

# NGC Catalog

User Guide

#### Table of Contents

Chapter 1. What is the NGC Catalog?	1
Chapter 2. Terms and Concepts	3
Chapter 3. Why NGC Software	5
Chapter 4. Accessing NGC Software	6
Chapter 5. Registering and Activating a New NGC Org to Obtain Authenticated Access	8
5.1. Signing Up for an NVIDIA Account and Activating a New NGC Org 5.2. Generating NGC API Keys	8 12
Chapter 6. Introduction to the NGC Catalog and NGC CLIs 6.1. Installing NGC Catalog CLI	. <mark>15</mark> 16 16
Chapter 7. Al Foundation Models	. 17
Chapter 8. Docker Containers 8.1. What Is a Docker Container? 8.2. Why Use A Container?	.20 .20 .20 .20
Chapter 9. NGC Container Images in NGC Catalog 9.1. Why NGC Container Images? 9.1.1. NGC Container Security Policy	. <mark>28</mark> 28 29
9.1.2. NVIDIA Security Risk Scale 9.1.3. GPU-performance tests for NGC Catalog Container Images 9.2. NVIDIA Container Toolkit	. 29 30 . 30
9.3. NVIDIA CUDA Toolkit 9.4. Running Singularity Containers	30 31
9.4.2. Converting to Singularity Image 9.4.3. Running the Singularity Container	.31 .32
9.4.3.1. Directory Access 9.4.3.2. Command Line Execution with Singularity	33 33
Chapter 10. Prerequisites for Using NGC Catalog Container Images 10.1. Prerequisites for Using NGC Containers on DGX Systems	.33 . <mark>34</mark> 34
10.2. Prerequisites for Using NGC Containers on Cloud Platforms	34

10.3. Prerequisites for Using NGC Containers on Other NVIDIA GPUs	35
10.4. HPC Visualization Containers	35
10.4.1. Prerequisites For HPC Visualization Containers	36
10.4.2. Installing NVIDIA Docker 2.0	36
10.4.3. ParaView With NVIDIA Holodeck	37
10.4.4. ParaView With NVIDIA IndeX	37
10.4.4.1. Single-Machine With GLX	38
10.4.4.2. Server Container With EGL	38
10.4.4.3. GLX Client Connecting To A Server	38
10.4.5. ParaView With NVIDIA OptiX	38
10.4.5.1. Single-Machine Container With GLX	39
10.4.5.2. Server Container With EGL	39
10.4.5.3. Running The GLX Client And Attaching To The Server	39
10.4.5.4. Optional: Using The ParaView .config File	40
Chapter 11. Pulling NGC Containers from NGC Catalog	41
11.1. Key NGC Container Registry Terminology	41
11.2. Accessing And Pulling an NGC Container Image via the Docker CLI	42
11.2.1. Logging in to the NGC container registry	42
11.2.2. Pulling a Container from NGC Container Registry Using Docker CLI	43
11.3. Accessing and Pulling an NGC Catalog Container Using NGC CLI	44
11.3.1. Viewing Container Image Information	44
11.3.2. Pulling a Container Image	45
Chapter 12. NGC Container Image Versions	46
Chapter 13. NVIDIA Signed Container Images in NGC Catalog	47
13.1. Checking for Signed Container Images	47
13.1.1. Using the NGC Catalog Ul	47
13.1.2. Using the NGC CLI	49
13.2. Finding NVIDIA's Public Key	50
13.2.1. Using the NGC Catalog Ul	50
13.2.2. Using the NGC CLI	51
13.3. Verifying NVIDIA's Signature	51
13.3.1. Using Cosign	51
13.3.2. Using an Admission Controller in Kubernetes Clusters	52
Chapter 14. Running an NGC Container	53
14.1. Enabling GPU Support for NGC Containers	53
14.2. Running NGC Containers with Runtime Resources	55
14.2.1. Specifying A User	56

14.2.2. Setting The Remove Flag	56
14.2.3. Setting The Interactive Flag	56
14.2.4. Setting The Volumes Flag	57
14.2.5. Setting The Mapping Ports Flag	57
14.2.6. Setting The Shared Memory Flag	58
14.2.7. Setting The Restricting Exposure Of GPUs Flag	58
14.2.8. Container Lifetime	58
Chapter 15. Multi-Architecture Support for NGC Container Images	60
Chapter 16. Customizing Containers	. 62
16.1. Benefits And Limitations To Customizing A Container	63
16.2. Example 1: Building A Container From Scratch	63
16.3. Example 2: Customizing A Container Using Dockerfile	65
16.4. Example 3: Customizing A Container Using docker commit	66
16.5. Example 4: Developing A Container Using Docker	68
16.5.1. Example 4.1: Package The Source Into The Container	70
Chapter 17. Models	71
17.1. What are Models	71
17.2. Searching and Filtering Models	71
17.3. Downloading Models via NGC CLI	72
17.4. Downloading Models via WGET/cURL	73
17.4.1. Downloading Guest Access Models via WGET/cURL	73
17.4.2. Downloading Authenticated Access Models via WGET/cURL	75
17.5. Downloading Models via Web Ul	77
Chapter 18. Resources	80
18.1. What are Resources?	80
18.2. Searching and Filtering Resources	80
18.3. Downloading Resources via the NGC CLI	81
18.4. Downloading Resources via WGET/cURL	82
18.4.1. Downloading Guest Access Resources via WGET/cURL	82
18.4.2. Downloading Authenticated Access Resources via WGET/cURL	84
18.5. Downloading Resources via Web Ul	86
18.6. Deploying Jupyter Notebooks to Google Cloud Vertex AI Workbench using Quick Deploy.	
18.7. Viewing Jupyter Notebooks using the NGC Catalog Website	97
Chapter 19. Helm Charts	99
19.1. Setting Up an NGC Helm Repository	99
19.2. Searching for Available Helm Charts in the NGC Catalog	100

19.3. Fetching Helm Charts	
19.4. Using the NGC Website to View the List of Helm Charts and	Get Fetch
Commands	
Chapter 20. SDK and AI Toolkits	
Chapter 21. Deep Learning Frameworks	
21.1. GPU Operator	

## Chapter 1. What is the NGC Catalog?

The NGC Catalog is a curated set of GPU-optimized software for AI, HPC and Visualization.

The content provided by NVIDIA and third-party ISVs simplifies building, customizing, and integrating GPU-optimized software into workflows, accelerating the time to solutions for users.

The NGC Catalog consists of containers, pre-trained models, Helm charts for Kubernetes deployments, and industry-specific AI toolkits with software development kits (SDKs).

#### Containers

The NGC Catalog hosts a broad range of containers, including deep learning frameworks, machine learning, HPC, and visualization applications that maximize the utilization of GPU environments. Containers package software applications, libraries, dependencies, and run-time compilers in a self-contained environment to easily deploy them across various computing environments. They enable software portability, and through a single command, users can pull, run and scale applications across the cloud, the data center, and the edge.

#### Models and Resources

The NGC Catalog offers pre-trained models for a wide range of common AI tasks optimized for NVIDIA Tensor Core GPUs. The pre-trained models can be used for inference or fine-tuned with transfer learning, saving data scientists and developers valuable time.

Resources offer documentation, code samples, and many other assets such as Jupyter Notebooks, deployment pipelines, and step-by-step instructions and scripts for creating deep learning models, making it easy to get started with deep learning.

#### Helm Charts

Kubernetes is a container orchestrator that facilitates the deployment and management of containerized applications and microservices. A Helm chart is a package manager that allows DevOps to configure, deploy and update applications across Kubernetes environments more efficiently. The NGC Catalog provides Helm charts for deploying GPU-optimized applications and SDKs.

