



Introduction to Singularity: running containerized applications on HPC

Yucheng Zhang
Bioinformatics Engineer
TTS Research Technology
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Overview

- ❖ What are containers and why should we use them?
- ❖ Container public registries
- ❖ Singularity basics
- ❖ Containers supporting Nvidia-GPU
- ❖ Build your own containers with Docker
- ❖ Simplify container pulling and module generation with container-mod

Pulling and Running Containerized HPC Applications

Introduction

Containers

A **container** is an abstraction for a set of technologies that aim to solve the problem of how to get software to run reliably when moved from one computing environment to another.

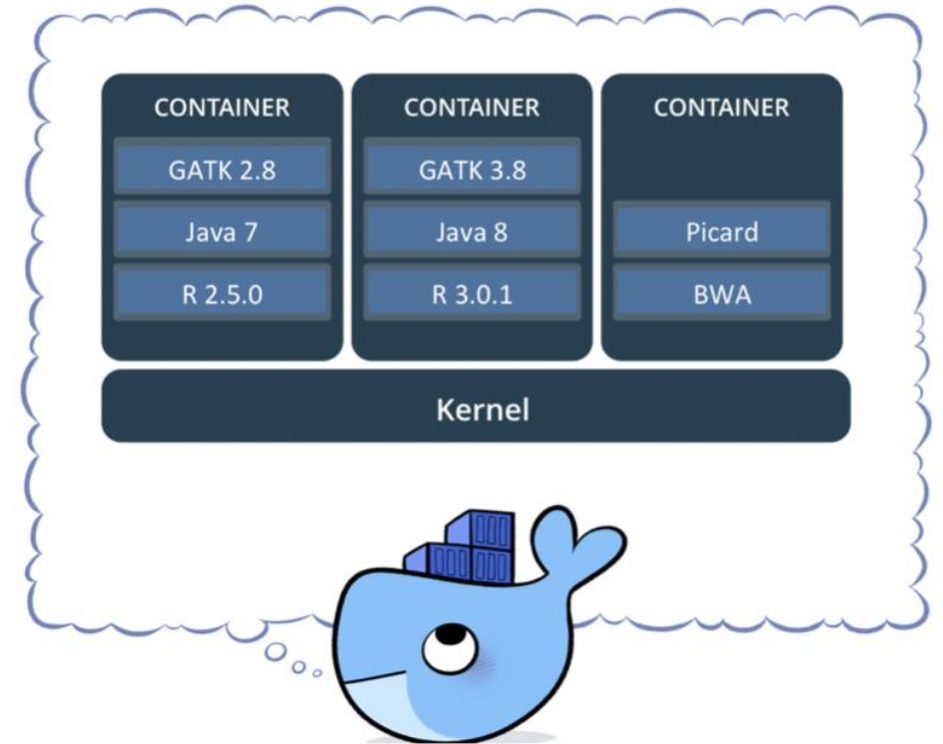
A container **image** is simply a file (or collection of files) saved on disk that stores everything you need to run a target application or applications.

Registry: a place to store (and share) container images.



Why use containers?

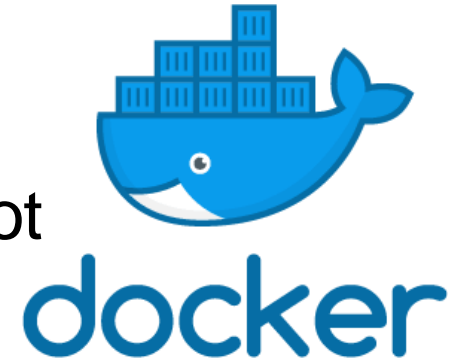
- ❖ Getting organized: containers keep things organized by isolating programs and their dependencies inside containers.
- ❖ Build once, run **almost** anywhere: containers allow us to package up our complete software environment and ship it to other computing environments.
- ❖ Reproducibility: containers can ensure identical versions of apps, libraries, compilers, etc.



Docker

The concept of containers emerged in 1970s, but they were not well known until the emergence of Docker containers in 2013.

Docker is an open source platform for building, deploying, and managing containerized applications.



Trusted by developers Chosen by Fortune 100 companies

Docker provides a suite of development tools, services, trusted content, and automations, used individually or together, to accelerate the delivery of secure applications.



Why not Docker on HPC?

Summarized by Stanford HPC center

- ❖ Docker requires a **daemon** running as **root** on all compute nodes, which poses security risks.
- ❖ All authenticated actions, such as login and push, execute as root. Therefore, those functions cannot be used simultaneously by multiple users on the same node.
- ❖ Docker uses **cgroups** to isolate containers, as does the Slurm scheduler, which uses **cgroups** to allocate resources to jobs and enforce limits. Those uses are unfortunately conflicting.
- ❖ Most importantly, ***allowing users to run Docker containers will give them root privileges inside that container, thereby enabling them to access any of the filesystems on the cluster as root.*** This opens the door to user impersonation, inappropriate file tampering or stealing.

Pulling and Running Containerized HPC Applications

Container registries

Container registry

A **container registry** is a centralized platform where **container images** are stored, managed, and distributed. It acts like a repository for software containers, similar to how GitHub is used for managing source code.

Container registries allow users to **pull (download)** pre-built container images or **push (upload)** their own images for sharing or deployment across various environments, including HPC clusters, cloud platforms, and local machines.

Docker hub

<https://hub.docker.com>



TTS-Research Technology

Community Organization Tufts University Medford, MA <https://it.tufts.edu/about/organization/research-technology-rt> Joined October 21, 2024

Repositories

<https://hub.docker.com/u/tuftsttsrt>

Displaying 1 to 10 of 10 repositories



tuftsttsrt/alphafold3

↓45 · ☆0

By [tuftsttsrt](#) · Updated 20 days ago



tuftsttsrt/metaphlan

↓25 · ☆0

By [tuftsttsrt](#) · Updated a month ago



tuftsttsrt/miniforge

↓24 · ☆0

By [tuftsttsrt](#) · Updated a month ago



tuftsttsrt/openmpi

↓42 · ☆0

By [tuftsttsrt](#) · Updated a month ago

Quay.io Support Team is transitioning to Red Hat Customer Portal. For that reason, support(at)quay.io e-mail address will be disabled after January 1st. Please check out the following article for more information:

<https://access.redhat.com/articles/7099134>.

Quay [builds, analyzes, distributes] your container images

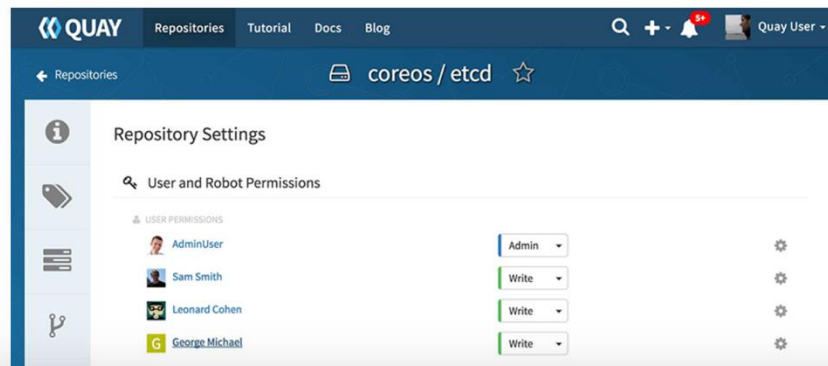
TRY FOR FREE ON PREMISES

TRY FOR FREE ON CLOUD



Store your containers securely

Ensure your apps are stored privately, with access that you control. Quay is teamwork optimized, with powerful access controls.



