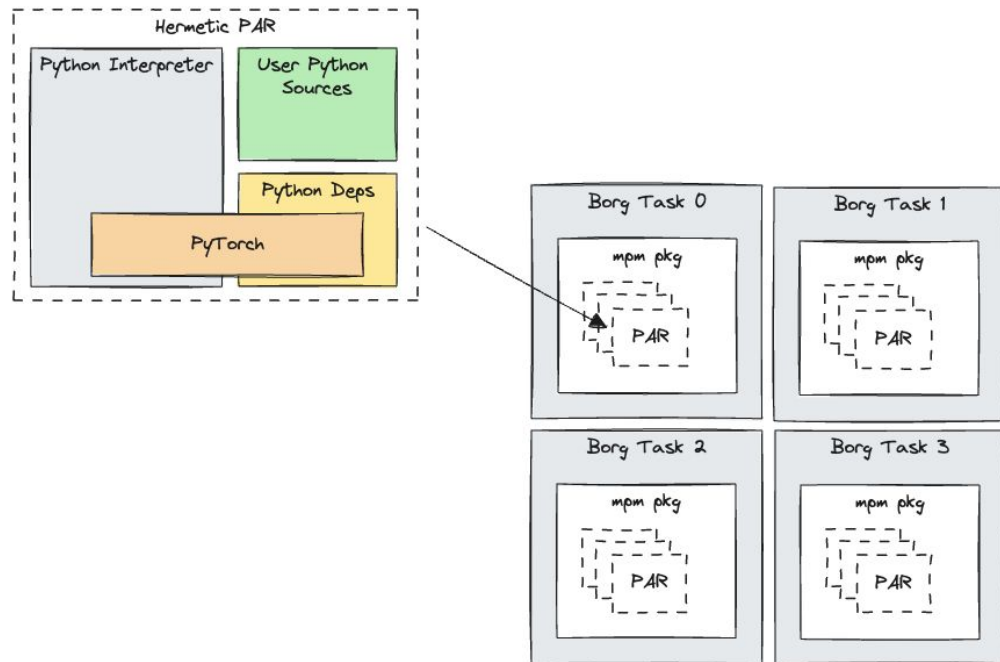
# PyTorch in Google3

Building, Packaging, Running



# Build, Package, Run

- User project packaged up as a PAR file: self-contained executable
- PAR can be run directly for local runs
- One or more PAR files packaged as MPM pkg
- Deployed to Borg as a job

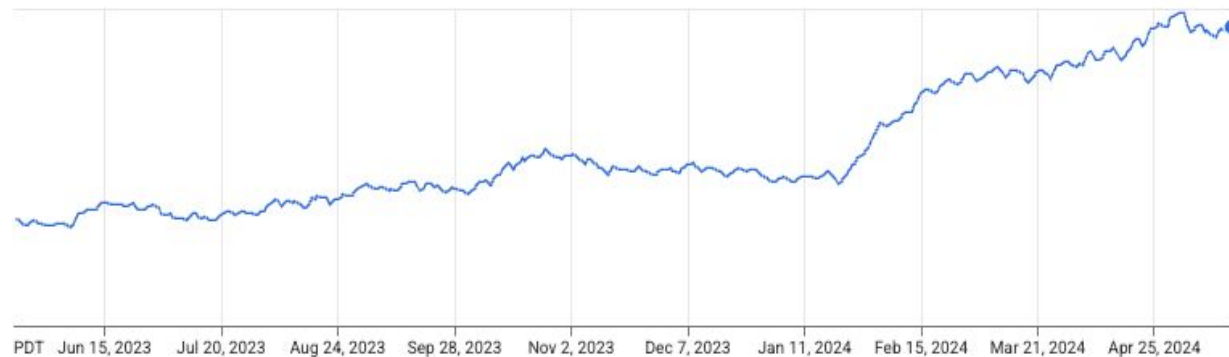




Usage

## Adoption Trend

Mostly research and experimentation driven. Benchmarking/evaluating papers and external models. Hints of production demand. Use JAX for LLMs at scale.





The background features a solid red field. On the left side, there are two large, overlapping curved shapes: a yellow one in the foreground and a darker red one behind it, both curving towards the center. The text 'Work in Progress' is centered in the red area.

Work in  
Progress

# Work in Progress



## PyTorch with JAX as backend

Run PyTorch code using JAX under the hood. Freebie TPU, GSPMD support



## Support PyTorch Ecosystem

Support PyTorch Ecosystem libs in Google3.  
Open source some of our own(?)



## Contributions Upstream

Many Google3 patches can be upstreamed to improve PyTorch overall. Contribute to other aspects of the project: releases, CI/CD, beta-testing, etc



# Thank you

Team PyTorch for Alphabet  
Google CoreML  
We're Hiring!