#### Software Development Kits

SDKs deliver all the tooling users need to build and deploy AI applications across domains such as medical imaging, conversational AI, or video analytics. They include annotation tools for data labeling, pre-trained models for customization with transfer learning, and SDKs that enable deployment across the cloud, the data center, or the edge for low-latency inference.

To learn more about the NGC Catalog content, visit the <u>NGC Catalog</u> website.

# Chapter 2. Terms and Concepts

The following are common terms used in this document.

Term	Definition
Authenticated / Registered User	A user who has signed in to NGC using their email account. The user inherits all "guest user" privileges and can access certain free/ free trial entities/features that require users to sign in.
Entity	A container, model, helm chart, or resource. They are also referred to as "software" in this document.
Guest User	An unauthenticated user who can access (view and download) entities from the public catalog without signing in.
Container Images	All applications running in NGC are containerized as Docker containers and execute in our Runtime environment. Containers are stored in the NGC Registry nvcr.io, accessible from both the CLI and the Web UI.
Container Port	Opening a port when creating a job will create a URL that can be used to reach the container on that port using web protocols. The security of web applications (e.g. Jupyterlab) that are accessed this way is the user's responsibility. See note below.
Enterprise Catalog	The Enterprise Catalog includes the NVIDIA AI Enterprise software and can only be accessed by customers with an active subscription. NVIDIA AI Enterprise also includes software available in the public/free catalog which is designed as "NVIDIA AI Enterprise Supported
	The existing implementation of the enterprise catalog will be integrated with the NGC Catalog described in this document.
Enterprise-only software	The containers, Helm charts, resources, models, and collections that are only available

Term	Definition
	for users with an NVIDIA AI Enterprise subscription.
Enterprise-only features	The features of the NGC Catalog that are only available for users with a product (i.e., subscribers).
Models	NGC offers a collection of state-of-the-art pre-trained deep learning models that can be easily used out of the box, re-trained or fine- tuned.
NVIDIA AI Enterprise	The software layer of the <u>NVIDIA AI</u> platform, NVIDIA AI Enterprise, accelerates the data science pipeline and streamlines the development and deployment of production AI, including generative AI, computer vision, speech AI, and more. Regular security reviews, API stability, and dependable support SLAs ensure AI projects stay on track.
	The NVIDIA AI Enterprise subscriptions include entities, support, and exclusive software features/models.
Publisher	Publisher is an owner of the entity hosted on NGC.
Private Registry	The NGC private registry provides a secure space to store and share custom containers, models, resources, and Helm charts within your enterprise.
Resources	NGC offers step-by-step instructions and scripts for creating deep learning models that you can share within teams or the org.
Subscriber	A user who is signed in (i.e., registered) to NGC using their email account and is part of an org that has access to products (e.g., "nv-ai- enterprise", "riva-enterprise").
	An example of a free product for subscriber is someone who has purchased a license or has been granted access to gated software for free for a limited time.

## Chapter 3. Why NGC Software

NGC provides software to meet the needs of data scientists, developers, and researchers with various levels of AI expertise.

Software hosted on NGC undergoes scans against an aggregated set of common vulnerabilities and exposures (CVEs), crypto, and private keys.

In addition to security scanning, NGC software is tested against a broad range of GPUenabled platforms, including public cloud instances, workstations, and OEM servers targeted for data center or edge deployments. Supported GPUs include H100, V100, A100, T4, Jetson, and the RTX Quadro.

NGC software is tested and assured to scale to multiple GPUs and, in some cases, to scale to multi-node, ensuring users maximize the use of their GPU-powered servers out of the box.

For a select set of containers, NVIDIA offers NGC Support Services for running software on DGX platforms or certified OEM servers. The service gives enterprise IT direct access to NVIDIA subject matter experts to quickly address software issues and minimize system downtime.

### Chapter 4. Accessing NGC Software

There are four ways to explore and access software on NGC.

Guest Access: Content under guest access does not require users to register or sign in to pull or download the software.

Guest users can view all publicly available software and most of the entitled content in the NGC Catalog but cannot download entitled content.

The majority of software on the NGC Catalog falls under guest access. However, it is important to note that many third-party applications require a license key that can be sourced directly from ISVs. While pulling public software from the NGC Catalog does not require sign-in, a user might have to reach out to an ISV to obtain a license key for further use.

Authenticated Access: Software under authenticated access requires a user to <u>sign into</u> <u>their NGC org using an NVIDIA account</u> or sign in to NGC using SSO if the user's org is federated to their external SSO/IdP service. Pulling or downloading the software requires the user to provide their API key.

Registered users can view and download all publicly available software in the NGC Catalog. Entitled content is also viewable but not downloadable. Note that registered users may not view content exclusively gated to users of that product.

Approved Access: The publisher must grant user approval to access the software under this category. Once access is granted, the user will receive a notification with further instructions for accessing the software. Instructions to request access are provided in the overview section of the respective software.

Subscription: To access subscription-based software, users must provide Business Address details and a token (serial number, activation code, and so on). Note that this category also requires Authenticated Access.

Subscribers can view and download all publicly available software, including entitled content and exclusive content, in the NGC Catalog.

The following table outlines the permissions and capabilities associated with each user access level (guest user, registered user, subscriber).

Access Level	View Public Entities	Download Public Entities	View Entitled Content	Download Entitled Content	View/ Download Exclusive Content
Guest User	Yes	Yes	Yes	No	No
Registered User	Yes	Yes	Yes	No	No
Subscriber	Yes	Yes	Yes	Yes	Yes

### Chapter 5. Registering and Activating a New NGC Org to Obtain Authenticated Access

Instructions for registering and activating a new NGC org.

# 5.1. Signing Up for an NVIDIA Account and Activating a New NGC Org

This section describes the steps to sign up for an individual NGC org.

1. Go to the <u>NGC sign-in page</u> from your browser, enter your email address, and then click Continue.

olina NGC 🕺	)
Welcome to NVIDIA NGC - your portal to NVIDIA AI Omniverse and high-performance computing (HPC)	
Enter your email to sign in. Email Address	
jamessmith@gmail.com	
Continue	
Use alternate method	

2. At the Create your Account screen, create a password, make sure to review the NVIDIA Account Terms of Use and Privacy Policy, and click Create Account to accept and proceed with account creation. You will receive an email to verify your email address.

Empil	
jamessmith@gmail.com	E
Password	
	Æ
	Go
Confirm password	
•••••	煇
••••••	Æ
Stay logged in	Log In With Security Devi
Stay logged in	Log In With Security Devi
Stay logged in By proceeding, I agree to the <u>NVID</u>	Log In With Security Devi
<ul> <li>Stay logged in</li> <li>By proceeding, I agree to the NVIDI</li> <li>Privacy Point</li> </ul>	A Account Terms Of Use
Stay logged in By proceeding, I agree to the <u>NVIDI</u> Privacy Po	A Account Terms Of Use

A verification email is sent to your email address.

3. Open the NVIDIA account creation email and click Verify Email Address.



Hello,

We are almost done creating your NVIDIA account. You can use this account to log in to GeForce NOW, GeForce Experience, NVIDIA Games, NVIDIA Indie Spotlight, NVIDIA Omniverse, NVIDIA Game Developer Portal, and GTC.

Click the link below to verify this email address.



If you did not register for an NVIDIA Account, someone may have registered with your information by mistake. Contact NVIDIA customer care for further assistance.

You are automatically directed to nvidia.com and see an Email verified successfully page.