<https://quay.io>

Explore Catalog

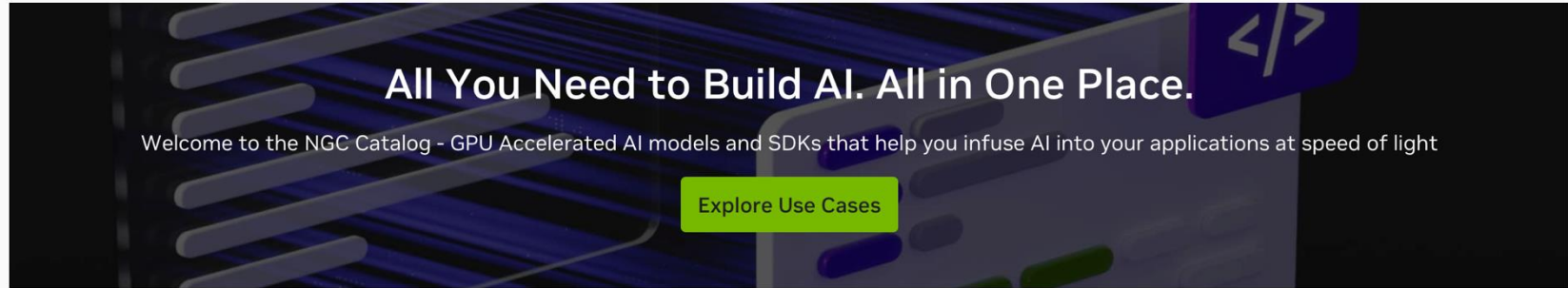
Collections

Containers

Helm Charts

Models

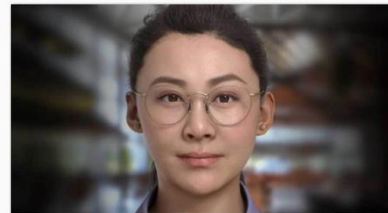
Resources



Search NGC Catalog...

NVIDIA NIM

View All >



Audio2Face-3D

Container

NVIDIA NIM for GPU accelerated Audio2Face-3D inference through gRPC APIs.

NVIDIA AI Enterprise Essentials +1

NVIDIA NIM +1



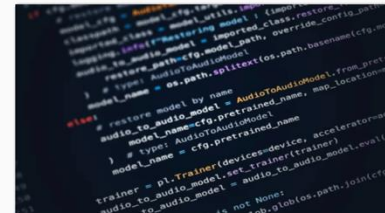
Gemma-2-2B-IT

Container

NVIDIA NIM for GPU accelerated Gemma-2-2B-IT inference through OpenAI compatible APIs

NVIDIA Developer Program +1

NVIDIA NIM +1



CodeLlama-70B-Instruct

Container

NVIDIA NIM for GPU accelerated CodeLlama-70B inference through OpenAI compatible APIs

NVIDIA AI Enterprise Essentials +1

NVIDIA NIM +1



Llama-3.2-11B-Vision-Instruct

Container

The Llama 3.2 Vision instruction-tuned models are optimized for visual recognition, image reasoning...

NVIDIA Developer Program +1

NVIDIA NIM +1

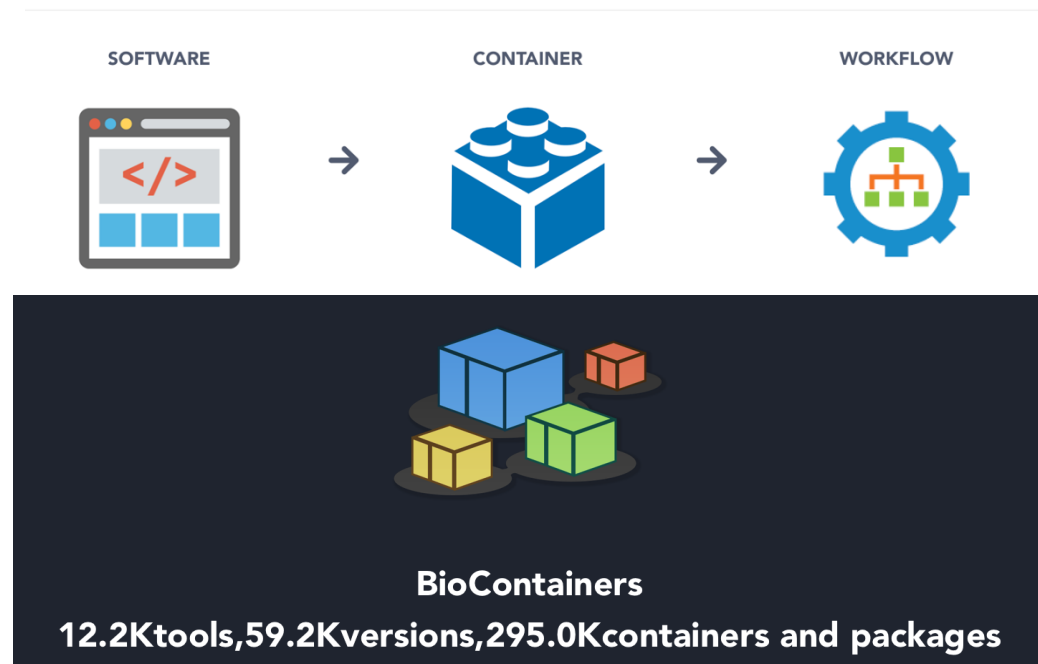
<https://catalog.ngc.nvidia.com>

BioContainers



- ❖ BioContainers is integrated with Bioconda, which is the conda channel for bioinformatics applications.
- ❖ BioContainers registry is the largest registry for bioinformatics applications.
- ❖ As of today, BioContainers provides containers for over 13 thousand bioinformatics applications.

BioContainers Flow



You can find almost all bioinformatics applications from here:

https://bioconda.github.io/conda-package_index.html

Pulling and Running Containerized HPC Applications

Singularity basics

Load singularity module

module purge
module load singularity/3.8.4
module list

\$ module avail singularity

singularity/2.6.1 singularity/3.1.0 singularity/3.5.3
singularity/3.6.1 singularity/3.8.4 (D)

\$ module load singularity

\$ module list

Currently Loaded Modules:

1) squashfs/4.4 2) singularity/3.8.4

Singularity basics

Detailed singularity user guide is available at: sylabs.io/guides/3.8/user-guide

```
singularity [options] <subcommand> [subcommand options ...]
```

- **pull**
- **exec**
- **shell**
- build
- run
- push
- Instance
- help
- ...

Singularity: Docker for HPC systems



- ❖ Singularity was developed in 2015 as an open-source project by researchers at Lawrence Berkeley National Laboratory (LBNL) led by Gregory Kurtzer.
- ❖ Singularity is emerging as the containerization framework of choice in HPC environments.
 1. **Enable researchers to package entire scientific workflows, libraries, and even data.**
 2. **Can use docker images.**
 3. **Does not require root privileges to run.**

pull: download a container from a given URI

singularity pull [output file] URI

Example:

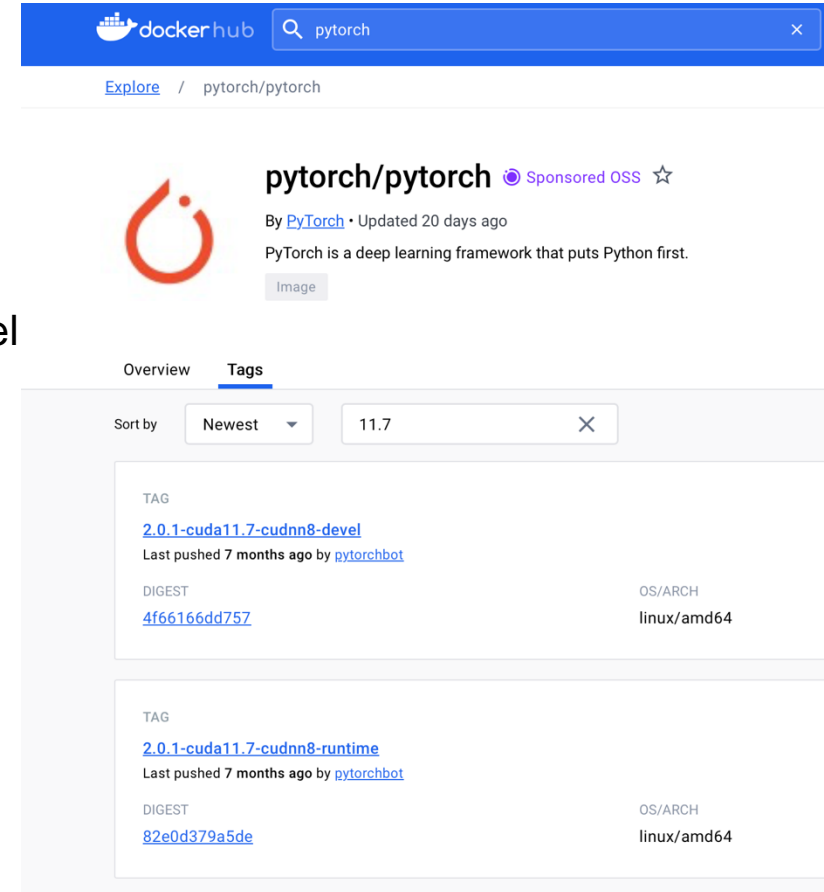
```
singularity pull pytorch_2.0.1.sif docker://pytorch/pytorch:2.0.1-cuda11.7-cudnn8-devel
```

Custom Name

URI

Complete supported URIs list can be found here:

https://docs.sylabs.io/guides/3.8/user-guide/cli/singularity_pull.html



The screenshot shows the Docker Hub interface for the `pytorch/pytorch` repository. The search bar at the top contains "pytorch". The repository name "pytorch/pytorch" is displayed with a "Sponsored OSS" badge. Below the repository name, it says "By PyTorch · Updated 20 days ago" and "PyTorch is a deep learning framework that puts Python first." There is an "Image" button. The "Tags" tab is selected, showing a list of tags. The first tag is `2.0.1-cuda11.7-cudnn8-devel`, last pushed 7 months ago by `pytorchbot`. The digest is `4f66166dd757` and the OS/ARCH is `linux/amd64`. The second tag is `2.0.1-cuda11.7-cudnn8-runtime`, also last pushed 7 months ago by `pytorchbot`. The digest is `82e0d379a5de` and the OS/ARCH is `linux/amd64`.

pull: examples

```
docker pull quay.io/biocontainers/blast:<tag>
(see `blast/tags`_ for valid values for ``<tag>``)
```

docker pull quay.io/biocontainers/blast:2.15.0--pl5321h6f7f691_1 → **singularity** pull **docker://**quay.io/biocontainers/blast:2.15.0--pl5321h6f7f691_1

TAG

[2.1.2-cuda11.8-cudnn8-devel](#)

Last pushed 14 days ago by [pytorchbot](#)

DIGEST

[66b41f1755d9](#)

OS/ARCH

linux/amd64

COMPRESSED SIZE ⓘ

8.48 GB

```
docker pull pytorch/pytorch:2.1...
```

docker pull pytorch/pytorch:2.1.2-cuda11.8-cudnn8-devel → **singularity** pull **docker://**pytorch/pytorch:2.1.2-cuda11.8-cudnn8-devel

TAG

[2.15.0.post1-gpu](#)

Last pushed a month ago by [tensorflowpackages](#)

DIGEST

[dc97d4feec5d](#)

OS/ARCH

linux/amd64

COMPRESSED SIZE ⓘ

3.45 GB

```
docker pull tensorflow/tensorflo...
```

docker pull tensorflow/tensorflow:2.15.0.post1-gpu → **singularity** pull **docker://**tensorflow/tensorflow:2.15.0.post1-gpu

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r/docker • 1 yr. ago travprev

How do you know you're downloading a safe / legitimate container?

It seems like the docker libraries are the wild west... possibly worse than the Play Store for Android. How do you know, or how can you verify that the container you're downloading is safe, free of spyware, malware, etc.?

Sorry if this seems like a 101 question, but I am very new to docker. Thanks.

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elementary_os • 1y ago

the first thing is we don't download containers, we pull images and create a container from it. The images marked as "Trusted build" are built by Docker on their server from the sources given by the user. You can easily check the Dockerfile from where the image have been built to check for malicious code.

You also have the 'official' images (those that does not start with 'something/') that are officially supported by Docker. If you trust Docker, inc, you can trust those image.

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Docker: An open source project to pack, ship and run any application as a lightweight container

[Docker](http://www.docker.io) is an open-source project to easily create lightweight, portable, self-sufficient containers from...

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How do you know if a mod is working?

3 upvotes · 3 comments

r/tryhackme • 1 yr. ago

How do you find the IP of a server you are trying to access?

https://www.reddit.com/r/docker/comments/1ax26jp/how_do_you_know_youre_downloading_a_safe/

shell: run a shell within a container

singularity shell [options] image

Example:

```
singularity shell pytorch_2.1.1.sif
```

```
Singularity> more /etc/os-release  
NAME="Ubuntu"  
VERSION="20.04.5 LTS (Focal Fossa)"  
ID=ubuntu  
ID_LIKE=debian  
PRETTY_NAME="Ubuntu 20.04.5 LTS"  
VERSION_ID="20.04"
```

```
Singularity> python  
Python 3.10.11 (main, Apr 20 2023, 19:02:41) [GCC 11.2.0] on linux  
Type "help", "copyright", "credits" or "license" for more information.  
>>> import torch  
>>> torch.cuda.is_available()  
True  
>>> torch.cuda.get_device_name(0)  
'NVIDIA A100 80GB PCIe'
```

```
Singularity> exit ## To exit container, and go back to host
```