4. At the Almost done! dialog, set your communications preferences, and then click Submit.

А	lmost	dor	ie!
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Please confirm the information below to complete registration

#### **Recommendation Settings**

 Yes, recommend content that I might enjoy based on how I engage with NVIDIA's websites, software, and events.

#### Be the first to learn about new SDKs, developer tools and training

Send me the latest enterprise news, announcements, and more from NVIDIA. I can unsubscribe at any time.

We promise to protect your privacy.	We never	sell your	data.	You	can	change
your settings anytime at privacy.nvia	lia.com.					

CI.			т	т
ວເ	ло	HV.		

5. Complete your user profile at the Set Your Profile screen, agree to the NVIDIA GPU Cloud Terms of Use, and then click Submit.



irst Name		Last Name	
James	0	Smith	<
ocation		Job Role	
United States	~	Developer / Engineer	~
Irganization		Organization URL	
NVIDIA	0	https://www.nvidia.com/	0
ndustry Segment(s) Hardware / Semiconductor	~	Areas of Interest Computer Vision × Graphics × Conversational AI /NLP ×	~
30roo to the NVILLE (SPLIT OUR LOPP	15 OT USE		
- ragree to the <u>Report or o coode rem</u>			

Your NVIDIA account is created, and you will be automatically logged in to your NGC org.

#### 5.2. Generating NGC API Keys

This section describes obtaining an API key to access locked container images from the NGC Registry.

1. Sign in to the NGC website.

From a browser, go to <u>https://ngc.nvidia.com/signin</u> and then enter your email and password.

2. Click your user account icon in the top right corner and select Setup.



3. Click Generate API Key to open the API Key page.

The API Key is the mechanism to authenticate your access to the NGC container registry.

Setup

Setup

Generate API Key Generate your own API key in order to use the NGC service through the	Generate API Key Generate your own API key in order to
use the NGC service through the	
	use the NGC service through the
Docker client or through NGC CLI.	Docker client or through NGC CLI.

- On the API Key page, click + Generate API Key to generate your API key.
   A warning message shows that your old API key will become invalid if you create a new one.
- 5. Click Confirm to generate the key.

Your API key appears.

You only need to generate an API Key once. NGC does not save your key, so store it securely.



Tip: You can copy your API Key to the clipboard by clicking the copy icon to the right of the API key.

You can generate a new one from the NGC website if you lose your API Key. When you generate a new API Key, the old one is invalidated.

## Chapter 6. Introduction to the NGC Catalog and NGC CLIs

#### Unified NGC and Enterprise Catalog

Note: The Enterprise Catalog, which housed software supported by NVIDIA AI Enterprise (NVAIE), is now integrated into the NGC Catalog (public), providing users with a cohesive and comprehensive platform. NVAIE customers, with their active NVAIE entitlement, can access software and features exclusive to them from within the NGC Catalog.

The NGC Catalog aims to provide a centralized catalog of publicly available entities (e.g., containers, models, resources) alongside those that are part of products called *entitled* entities. This approach enables users to search and filter seamlessly across all entities, for a more efficient and improved user experience.

Users can view and download entitled entities by signing in to NGC. The NGC CLI is also available for downloading software using the API key. Access to all granted products will remain even when switching org/team context. Unauthenticated users will see a prompt to log in or gain access to the product when attempting to download gated features or entitled entities.

Publishers can publish and map entities to products. Access to entities is restricted by entity type, entity access type, user subscriptions, and roles, enhancing security and control. For entitled entities, guest users are encouraged to convert to registered or subscribed status to access product-specific entities.

Introduction to NGC CLIs

The NGC CLIs are command-line interfaces for managing content within the NGC Registry. The CLI operates within a shell and lets you use scripts to automate commands.

#### NGC Catalog CLI

The NGC Catalog CLI is available to you if you have guest access to the NGC Registry, and with it, you can

- View a list of GPU-accelerated Docker container images, pre-trained deep-learning models, and scripts for creating deep-learning models.
- > Download container images, models, and resources.

NGC Registry CLI

The NGC Registry CLI is available to you if you are logged in with your own NGC account or with an NGC Private Registry account, and with it, you can

- View a list of GPU-accelerated Docker containers available and detailed information about each image.
- See a list of deep-learning models and resources and detailed information about them.
- > Download container images, models, and resources.
- > Upload container images, models, and resources.
- Create and manage users and teams (available to NGC Private Registry administrators).

For more details and best practices, visit the <u>NGC CLI documentation page</u>.

### 6.1. Installing NGC Catalog CLI

To install NGC Catalog CLI,

- 1. Enter the NGC website (<u>https://ngc.nvidia.com</u>) as a guest user.
- 2. In the top right corner, click Welcome Guest and then select Setup from the menu.
- 3. Click Downloads under CLI from the Setup page.
- 4. From the CLI Install page, click the Windows, Linux, or macOS tab, according to the platform you will be running NGC Catalog CLI.
- 5. Follow the instructions to install the CLI.
- 6. Verify the installation by entering ngc --version. The output should be NGC CLI x.y.z where x.y.z indicates the version.

### 6.2. Installing NGC Registry CLI

To install NGC Registry CLI,

- 1. Log in to your enterprise account on the NGC website (<u>https://ngc.nvidia.com</u>).
- 2. In the top right corner, click your user account icon and select Setup, then click Downloads under CLI from the Setup page.
- 3. From the CLI Install page, click the Windows, Linux, or macOS tab, according to the platform from which you will be running NGC Registry CLI.
- 4. Follow the instructions to install the CLI.
- 5. Verify the installation by entering ngc --version. The output should be NGC CLI x.y.z where x.y.z indicates the version.

# Chapter 7. AI Foundation Models

The <u>NVIDIA AI Foundation Models</u> catalog is a repository of pre-trained generative AI models optimized for performance on the NVIDIA accelerated computing platform. With support for domains including computer vision, natural language processing, and speech recognition, to name a few, developers and data scientists can quickly leverage and customize models for their AI and machine learning workflows.

#### Accessing AI Foundation Models

To view available models, navigate to <u>NGC Catalog</u> and select Catalog > AI Foundation Models.

#### Note:

NVIDIA AI Foundation Models are moving to the new NVIDIA API Catalog!

Starting March 18, 2024, NVIDIA AI Foundation Models have begun migrating to our API Catalog at <u>build.nvidia.com</u> and are scheduled to complete in the next few months. During this migration, some models may be affected and not accessible. For API users, your API keys will need to be updated to reflect new endpoints. By signing in with your NGC account on the API Catalog, you will also receive some free credits to make API calls. Please update your bookmarks accordingly.



Each model comes with detailed information, including:

- > Name and description: A brief overview of the model and its capabilities.
- > Playground: An interactive environment where you can experiment with the model.
- Architecture: Technical details about the model architecture and underlying algorithms.
- Usage: Guidelines, input/output parameters, and code snippets for using the model in your applications.
- > Training and fine tuning: Links to datasets for the model.
- Citation: How to cite the model in your research papers or projects.

Once you've identified a model of interest, you can use any downloading method outlined in the <u>Models</u> chapter.



Utilizing AI Foundation Models

After obtaining the model container, you can deploy it on your local machine or in a cloud environment equipped with NVIDIA GPUs. The documentation accompanying each model guides loading the model, performing inference, fine-tuning for specific tasks, and integrating it into your existing workflows. Whether you're building computer vision applications, natural language understanding systems, or speech recognition solutions, AI foundation models from the NGC Catalog can be powerful building blocks to accelerate your development process.

### Chapter 8. Docker Containers

Over the last few years there has been a dramatic rise in the use of software containers for simplifying deployment of data center applications at scale. Containers encapsulate an application along with its libraries and other dependencies to provide reproducible and reliable execution of applications and services without the overhead of a full virtual machine.