EXEC: run executables/scripts

singularity exec [options] image command

Examples:

singularity exec pytorch_2.1.1.sif **python**

singularity exec r_4.3.1_scrnaseq.sif **Rscript** myscript.R

singularity exec trinityrnaseq_trinityrnaseq:2.15.1.sif **Trinity -h**

Cache

```
$ ncd u $HOME
```



To mitigate this, users can either run the singularity pull command with **--disable-cache**

singularity pull --disable-cache URI

or manually clean **\$HOME/.singularity/cache**

or export **SINGULARITY_CACHEDIR=/cluster/tufts/XXXX**

```
ncdu 1.15.1 ~ Use the arrow keys to navigate
--- /cluster/home/yzhang85 -----
67.9 GiB [#####] /.singularity
 5.1 GiB [          ] /.apptainer
 1.3 GiB [          ] /R
797.7 MiB [          ] /.local
595.6 MiB [          ] /.conda
480.3 MiB [          ] /.vscode-server
341.7 MiB [          ] /.cache
318.7 MiB [          ] /nf-core
313.1 MiB [          ] r-base_4.3.2.sif
223.1 MiB [          ] /.config
189.9 MiB [          ] /ood_tufts_apps
185.4 MiB [          ] /bin
140.4 MiB [          ] /svn
 76.2 MiB [          ] /ondemand
 74.2 MiB [          ] /.nextflow
```

Don't run ncd u on login nodes

Pulling and running Containerized HPC Applications

Environment modules

NGC container environment modules

NGC container environment modules are lightweight wrappers that make it possible to transparently use NGC containers as environment modules.

1. Allow HPC users to utilize familiar environment module commands.
2. Leverage all the benefits of containers, including portability and reproducibility.

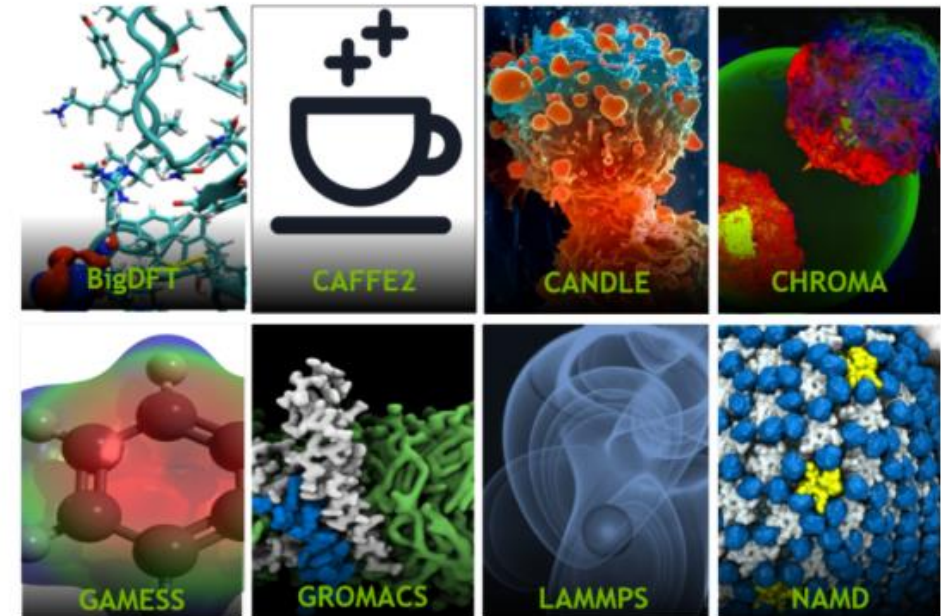
<https://github.com/NVIDIA/ngc-container-environment-modules>

Simplifying HPC Workflows with NVIDIA NGC Container Environment Modules

By Akhil Docca and Scott McMillan

Discuss (2) 0 Like

Tags: AI, Deep Learning, HPC / Supercomputing, machine learning, NGC, singularity





Nvidia GPU-optimized tools for deep learning, machine learning, and high-performance computing.

<https://catalog.ngc.nvidia.com/>

```
[lyzhang85@s1cmp006 ~]$ module load ngc  
[lyzhang85@s1cmp006 ~]$ module av
```

```
----- /cluster/tufts/ngc/modules -----  
gromacs/2021.3   gromacs/2023   lammps/10Feb2021  nvhpc/21.5   parabricks/4.4.0-1   (D)   tensorflow/2.15.0  
gromacs/2022.5   gromacs/2023.2 lammps/15Jun2023  nvhpc/21.9   pytorch/2.5.1-cuda12.1-cudnn9 (L)
```

```
# Load ngc
```

```
module load ngc
```

```
# Check available applications
```

```
module avail
```

```
# Load and run specific tools
```

```
module load pytorch/2.5.1-cuda12.1-cudnn9
```

No need to load cuda and cudnn modules

```
[yzhang85@s1cmp006 ~]$ module load ngc
[yzhang85@s1cmp006 ~]$ module load pytorch/2.5.1-cuda12.1-cudnn9
[yzhang85@s1cmp006 ~]$ python
Python 3.11.10 | packaged by conda-forge | (main, Oct 16 2024, 01:27:36) [GCC 13.3.0] on linux
Type "help", "copyright", "credits" or "license" for more information.
>>> import torch
>>> # Check if GPU is available
>>> device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
>>> print(f"Using device: {device}")
Using device: cuda
>>> # Simple tensor computation on GPU
>>> x = torch.tensor([1.0, 2.0, 3.0], device=device)
>>> y = torch.tensor([4.0, 5.0, 6.0], device=device)
>>> result = x + y
>>> print(f"Result on {device}: {result}")
Result on cuda: tensor([5., 7., 9.], device='cuda:0')
```