GPU support within Docker containers enables GPU-based applications that are portable across multiple machines in a similar way to how Docker enables CPU-based applications to be deployed across multiple machines.

#### **Docker container**

A Docker container is an instance of a Docker image. A Docker container deploys a single application or service per container.

#### Docker image

A Docker image is simply the software (including the filesystem and parameters) that you run within a Docker container.

#### 8.1. What Is a Docker Container?

A Docker container is a mechanism for bundling a Linux application with all of its libraries, data files, and environment variables so that the execution environment is always the same, on whatever Linux system it runs and between instances on the same host.

Unlike a VM which has its own isolated kernel, containers use the host system kernel. Therefore, all kernel calls from the container are handled by the host system kernel. Users can use Docker containers as the mechanism for deploying deep learning frameworks on-prem,, in the cloud, or at the edge.

A Docker container is the running instance of a Docker image.

### 8.2. Why Use A Container?

Using containers allows you to package your application, dependencies, and environment variables into a single image rather than on each system you run on. Additional benefits to using containers include:

- Multiple versions of the same application, which may have conflicting software dependencies, can run on the same server.
- Containerized applications can be deployed on premise, in the cloud, or at the edge
- Specific GPU resources can be allocated to a container for isolation and better performance.
- > Easily share, collaborate, and test applications across different environments.
- Resolve network-port conflicts between applications by mapping container-ports to specific externally-visible ports when launching the container.

### 8.3. Searching and Filtering Containers

To view NGC containers, navigate to Catalog > Containers in the left menu. Use the search bar at the top of the page to find a particular container or sort the list using the criteria from the dropdown menu. You can refine your search by utilizing the filters under NVIDIA Platform, NVIDIA AI Enterprise, Quick Deploy, and many others. The descriptions for the filtering options are as follows:

- Use Case: Choose from the available common use cases.
- NVIDIA Platform: Choose from Clara, DeepStream, TensorFlow, and many others.
- NVIDIA AI Enterprise Support: Select this option to find publicly available containers supported by NVAIE containers.
- NVIDIA AI Enterprise Exclusive: Choose products under this to see entitled entities.
- Quick Deploy: Select this option to find containers to quickly deploy your artifacts in a Jupyter environment.
- Industry: Select by available industries.
- Solution: Select the solution that closely matches your use case.
- Publisher: Filter by publisher.
- Architecture: Choose this option for multi-architecture support.
- Signed Images: Choose this option for container images with a digital signature.
- Multi-Node: Choose this option for multi-node support.
- Other: Miscellaneous options.

The following page displays a list of sample containers for guest users:



Select a container from the list to view its details. All users can access the overview information, regardless of their sign-in status. Here's an example of an NVIDIA AI Enterprise Supported container:



Users must sign in to view the content for the Tags, Layers, and Security Scanning tabs.



Similarly, when filtering on NVIDIA AI Enterprise Essentials, the available containers will be displayed:



Once you choose a container, it shows the information in the Overview tab:

	IA. NGC   CAT	TALOG		Welcome Guest $ \lor $		
CATALOG Explore Cata AI Foundatio		Catalog > Containers > PyTe PyTorch PB Oc	orch PB October 2023 (PB 23	B 23h2) Get Container		
Collections Containers Helm Charts			Accelerated with	Overview Tags Layers Security Scanning Related Collections		
Models r Resources		O PyTorch 🚳 nvidia.	What Is PyTorch? PyTorch is a GPU-accelerated tensor computational framework that offers a high degree of Pyticitie and many for domain the interaction accelerated with practice Delhard Busice and practice			
		Associated Products NVIDIA AI Enterprise Essentials		flexibility and speed for deep learning. It integrates seamlessly with popular Python bibranes such as NumPy, SciPy, and Cython, extending its functionality to meet the diverse needs of users. PyTorch also employs a tape-based system for automatic differentiation at both the functional and neural network layer level, ensuring accelerated NumPy-like functionality.		
		Features	- Currented	What Is PyTorch Production Branch October 2023?		
		© Signed Images	se Supported	The PyTorch Production Branch, exclusively available with NVIDIA AI Enterprise, is a 9-month supported, API-stable branch that includes monthly fixes for high and critical software vulnerabilities. This branch provides a stable and secure environment for building your mission- critical AI applications. The PYTorch production branch releases every six months with a three-		
	PyTorch Production Branch October 2023 (PB 23h2) offers a 9-month lifecycle for API stability, with monthly patches for high and critical software vulnerabilities.		month overlap in between two releases. Getting started with PyTorch Production Branch			

If users are not subscribed to NVIDIA AI Enterprise Software Exclusive products, they'll see the following message when viewing other tabs:



If users try to download the container, they'll see a message indicating that a subscription is required:

👁 nvidia. Ng	C   CAT	LOG	Welc	come Guest $ \smallsetminus $
CATALOG Explore Catalog Al Foundation Models		Catalog > Containers > PyTorch PB October 2023 (PB 2 PyTorch PB October 2023 (P	<sup>(23h2)</sup> PB 23h2)	et Container
Collections Containers Heim Charts Models Resources		O PyTorch	Overview Tags Layers Security Scanning Related Collec	tions
		Associated NVIDIA AI Features & NVIDIA © Signed Description PyTorch P (PB 23h2) API stabili and critica Publisher Facebook Latest Tag 23.08.04-r; Modified January 16, 2024	ired × itive subscription to an prise product All Enterprise Setsentials Enterprise is an enterprise software platform that is streamlines development and deployment of n-grade Al. undreds more GPU-optimized artifacts by creating a free NGC Already Subscribed? Log In Subscribe Now	

However, once users subscribe to NVIDIA AI Enterprise Software Exclusive products, they can view the container information.



# Chapter 9. NGC Container Images in NGC Catalog

NGC Containers are designed to enable a software platform centered around minimal OS requirements, Docker and driver installation on the server or workstation, and provisioning of all application and SDK software in the NGC containers through the NGC container registry.

NGC Catalog is a curated set of fully integrated and optimized container images for Deep Learning, HPC and Visualization applications.

- Deep learning framework containers that take full advantage of NVIDIA GPUs in both single GPU and multi-GPU configurations. They include CUDA Toolkit, DIGITS workflow, and deep learning frameworks: NVCaffe, Caffe2, Microsoft Cognitive Toolkit (CNTK), MXNet, PyTorch, TensorFlow, Theano, and Torch. These framework containers are delivered ready-to-run, including all necessary dependencies such as CUDA runtime, NVIDIA libraries, and an operating system. NVIDIA updates these deep learning containers monthly to ensure they continue to provide peak performance.
- NGC also hosts a catalog of HPC applications such as NAMD, GROMACS, LAMMPS, RELION, CHROMA, MILC, and many more.
- In addition to HPC applications, NGC hosts the industry's leading visualization tools, including ParaView with NVIDIA IndeX volume renderer, NVIDIA OptiX ray-tracing library, and NVIDIA Holodeck for interactive real-time visualization and high-quality visuals.
- NGC also hosts popular third-party GPU-ready application containers which conform to NGC container standards and best practices, making it easy to get the most out of your NVIDIA GPU.
- With the NGC Quick Deploy feature, many NGC containers can be used as a kernel to launch a JupyterLab instance on Google Cloud Vertex AI Workbench with optimal configuration and all software dependencies preload.

### 9.1. Why NGC Container Images?

Every image hosted on NGC Catalog undergoes a security scan and GPU-performance test by the NGC team.