Biocontainers @ Tufts

/cluster/tufts/biocontainers/modules			
abcreg/0.1.0	fasttree/2.1.11	(D) nf-core-fetchngs/1.11.0	qiime2/2023.5
abyss/2.3.7	filtlong/0.2.1	nf-core-fetchngs/1.12.0	(D) qiime2/2023.7
af2_binder_design/1.0.0	flye/2.9	nf-core-funcscan/1.1.4	qiime2/2023.9
alphafold/2.3.0	flye/2.9.1	nf-core-funcscan/1.1.5	(D) qiime2/2024.2
alphafold/2.3.1	flye/2.9.2	nf-core-hic/2.1.0	qualimap/2.2.1
alphafold/2.3.2	(D) fqtk/0.3.0	nf-core-mag/2.5.2	qualimap/2.3
alphafold3/3.0.0	gatk4/4.2.6.1	nf-core-mag/2.5.4	r-bioinformatics/4.3.2
amplify/2.0.0	gatk4/4.3.0.0	nf-core-mag/3.0.0	r-bioinformatics/4.4.0
angsd/0.939	gatk4/4.5.0.0	nf-core-mag/3.0.2	(D) r-scrnaseq/4.2.3
angsd/0.940	(D) genomad/1.8.1	nf-core-mag/3.1.0	r-scrnaseq/4.3.1
bakta/1.9.3	geomx_ngs_pipeline/3.1.1.6	nf-core-metadenovo/1.0.0	r-scrnaseq/4.3.2
bbmap/38.93	guppy/6.4.6	nf-core-metadenovo/1.0.1	(D) r-scrnaseq/4.4.0
bbmap/38.96	(D) guppy/6.5.7	nf-core-methylseq/2.6.0	r-shinyngs/1.8.5
bbtools/39.00	hap.py/0.3.12	nf-core-multiplesequencealign/1.0.0	raven-assembler/1.8.1
bcftools/1.13	hclust2/1.0.0	nf-core-nanoseq/3.1.0	raxml-ng-mpi/1.2.0
bcftools/1.14	hisat2/2.2.1	nf-core-nanostring/1.2.1	raxml-ng-mpi/1.2.2
bcftools/1.17	hmmer/3.3.2	nf-core-nanostring/1.3.0	(D) relion/4.0.1
bcftools/1.20	(D) homer/4.11	nf-core-pairgenomealign/1.0.0	relion/5.0
beast2/2.6.3	htseq/2.0.2	nf-core-pangenome/1.1.0	rmats2sashimiplo/2.0.4
beast2/2.6.4	humann/3.8	nf-core-pangenome/1.1.1	rmats2sashimiplo/3.0.0
beast2/2.6.6	(D) impute2/2.3.2	nf-core-pangenome/1.1.2	(D) rnaquast/2.2.3
bedops/2.4.39	iqtree/2.3.0	nf-core-proteinfold/1.1.0	rosettafold2/default
bedtools/2.30.0	iqtree/2.3.6	nf-core-raredisease/2.0.1	rosettafold2na/0.2
bedtools/2.31.0	kallisto/0.46.2	nf-core-rnafusion/3.0.1	salmon/1.9.0
biobakery_workflows/3.0.0.a.7	kallisto/0.48.0	nf-core-rnafusion/3.0.2	salmon/1.10.1
biobakery_workflows/3.1	(D) kneaddata/0.12.0	nf-core-rnaseq/3.14.0	(D) samtools/1.16
biopython/1.83	kraken2/2.1.3	nf-core-rnaseq/3.16.0	samtools/1.17
blast/2.15.0	krakentools/1.2	nf-core-rnaseq/3.17.0	(D) samtools/1.21
blast/2.16.0	macs2/2.2.7.1	nf-core-rnasplce/1.0.2	scanpy/1.10.1
bowtie2/2.4.2	macs3/3.0.0a6	nf-core-rnasplce/1.0.3	scvelo/0.3.2
bowtie2/2.5.1	(D) masurca/4.0.9	nf-core-rnasplce/1.0.4	signalp6/6.0-fast
breseq/0.38.2	masurca/4.1.0	nf-core-sarek/3.4.0	signalp6/6.0-slow
breseq/0.38.3	medaka/1.11.1	nf-core-sarek/3.4.1	(D) snpeff/5.2
breseq/0.39.0	(D) megahit/1.2.9	nf-core-sarek/3.4.3	snpsift/5.2
busco/5.4.1	megan/6.25.9	nf-core-sarek/3.4.4	spaceranger/1.3.1
busco/5.4.7	(D) meme/5.5.5	nf-core-scnanoseq/1.0.0	spaceranger/2.0.0

At Tufts HPC, we look forward to deploying bioinformatics applications based on containers wherever possible.

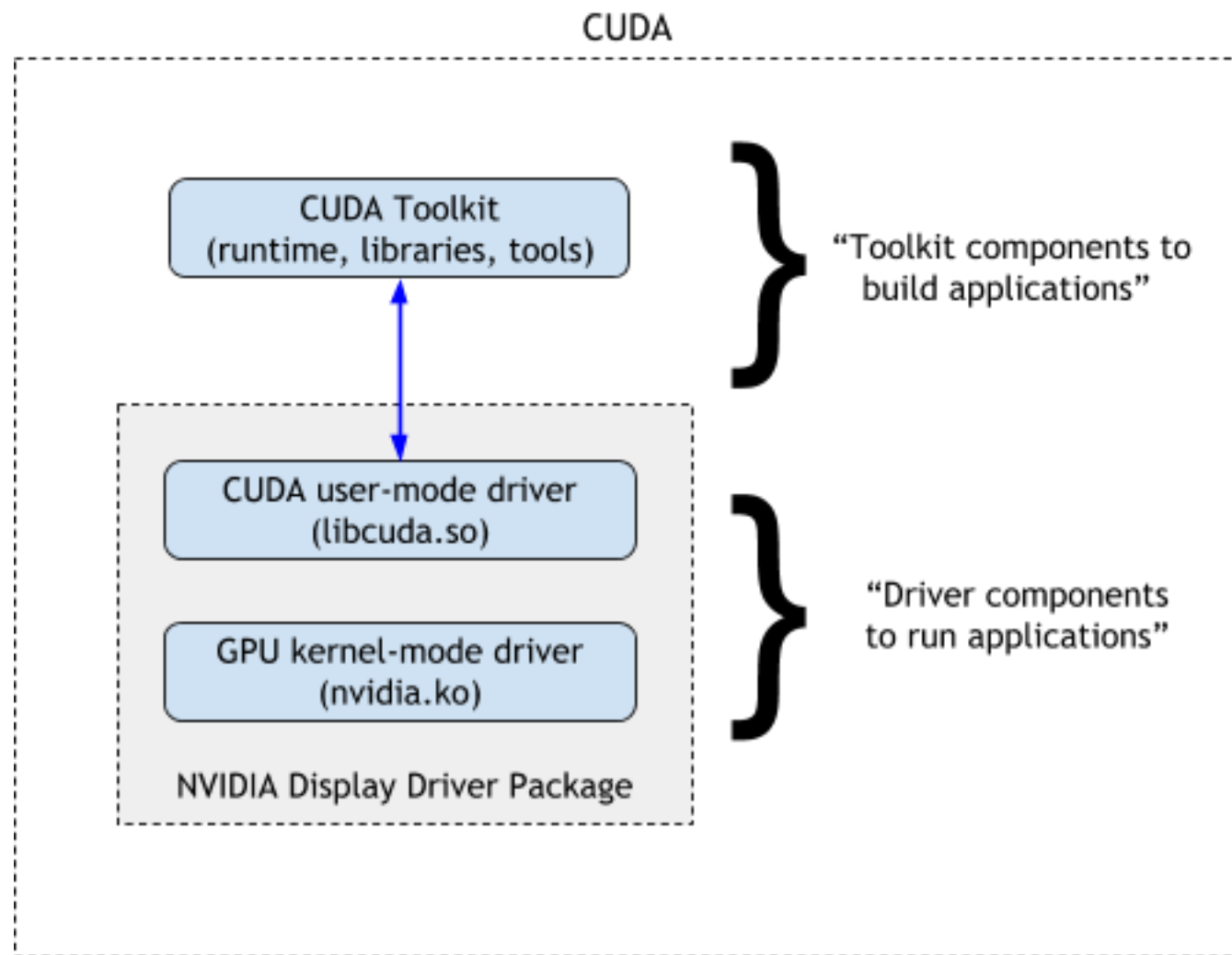
Pulling and Running Containerized HPC Applications

Nvidia GPU

CUDA Compatibility

In order to run a CUDA application, the system should have a CUDA enabled GPU and an NVIDIA display driver that is compatible with the CUDA Toolkit that was used to build the application itself. If the application relies on dynamic linking for libraries, then the system should have the right version of such libraries as well.

Detailed info can be found on Nvidia [website](#).



nvidia-smi: the maximum supported CUDA Toolkit version

```
[yzhang85@d1cmp050 ~]$ nvidia-smi  
Mon Dec 16 12:01:12 2024
```

```
+-----+  
| NVIDIA-SMI 535.154.05                 Driver Version: 535.154.05   CUDA Version: 12.2   |  
+-----+  
| GPU  Name           Persistence-M | Bus-Id        Disp.A | Volatile Uncorr. ECC |  
| Fan  Temp    Perf     Pwr:Usage/Cap |      Memory-Usage | GPU-Util  Compute M. |  
|                                           |                  |           MIG M.     |  
+-----+  
|    0   NVIDIA L40           On          | 00000000:CA:00.0 Off  |           0          |  
| N/A   31C    P8             35W / 300W |  0MiB / 46068MiB |    0%      Default  |  
|                                           |                  |           N/A       |  
+-----+  
  
+-----+  
| Processes:                               |  
| GPU  GI    CI           PID  Type  Process name                      GPU Memory |  
|     ID    ID                                   |              Usage                    |  
+-----+  
| No running processes found              |  
+-----+
```



pytorch/pytorch Sponsored OSS

By [PyTorch](#) · Updated 2 months ago

PyTorch is a deep learning framework that puts Python first.

IMAGE

DATA SCIENCE

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MACHINE LEARNING & AI

GEN AI

☆1.3K ↓10M+

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TAG

[2.5.1-cuda12.4-cudnn9-devel](#)

Last pushed 2 months ago by [pytorchbot](#)

This may not work with our GPU node

```
docker pull pytorch/pytorch:2.5.1-cuda12.4-cudnn9-devel
```

Copy

Digest

[14611869895d](#)

OS/ARCH

linux/amd64

Compressed size ⓘ

6.91 GB

TAG

[2.5.1-cuda12.4-cudnn9-runtime](#)

Last pushed 2 months ago by [pytorchbot](#)

```
docker pull pytorch/pytorch:2.5.1-cuda12.4-cudnn9-runtime
```

Copy

Digest

OS/ARCH

Compressed size ⓘ

--nv

To run Nvidia GPU-enabled containers, add **--nv** option to **exec**, **run** or **shell** commands.

```
singularity shell --nv pytorch_2.1.1.sif
```

```
singularity run --nv pytorch_2.1.1.sif
```

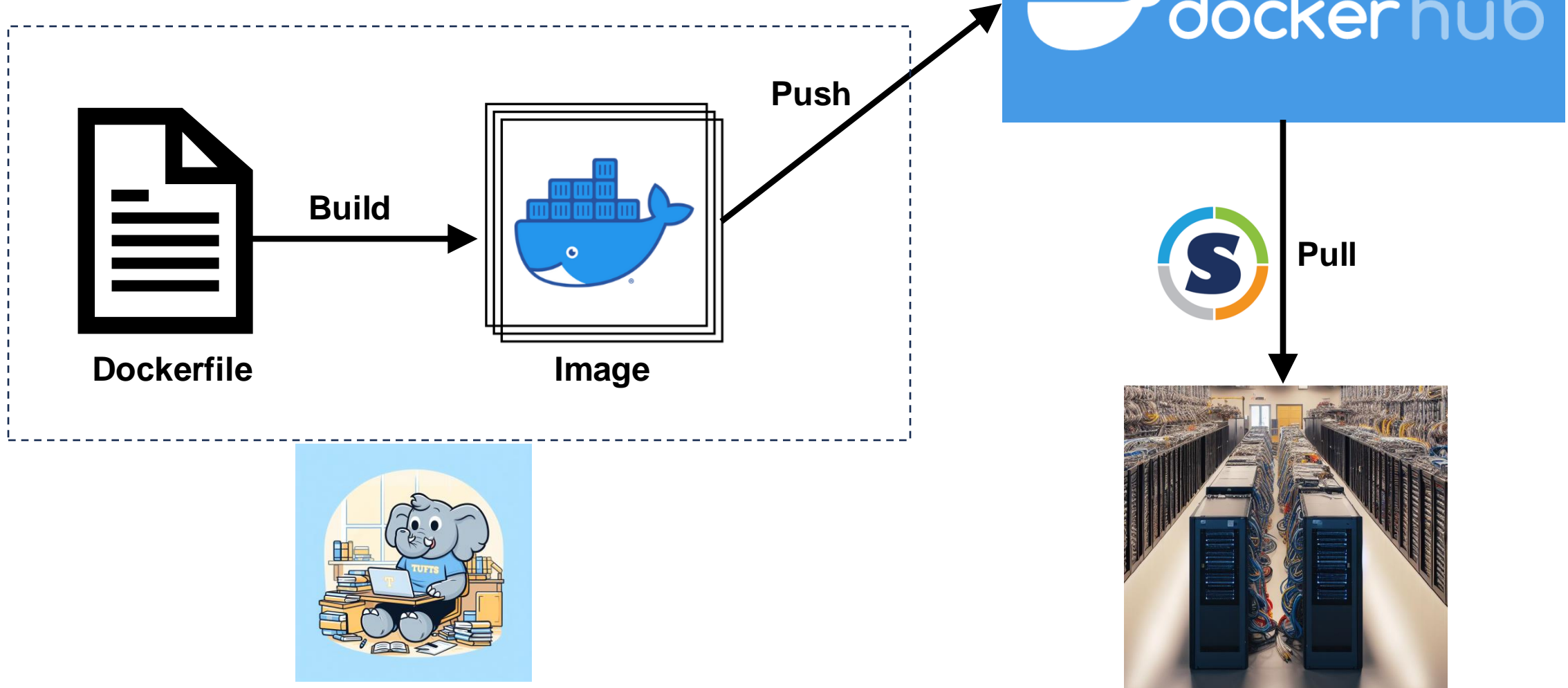
```
singularity exec --nv pytorch_2.1.1.sif python
```

There is no need to load cuda and cudnn modules.