#### 9.1.1. NGC Container Security Policy

A critical function of enterprise risk and security assessment processes is to ensure all container images being used in development or deployment have been tested for known vulnerabilities. Containers published to the NGC Catalog undergo scanning with the NGC Container Security Policy.

The security scans include checks such as the following:

- Outdated software packages, such as vulnerability scans
- Metadata checks, such as open ports specified in Dockerfiles, etc
- Cryptographic key material leaks

The scanning policy for CVEs rates the severity into critical, high, medium, and low vulnerabilities using the Common Vulnerability Scoring System (CVSS). Scan results and NVIDIA Security-Risk Scale are made available to users. Published images are rescanned every 30 days to reflect the newest CVE findings.

#### 9.1.2. NVIDIA Security Risk Scale

The NVIDIA Security-Risk Scale rates the risk level a given container image poses for a development/production infrastructure environment.

Scale	Description	Packages	Details
ΑΑΑ	Rated to have lowest security risk.	0	No package with vulnerabilities
AA	Rated to have lower security risk.	1	1 package has a Critical or High vulnerability
A	Rated to have moderate security risk with some speculative judgment needed based on environment workloads	2-3	2-3 packages with Critical or High vulnerabilities
В	Rated to have high security risk with some speculative judgment needed based on environment workloads	3+	4-5 packages with Critical or High vulnerabilities
С	Rated as highest security risk	5+	5+ packages with Critical or High vulnerabilities

This rating takes into account vulnerability scans for OS and non-OS packages.

#### 9.1.3. GPU-performance tests for NGC Catalog Container Images

To ensure that NVIDIA GPU owners can perform well with NGC hosted images, all container images undergo basic installation, functional, scalability and performance tests on GPUs.

These tests are performed on an array of GPUs ranging from NVIDIA T4s to A100 to DGX Systems for performance and multi-GPU for scale. The selection of supported GPUs may be limited to few architectures or single-/multi-GPU based on the business use case of application containers.

These tests are performed on both bare-metal installations and cloud deployed instances to ensure both on-prem and cloud deployment use-cases.

### 9.2. NVIDIA Container Toolkit

The NVIDIA Container Toolkit allows users to build and run GPU accelerated containers. The toolkit includes a container runtime <u>library</u> and utilities to automatically configure containers to leverage NVIDIA GPUs. It integrates with many popular container runtimes including Docker, podman, CRI-O, LXC etc.

To enable portability in Docker images that leverage NVIDIA GPUs, NVIDIA developed <u>nvidia-docker</u>, an open-source project hosted on Github that provides the two critical components needed for portable GPU-based containers:

- 1. Driver-agnostic CUDA images.
- 2. A Docker command line wrapper that mounts the user mode components of the driver and the GPUs (character devices) into the container at launch.

nvidia-docker is a Docker command line wrapper that provisions a container with the necessary components to execute code on the GPU.

When working with containers that utilize GPUs, the only command that must be executed through an nvidia-docker command is the run command. For all other functionalities, docker commands can be used.

But for simplicity in this documentation we use nvidia-docker for all commands.

### 9.3. NVIDIA CUDA Toolkit

The NVIDIA<sup>®</sup> CUDA<sup>®</sup> Toolkit provides a development environment for creating highperformance GPU-accelerated applications. With the CUDA Toolkit, you can develop, optimize, and deploy your applications on GPU-accelerated embedded systems, desktop workstations, enterprise data centers, cloud-based platforms, and HPC supercomputers.
The toolkit includes GPU-accelerated libraries, debugging and optimization tools, a C/C++ compiler and a runtime library to deploy your application.

GPU-accelerated CUDA libraries enable drop-in acceleration across multiple domains such as linear algebra, image and video processing, deep learning, and graph analytics. For developing custom algorithms, you can use available integrations with commonly used languages and numerical packages as well as well-published development APIs. Your CUDA applications can be deployed across all NVIDIA GPU families available on premise and on GPU instances in the cloud. Using built-in capabilities for distributing computations across multi-GPU configurations, scientists and researchers can develop applications that scale from single GPU workstations to cloud installations with thousands of GPUs.

## 9.4. Running Singularity Containers

NGC supports both Docker and Singularity container runtimes. While Docker is prevalent primarily in enterprises, Singularity has become ubiquitous in the HPC community. Singularity was developed to better satisfy the requirements of HPC users and system administrators, including the ability to run containers without superuser privileges.

NGC containers can be easily used with Singularity. Let's use the <u>NGC NAMD container</u> to illustrate. NAMD is a parallel molecular dynamics application designed for high-performance simulation of large biomolecular systems, developed by the Theoretical and Computational Biophysics Group at the University of Illinois.

### 9.4.1. Prerequisites

These instructions assume the following.

- > You have Singularity v2.6+ installed on your system
- > You have performed the following steps from the NGC website.
  - Signed up for an NGC account at <u>https://ngc.nvidia.com/signup</u>.
  - Created an NGC API key for access to the NGC container registry
  - Browsed the NGC website and identified an available NGC container and tag to run
- Ensure you have correctly set udev rules which are detailed (<u>here</u>)

#### Note:

It is recommended that you install nvidia-container-cli because if installed, Singularity will use it. More information can be found <u>here</u>.

### 9.4.2. Converting to Singularity Image

Before running with Singularity you must set NGC container registry authentication credentials.

This is most easily accomplished by setting the following environment variables.

bash

```
$ export SINGULARITY_DOCKER_USERNAME='$oauthtoken'
$ export SINGULARITY_DOCKER_PASSWORD=<NVIDIA NGC API key>
```

tcsh

> setenv SINGULARITY\_DOCKER\_USERNAME '\$oauthtoken'
> setenv SINGULARITY\_DOCKER\_PASSWORD <NVIDIA NGC API key>

More information describing how to obtain and use your NVIDIA NGC API key can be found <u>here</u>.

Once credentials are set in the environment, the NGC container can be pulled to a local Singularity image.

\$ singularity build <app\_tag>.simg docker://nvcr.io/<repository>/<app:tag>

This will save the container to the current directory as

<app\_tag>.simg

For example to convert the HPC application NAMD hosted on NGC to a Singularity image, run

\$ singularity build namd\_2.12-171025.simg docker://nvcr.io/hpc/namd:2.12-171025

After the build has finished the Singularity image file, namd\_2.12-171025.simg, will be available for use in the current working directory.

### 9.4.3. Running the Singularity Container

Once the local Singularity image has been pulled, the following modes of running are supported.

- Command line execution with Singularity
- Interactive shell with Singularity

To leverage NVIDIA GPUs, you must use the Singularity flag --nvwhen running the containers. More singularity flags are explained <u>here</u>.

#### Important:

For Amazon Machine Image Users

Amazon Machine Images on Amazon Web Service have a default root umask of 077. Singularity must be installed with a umask of 022 to run properly. To (re)install Singularity with correct permissions:

- Uninstall Singularity (if it is installed)
- Change the umask with: \$ umask 0022
- Install Singularity
- Restore the umask: \$ umask 0077

This causes installed Singularity files to have permission 0755 instead of the default 0700. Note that the umask command only applies changes to the current shell. Use umask and install Singularity from the same shell session.

### 9.4.3.1. Directory Access

Singularity containers are themselves ostensibly read only. In order to provide application input and persist application output we'll bind a host directory into our container, this is accomplished through the Singularity -B flag. The format of this flag is -B <host\_src\_dir>:<container\_dst\_dir>. Once a host directory is bound into the container we can interact with this directory from within the container exactly as we can outside the container.

It is also often convenient to use the  $--pwd < container_dir> flag$ , which will set the present working directory of the command to be run within the container.