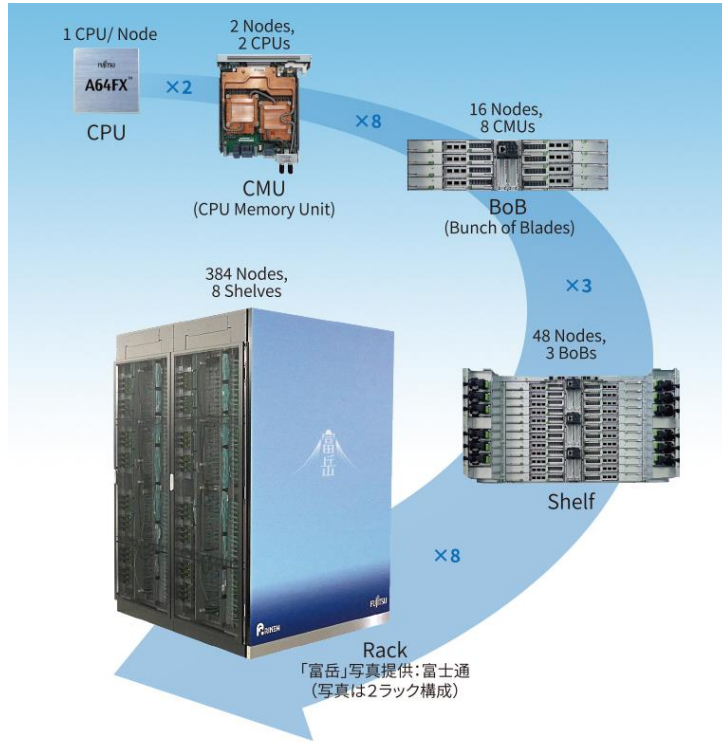
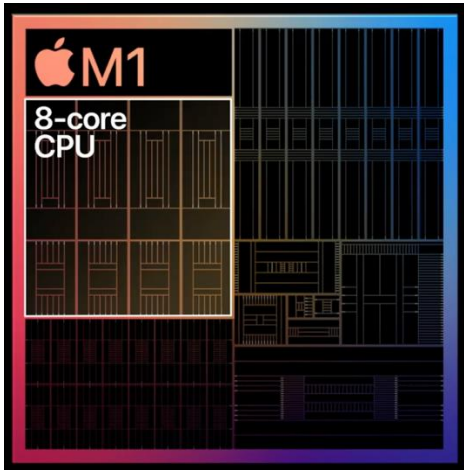
Pulling and Running Containerized HPC Applications

docker build

How to build your own container: Docker



CPU Architecture Matters



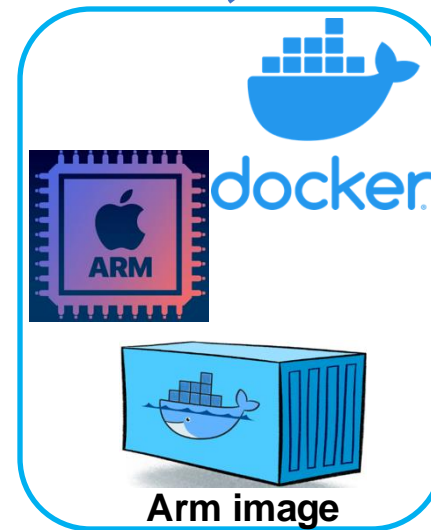
`docker build -t Username/AppName:tag .`



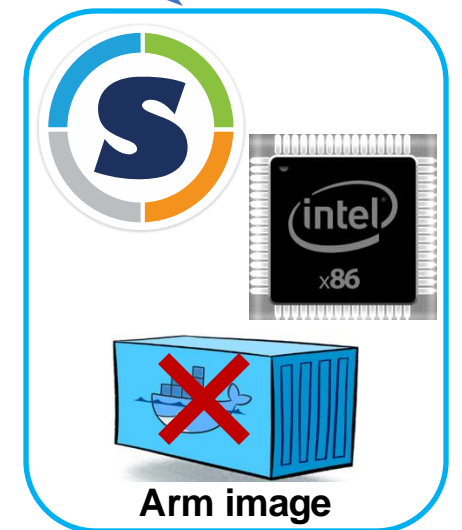
docker hub

Push

Pull



Arm image
Build



Arm image
Run

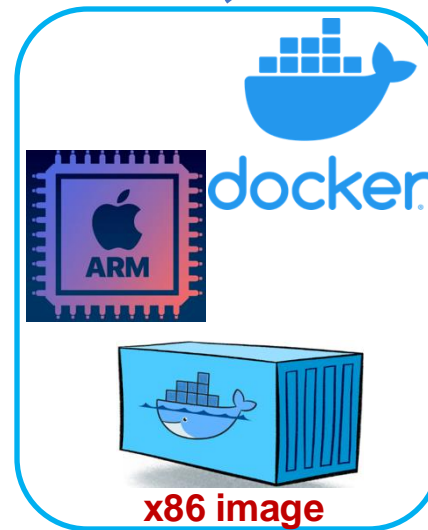
Build containers for Tufts HPC using your Macbook



```
docker build --platform linux/amd64 -t UserName/AppName:tag .
```

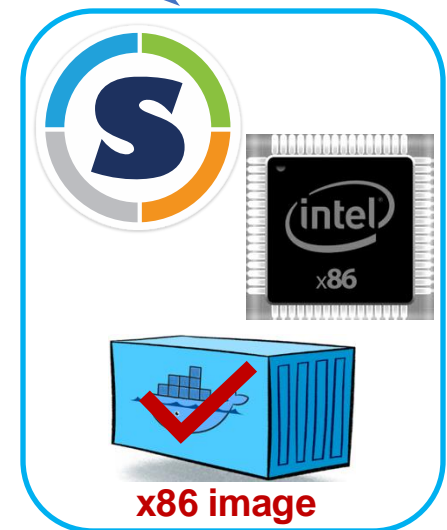
Push

Pull



x86 image

Build



x86 image

Run

Pulling and Running Containerized HPC Applications

container-mod

container-mod

- ❖ container-mod streamlines the process of pulling containers from public registries and automatically generating ready-to-use modulefiles. It is a versatile tool designed for use by HPC system administrators and group managers to create and manage modules accessible to all HPC users or group members. Additionally, regular users can leverage container-mod to create personal modulefiles for their individual workflows, enhancing efficiency and reproducibility in HPC environments.

<https://github.com/TuftsRT/container-mod>

Pulling a container and generating its module

Pull the image

```
$ module load container-mod
```

```
$ container-mod pipe URI
```

Load the module

```
$ module load use.own
```

```
$ module load myapp/x.xx.x
```

Example1: fastp

```
[yzhang85@login-prod-02 ~]$ module load container-mod
[yzhang85@login-prod-02 ~]$ container-mod pipe -p docker://staphb/fastp:0.24.0
No profile specified. Running in personal mode!
Processing URI: docker://staphb/fastp:0.24.0 with the subcommand: pull
INFO:   Converting OCI blobs to SIF format
INFO:   Starting build...
Getting image source signatures
Copying blob 6414378b6477 skipped: already exists
Copying blob 863c05946a95 done
Copying blob 00b70a144829 done
Copying blob d566c8e1bb83 done
Copying config 88a3b79e69 done
Writing manifest to image destination
Storing signatures
2025/01/10 10:43:07  info unpack layer: sha256:6414378b647780fee8fd903ddb9541d134a1947ce092d08bdeb23a54cb3684ac
2025/01/10 10:43:08  info unpack layer: sha256:863c05946a95d85b7b6d14ba496ea3ddfcb0392c37ba6d350954b13803136ee4
2025/01/10 10:43:08  info unpack layer: sha256:00b70a14482901d10fb235282318e8fab6b87b5fe772e13c60bc9552fac5130c
2025/01/10 10:43:08  info unpack layer: sha256:d566c8e1bb83becfe86505a4d5174f20e652508f3562bd36ea008e6434435153
INFO:   Creating SIF file...
Processing URI: docker://staphb/fastp:0.24.0 with the subcommand: module
Remember to edit '/cluster/home/yzhang85/privatemodules/fastp/0.24.0.lua' stub (look for TODO: labels!)

Processing URI: docker://staphb/fastp:0.24.0 with the subcommand: exec
Generating executables provided by fastp version 0.24.0...
Successfully generated: fastp
+-----+
| To use this module, load the following modules:                               |
|                                                                                   |
|   module load use.own                                                         |
|   module load fastp/0.24.0                                                    |
|                                                                                   |
| The modulefile is located at: /cluster/home/yzhang85/privatemodules/fastp/0.24.0.lua |
+-----+
[yzhang85@login-prod-02 ~]$ module load use.own
[yzhang85@login-prod-02 ~]$ module load fastp/0.24.0
[yzhang85@login-prod-02 ~]$ fastp -h
option needs value: --html
usage: /usr/local/bin/fastp [options] ...
```

Containers supporting Jupyter

```
$ module load container-mod  
$ container-mod pipe -j URI  
or  
$ container-mod pipe --jupyter URI
```

Requirements

`ipykernel` is installed in the container

With `-j` or `--jupyter` option, the script will generate a `kernel.json` into `$HOME/.local/share/jupyter/kernels/XX/`



TensorFlow

Example2: tensorflow

container-mod pipe --jupyter docker://tuftsttsrt/tensorflow:2.15.0

To use this module, load the following modules:

```
module load use.own
module load tensorflow/2.15.0
```

The modulefile is located at: /cluster/home/yzhang85/privatemodules/tensorflow/2.15.0.lua

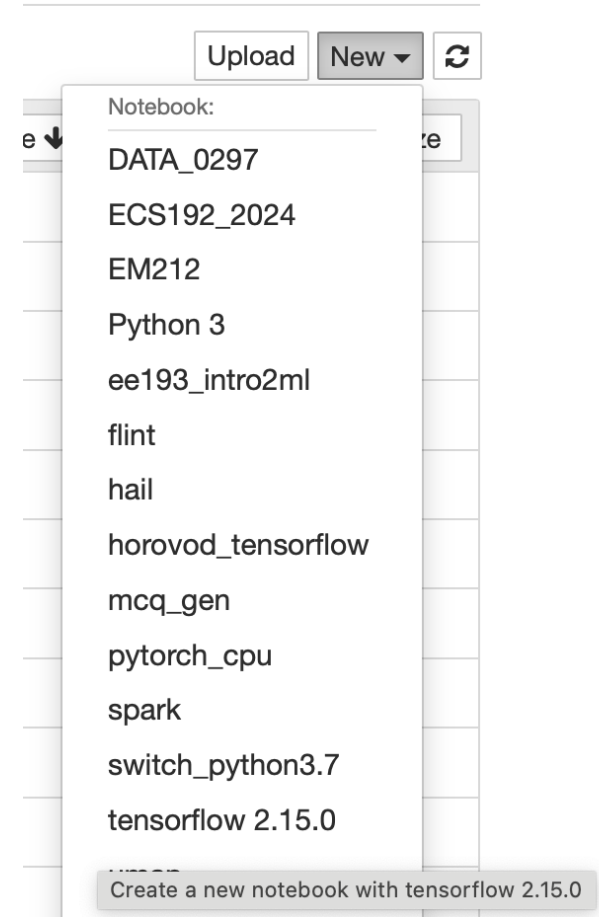
```
Generating Jupyter kernel for tensorflow version 2.15.0
Jupyter kernel created: tensorflow-2.15.0
```

You can now launch Jupyter notebook/lab and select the kernel:

```
tensorflow 2.15.0
```

If you'd like to edit the kernel, you can find it at:

```
/cluster/home/yzhang85/.local/share/jupyter/kernels/tensorflow-2.15.0
```



```
ondemand.pax.tufts.edu
```

Jupyter Untitled3 Last Checkpoint: 11/16/2023 (autosaved) Logout

File Edit View Insert Cell Kernel Help Trusted tensorflow 2.15.0

```
In [1]: import tensorflow as tf

# Check if TensorFlow detects a GPU
print("Num GPUs Available: ", len(tf.config.list_physical_devices('GPU')))

if tf.config.list_physical_devices('GPU'):
    print("TensorFlow is using GPU(s):")
    for gpu in tf.config.list_physical_devices('GPU'):
        print(" -", gpu)
else:
    print("TensorFlow is not using GPU. Check your installation and configuration.")

# A simple computation to test the GPU
a = tf.constant([1.0, 2.0, 3.0], shape=[3, 1], name='a')
b = tf.constant([1.0, 2.0, 3.0], shape=[1, 3], name='b')
c = tf.matmul(a, b)

print("Result of matrix multiplication using TensorFlow:\n", c)

2025-01-10 15:52:35.538739: I tensorflow/core/util/port.cc:113] oneDNN custom operations are on. You may see slightly different numerical results due to floating-point round-off errors from different computation orders. To turn them off, set the environment variable `TF_ENABLE_ONEDNN_OPTS=0`.
2025-01-10 15:52:36.815169: E external/local_xla/xla/stream_executor/cuda/cuda_dnn.cc:9261] Unable to register cuDNN factory: Attempting to register factory for plugin cuDNN when one has already been registered
2025-01-10 15:52:36.815200: E external/local_xla/xla/stream_executor/cuda/cuda_fft.cc:607] Unable to register cuFFT factory: Attempting to register factory for plugin cuFFT when one has already been registered
2025-01-10 15:52:36.908383: E external/local_xla/xla/stream_executor/cuda/cuda_blas.cc:1515] Unable to register cuBLAS factory: Attempting to register factory for plugin cuBLAS when one has already been registered
2025-01-10 15:52:37.059869: I tensorflow/core/platform/cpu_feature_guard.cc:182] This TensorFlow binary is optimized to use available CPU instructions in performance-critical operations.
To enable the following instructions: AVX2 AVX512F AVX512_VNNI FMA, in other operations, rebuild TensorFlow with the appropriate compiler flags.

Num GPUs Available: 1
TensorFlow is using GPU(s):
- PhysicalDevice(name='/physical_device:GPU:0', device_type='GPU')
Result of matrix multiplication using TensorFlow:
tf.Tensor(
[[1. 2. 3.]
 [2. 4. 6.]
 [3. 6. 9.]], shape=(3, 3), dtype=float32)

2025-01-10 15:52:43.097276: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1929] Created device /job:localhost/replica:0/task:0/device:GPU:0 with 38375 MB memory: -> device: 0, name: NVIDIA A100-PCIE-40GB, pci bus id: 0000:a
```

Summary

- ❖ Always use the latest version of singularity modules
- ❖ To ensure that you're not wasting your time building your own containers, it's recommended to check if there are any publicly available containers that can serve your purpose.
- ❖ If you plan to use GPU containers, ensure compatibility between the CUDA version that was used to build the target application inside container and our GPU's CUDA driver version.
- ❖ When running containers that require GPU, make sure to include the **--nv** flag.
- ❖ Remember to use **ncdu**, a helpful tool, to regularly check and clean up **\$HOME/.singularity** directories.

Thank you

Ticket: tts-research@tufts.edu

Email: yzhang85@tufts.edu

Consultation: <https://go.tufts.edu/yucheng>

[Slides & Hands-on](#)