The Singularity commands below will mount the present working directory on the host to  $/host_pwd$  in the container process and set the present working directory of the container process to  $/host_pwd$ . With this set of flags the <cmd> to be run will be launched from the host directory Singularity was called from.

\$ singularity exec --nv -B \$(pwd):/host\_pwd --pwd /host\_pwd <image.simg> <cmd>

Note:

Binding to a directory which doesn't exist within the container image requires kernel and configuration support that may not be available on all systems, particularly those running older kernels such as CentOS/RHEL 6. When in doubt contact your system administrator.

### 9.4.3.2. Command Line Execution with Singularity

Running the container with Singularity from the command line looks similar to the command below.

\$ singularity exec --nv <app\_tag>.simg <command\_to\_run>

For example, to run the NAMD executable in the container

\$ singularity exec --nv namd\_2.12-171025.simg /opt/namd/namd-multicore

### 9.4.3.3. Interactive Shell with Singularity

To start a shell within the container, run the command below

\$ singularity exec --nv <app\_tag>.simg /bin/bash

For example, to start an interactive shell in the NAMD container

\$ singularity exec --nv namd\_2.12-171025.simg

## Chapter 10. Prerequisites for Using NGC Catalog Container Images

To enable portability in Docker images that leverage GPUs, three methods of providing GPU support for Docker containers have been developed.

- Running Docker-ce 19,.03 or later for Native GPU support
- nvidia-docker2
- nvidia-docker

Each of these methods mount the user mode components of the NVIDIA driver and the GPUs into the Docker container at launch. They allow NGC containers to take full advantage of NVIDIA GPUs.

# 10.1. Prerequisites for Using NGC Containers on DGX Systems

DGX<sup>™</sup> users should follow the instructions in the <u>Preparing Your DGX System For Use</u> <u>With NVIDIA Container Runtime</u>.

## 10.2. Prerequisites for Using NGC Containers on Cloud Platforms

On each of the major public cloud providers, NVIDIA publishes customized virtual machine images (VMIs) with updated OS's and NVIDIA driver that have been tested with NGC containers. These VMIs have the NVIDIA Container Toolkit pre-installed allowing you to begin pulling and running Docker containers from NGC right away. To use the NVIDIA NGC GPU-optimized VMIs on cloud platforms, you would need -

- A cloud platform account with permissions to create resources. See the details for your public cloud:
  - Alibaba <u>https://home-intl.console.aliyun.com/</u>
  - AWS <u>https://aws.amazon.com</u>
  - Microsoft Azure <u>https://portal.azure.com</u>
  - Google Cloud Platform (GCP) <u>https://console.cloud.google.com/</u>
- A CLI for respective cloud platforms if you wish to interface with your VM via a CLI
  - Alibaba Cloud CLI
  - AWS CLI Version 2
  - Azure CLI 2.0
  - gcloud SDK
- Windows Users: Any CLI code snippets in the docs are for bash on Linux or Mac OS X. If you are using Windows and want to use the snippets as-is, you can <u>set up the Windows Subsystem for Linux</u> and use the bash shell (you will be in Ubuntu Linux).

## 10.3. Prerequisites for Using NGC Containers on Other NVIDIA GPUs

- Users running NGC containers on other NVIDIA GPUs or in a virtual GPU environment should follow the corresponding instructions for <u>TITAN PCs</u>, <u>Quadro PCs</u>, or <u>vGPUs</u>.
- Other users should follow the nvidia-docker installation documentation at <u>nvidia-docker installation</u> and install the latest NVIDIA drivers for your GPU product type and series for your operating system. If NVIDIA drivers are not already configured on your system, then install them from here: <u>Download Drivers</u>.
- Ensure you have an NVIDIA GPU supporting Compute Unified Device Architecture<sup>®</sup> (CUDA) version with compute capability 6.0.0 or higher. For example, Pascal GPU architecture generation or later.

## 10.4. HPC Visualization Containers

In addition to accessing the <u>NVIDIA optimized frameworks</u> and HPC containers, the NVIDIA GPU Cloud (NGC) container registry also hosts the following scientific visualization containers for HPC. These containers rely on the popular scientific visualization tool called <u>ParaView</u>.

Visualization in an HPC environment typically requires remote visualization, that is, data resides and is processed on a remote HPC system or in the cloud, and the user graphically interacts with this application from their workstation. As some visualization

containers require specialized client applications, the HPC visualization containers consist of two components:

#### Server container

The server container needs access to the files on your server system. Details on how to grant this access are provided below. The server container can run both in serial mode or in parallel. For this alpha release, we are focusing on the serial node configuration. If you are interested in parallel configuration, contact hpcviscontainer@nvidia.com.

#### **Client container**

To ensure matching versions of the client application and the server container, NVIDIA provides the client application in a container. Similarly, to the server container, the client container needs access to some of the ports to establish connection with the server container.

In addition, the client container needs access to the users' X server for displaying the graphical user interface.

### 10.4.1. Prerequisites For HPC Visualization Containers

Install docker-ce and <u>nvidia-docker2</u>. First install <u>docker-ce</u>, then install <u>nvidia-docker2</u> for your operating system and Docker version. For a script to install nvidia-docker2, see <u>Installing NVIDIA Docker 2.0</u>.

Note: If you already have nvidia-docker1 installed and intend to keep it, you can install nvidia-container-runtime.

- Install the NVIDIA Display driver version 384.57 or onwards depending on your GPU product type and series for your operating system. For more information, see <u>Download Drivers</u>.
- Ensure you have an NVIDIA GPU supporting Compute Unified Device Architecture<sup>®</sup> (CUDA) version with compute capability 6.0.0 or higher. For example, Pascal GPU architecture generation or later.
- Log into the NVIDIA<sup>®</sup> GPU Cloud (NGC) Container Registry located at nvcr.io using your NGC API key. For step-by-step instructions on how to gain access and get your API key, see <u>Generating NGC API Keys</u>.

### 10.4.2. Installing NVIDIA Docker 2.0

The following script installs NVIDIA Docker 2.0 which is a prerequisite to pulling the ParaView with NVIDIA IndeX HPC visualization container.

Full support for concurrent graphics and compute capabilities in containers is supported in NVIDIA Docker 2.0. Current installations of NGC run on NVIDIA Docker 1.0. Prior to using a container on any of these instances, NVIDIA Docker 2.0 must be installed.

Use the following script below to install NVIDIA Docker 2.0 on your instance.

```
# Install NVIDIA Docker 2.0
docker volume ls -q -f driver=nvidia-docker | \
xargs -r -I{} -n1 docker ps -q -a -f volume={} | xargs -r docker rm -f
```

```
sudo apt-get purge -y nvidia-docker
curl -L https://nvidia.github.io/nvidia-docker/gpgkey | sudo apt-key add -
sudo tee /etc/apt/sources.list.d/nvidia-docker.list <<< \
"deb https://nvidia.github.io/libnvidia-container/ubuntu16.04/amd64 /
deb https://nvidia.github.io/nvidia-container-runtime/ubuntu16.04/amd64 /
deb https://nvidia.github.io/nvidia-docker/ubuntu16.04/amd64 /"
sudo apt-get -y update
sudo apt-get install -y nvidia-docker2
sudo pkill -SIGHUP dockerd
# Tests
#docker run --runtime=nvidia --rm nvidia/cuda nvidia-smi
```

### 10.4.3. ParaView With NVIDIA Holodeck

Currently, the ParaView with NVIDIA Holodeck container requires a running X server both on the server host and the client host. Therefore, only a single container image is required.

1. Create X-forwarding variables for your container.

```
XSOCK=/tmp/.X11-unix; XAUTH=/tmp/.docker.xauth;
touch /tmp/.docker.xauth;
xauth nlist :0 | sed -e 's/^..../ffff/' | xauth -f /tmp/.docker.xauth nmerge -
```

2. On the server host, start the ParaView Holodeck server:

```
docker run --rm -it --runtime=nvidia \
-v /tmp/.X11-unix:/tmp/.X11-unix -v /tmp/.docker.xauth:/tmp/.docker.xauth \
-e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 \
-p 11111:11111 \
--shm-size=4g \
nvcr.io/nvidia-hpcvis/paraview-holodeck:glx-17.11.13-beta \
./service.sh externalvis pvserver
```

The Holodeck render window showing a space scene displays.

The server container is ready after you receive a message similar to the following: "Accepting connection(s): [...]:11111"

3. Set up X access and start the client container on the client host. Ensure you replace your server hostname.

```
XSOCK=/tmp/.X11-unix; XAUTH=/tmp/.docker.xauth
touch /tmp/.docker.xauth
xauth nlist :0 | sed -e 's/^..../ffff/' \
| xauth -f /tmp/.docker.xauth nmerge -docker run --rm -it --runtime=nvidia \
-v /tmp/.X11-unix:/tmp/.X11-unix -v /tmp/.docker.xauth:/tmp/.docker.xauth \
-e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 \
nvcr.io/nvidia-hpcvis/paraview-holodeck:glx-17.11.13-beta \
sh -c paraview\ --server-url=cs://your_server_hostname:11111
```

The ParaView user interface displays.

### 10.4.4. ParaView With NVIDIA IndeX

To support both X-enabled and headless hosts, the ParaView IndeX container image is available with GLX and EGL support. The following section shows how to launch the IndeX container with different use cases.

For more information about ParaView, see the <u>ParaView User's Guide</u> and the <u>NVIDIA</u> IndeX SDK.

#### 10.4.4.1. Single-Machine With GLX

1. Login to the docker repository and pull the X display-enabled container on your workstation:

docker pull nvcr.io/nvidia-hpcvis/paraview-index:glx-17.11.13-beta

2. Specify X-forwarding variables:

```
XSOCK=/tmp/.X11-unix; XAUTH=/tmp/.docker.xauth
touch /tmp/.docker.xauth
xauth nlist :0 | sed -e 's/^..../ffff/' \
| xauth -f /tmp/.docker.xauth nmerge
```

3. Run the image. In this example, host system data in the current directory \$(pwd) are mounted to both /work in the container. This should be modified as desired by the user.

```
docker run --rm -it --runtime=nvidia \
-v /tmp/.X11-unix:/tmp/.X11-unix -v /tmp/.docker.xauth:/tmp/.docker.xauth \
-v $(pwd):/work -e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 \
nvcr.io/nvidia-hpcvis/paraview-index:glx-17.11.13-beta \
sh -c paraview
```

#### 10.4.4.2. Server Container With EGL

In a typical client-server setup, one container acting as the server will run remotely on a display-less machine, connected to a second container that runs locally on a workstation and provides the graphical front end.

Use the following command to pull the EGL-enabled, no-display container from the NGC registry on the server host:

docker pull nvcr.io/nvidia-hpcvis/paraview-index:egl-17.11.13-beta

```
Run the server component on the server host. We listen on the default port lllll:
docker run --runtime=nvidia -p 11111:1111 --rm -it \
nvcr.io/nvidia-hpcvis/paraview-index:egl-17.11.13-beta sh -c pvserver
```

### 10.4.4.3. GLX Client Connecting To A Server

```
Pull the X display-enabled container on your workstation:
docker pull nvcr.io/nvidia-hpcvis/paraview-index:glx-17.11.13-beta
```

Set up X access and launch the client application container (make sure to replace your\_server\_hostname with the address of your ParaView server host):

```
XSOCK=/tmp/.X11-unix; XAUTH=/tmp/.docker.xauth
touch /tmp/.docker.xauth
xauth nlist :0 | sed -e 's/^..../ffff/' \
| xauth -f /tmp/.docker.xauth nmerge -
docker run --rm -it --runtime=nvidia \
-v /tmp/.X11-unix:/tmp/.X11-unix -v /tmp/.docker.xauth:/tmp/.docker.xauth \
-e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 \
nvcr.io/nvidia-hpcvis/paraview-index:glx-17.11.13-beta \
sh -c paraview\ --server-url=cs://your_server_hostname:11111
```

### 10.4.5. ParaView With NVIDIA OptiX

The ParaView with NVIDIA OptiX container is designed to run ParaView as a user normally would outside a container. The following sections show how to launch the OptiX container with different use cases.

For more information about ParaView see the <u>ParaView User's Guide</u> and the <u>NVIDIA</u> <u>OptiX SDK</u>.

#### 10.4.5.1. Single-Machine Container With GLX

On systems with a physical display, or when running a ParaView client, users will wish to launch a container with GLX support. This can be done as follows.

1. Pull the docker image:

```
docker pull nvcr.io/nvidia-hpcvis/paraview-optix:glx-17.11.13-beta
```

2. Set up X11 forwarding variables:

XSOCK=/tmp/.X11-unix; XAUTH=/tmp/.docker.xauth; touch /tmp/.docker.xauth; xauth nlist :0 | sed -e 's/^..../ffff/' | xauth -f /tmp/.docker.xauth nmerge -

3. Run the image. In this example, host system data in the current directory \$ (pwd) are mounted to both /work in the container. This should be modified as desired.

```
docker run --rm -it --runtime=nvidia -v /tmp/.X11-unix:/tmp/.X11-unix -v /
tmp/.docker.xauth:/tmp/.docker.xauth -e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 -v
$(pwd):/work:rw nvcr.io/nvidia-hpcvis/paraview-optix-glx-beta:17.11.10 sh -c paraview
```

#### 10.4.5.2. Server Container With EGL

Launching a ParaView server on GPU HPC resources often requires EGL support, requiring a separate build of ParaView for which we have a separate container.

1. Pull the container:

docker pull nvcr.io/nvidia-hpcvis/paraview-optix:egl-17.11.13-beta

2. Specify the connection port and launch the container as follows (in this example, we listen on the default port 11111):

docker run --runtime=nvidia -p 11111:11111 --rm -it \ nvcr.io/nvidia-hpcvis/paraview-optix:egl-17.11.13-beta sh -c pvserver

3. For users who wish to run the server on a GLX-capable workstation, it is equally possible to use the GLX image with the pyserver argument.

## 10.4.5.3. Running The GLX Client And Attaching To The Server

With the server launched, it is then straightforward to use the GLX image to run a client, and connect to the server as follows. Here we assume the server is listening on port 11111, addressable at your.server.address.

```
docker pull nvcr.io/nvidia-hpcvis/paraview-optix:glx-17.11.13-beta
```

```
XSOCK=/tmp/.X11-unix; XAUTH=/tmp/.docker.xauth
touch /tmp/.docker.xauth
xauth nlist :0 | sed -e 's/^..../ffff/' \
| xauth -f /tmp/.docker.xauth nmerge -
docker run --rm -it --runtime=nvidia \
-v /tmp/.X11-unix:/tmp/.X11-unix -v /tmp/.docker.xauth:/tmp/.docker.xauth \
```

```
-e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 \
nvcr.io/nvidia-hpcvis/paraview-optix:glx-17.11.13-beta \
sh -c paraview\ --server-url=cs://your.server.address:1111
```

#### 10.4.5.4. Optional: Using The ParaView .config File

It is helpful to reuse ParaView configuration files to maintain settings across ParaView sessions. To do this, first create a new directory for ParaView to store its settings.

#### mkdir pvsettings

When issuing the docker run command, add the following command as an argument:

-v \$(pwd)/pvsettings:/home/paraview/.config/ParaView

Insert the command before the image URL. For example,

```
docker run --rm -it --runtime=nvidia \
    -v /tmp/.X11-unix:/tmp/.X11-unix -v /tmp/.docker.xauth:/tmp/.docker.xauth \
    -e XAUTHORITY=/tmp/.docker.xauth -e DISPLAY=:0 \
    nvcr.io/nvidia-hpcvis/paraview-optix:glx-17.11.13-beta \
    -v $(pwd)/pvsettings:/home/paraview/.config/ParaView \
    sh -c paraview\ --server-url=cs://your.server.address:11111
```

## Chapter 11. Pulling NGC Containers from NGC Catalog

Before you using a container from the NGC Catalog, review the prerequisites described in the <u>Prerequisites</u> section.

To become a registered NGC user, follow the steps explained in the <u>Registering and</u> <u>Activating a New NGC Org to Obtain Authenticated Access</u>.

## 11.1. Key NGC Container Registry Terminology

In order to issue the pull and run commands, ensure that you are familiar with the following concepts.

A pull command looks similar to: docker pull nvcr.io/nvidia/caffe2:17.10

A run command looks similar to:

docker run --gpus all -it --rm -v local\_dir:container\_dir nvcr.io/nvidia/caffe2:<xx.xx>

Note: The base command docker run --gpu all assumes that your system has Docker 19.03-CE installed. See the section <u>Enabling GPU Support for NGC Containers</u> for the command to use for earlier versions of Docker.

The following concepts describe the separate attributes that make up the both commands.

nvcr.io

The name of the container registry, which for the NGC container registry is nvcr.io. nvidia

The name of the space within the registry that contains the container. For containers provided by NVIDIA, the registry space is nvidia. For more information, see <u>NGC</u> <u>Container Images in NGC Catalog</u>.

-it

You want to run the container in interactive mode.

--rm

You want to delete the container when finished.

 $-\mathbf{v}$ 

You want to mount the directory.

local\_dir

The directory or file from your host system (absolute path) that you want to access from inside your container. For example, the <code>local\_dir</code> in the following path is <code>/home/jsmith/data/mnist</code>.

-v /home/jsmith/data/mnist:/data/mnist

If you are inside the container, for example, using the command <code>ls /data/mnist</code>, you will see the same files as if you issued the <code>ls /home/jsmith/data/mnist</code> command from outside the container.

#### container\_dir

The target directory when you are inside your container. For example, /data/mnist is the target directory in the example:

-v /home/jsmith/data/mnist:/data/mnist

#### <xx . xx>

The tag. For example, 17.10.

You can access the NGC container registry by running a Docker commands from any Linux computer with Internet access on which Docker is installed. You can access the NGC container registry at nvcr.io through the Docker CLI.

Before accessing the NGC container registry, see <u>NGC Getting Started Guide</u> for instructions on how to access the website and, if you intend to access locked NGC content, know how to sign up for an NGC account and obtain an API key.

## 11.2. Accessing And Pulling an NGC Container Image via the Docker CLI

### 11.2.1. Logging in to the NGC container registry

Before accessing locked NGC content, you must sign up for an NGC account and obtain an API key as explained in the section <u>Generating NGC API Keys</u>. Then log in to the NGC registry from the command line as follows.

1. Log in to the NGC container registry.

\$ docker login nvcr.io

- 2. When prompted for your user name, enter the following text:
  - \$oauthtoken

The <code>\$oauthtoken</code> username is a special user name that indicates that you will authenticate with an API key and not a username and password.

3. When prompted for your password, enter your NGC API key as shown in the following example.

Username: \$oauthtoken

#### Password: k7cqFTUvKKdiwGsPnWnyQFYGnlAlsCIRmlP67Qxa

Tip: When you get your API key, copy it to the clipboard so that you can paste the API key into the command shell when you are prompted for your password.

4. Confirm "Login Success".

### 11.2.2. Pulling a Container from NGC Container Registry Using Docker CLI

You can browse the available containers in the NGC container registry by opening the <u>NGC website</u> using a web browser

1. Browse the NGC Catalog, select the image to pull, then copy the pull command.

The following image shows the pull comand on the PyTorch container page.

🚳 NUDIA NGC	ACCELERATED SOFTWARE						🕒 Morika Katariya 🗸
ACCELERATED SOFT	Catalog Containers / Centainers / PyTorch	widla.pytorch					1
		Publisher Facebook Multinole Succest	Built By NVIDIA	Latert Tag 20.03-py3	Wodified March 25, 2020	Size 3.38 GB	
	Ċ	No Description Pyfforch is a GPU accelerator Ibernite such as Numity, Sol Iberti Labels Deep Learning Training Public Contrand delber: pull: recr.sameLa	disensor computational frame my, and Cython. Automatic dif Harygstorchu28, 63–993	work with a Python from en	d. Functionality can be easily type-based system at both a fa	eeerded with common Aython national and neural network layer	
	Overview Tags Layer	's What is PyTorch?					
		PyTorth Is a GPU accelerator libraries such as NumPy, Scill level. This functionality bring	d tensor computational frame Py, and Cython. Automatic diff is a high level of flexibility and	work with a Python front en erentiation is done with a ta speed as a deep learning fr	d. Functionality can be easily spe-based system at both a fu amework and provides accele	estended with common Python nctional and neural network layer rated NumPy-like functionality.	
		Running PyTorch Before you can run an NGC o appropriate command as exp repository, and tags. For mo	deep learning framework com plained in the <u>Bunning A Corr</u> re information about using N	ainer, your Docker environm ainer chapter in the WKDA ( IC, refer to the <u>WGC Contain</u>	nent musit support NVIDIA GP Containers And Promeworks (Ib er Liser Guide.	Us. To run a container, issue the er Guide and specify the registry.	
« • •		The method implemented in Cloud Service Provider, or th	your system depends on the e software that you have inst-	DGX OS version installed (R field in preparation for runn	ir DGK systems), the specific P ing NGC containers on TITAN	IGC Cloud image provided by a PCs, Quadro PCs, or vGPUs.	
NGC Version: 2.31.	1	Procedure					

- 2. Click the download icon to copy the pull command to the clipboard.
- 3. Log in to nvcr.io, then paste the command in your terminal.
  For example, to pull the PyTorch container:
  \$ docker pull nvcr.io/nvidia/pytorch:20.03-py3
  See the NGC Getting Started Guide for details on using the NGC website.
- 4. List the Docker images on your system to confirm that the container was pulled.
   \$ docker images

For more information pertaining to your specific container, refer to the /workspace/ README.md file inside the container.

After pulling a container, you can run jobs in the container to run scientific workloads, train neural networks, deploy deep learning models, or perform AI analytics.

## 11.3. Accessing and Pulling an NGC Catalog Container Using NGC CLI

If you will be pulling containers from the registry, you will need Docker installed on your local machine. To install Docker on your client machine, follow one of these instructions:

For Ubuntu Linux:

https://docs.docker.com/engine/installation/linux/ubuntulinux/

For Windows:

https://docs.docker.com/engine/installation/windows/#/docker-for-windows

For MacOS X:

https://docs.docker.com/engine/installation/mac/

This document provides an introduction to using the NGC Catalog CLI. For a complete list of commands and options, use the -h option as explained in <u>#unique\_56</u>.

### 11.3.1. Viewing Container Image Information

There are several commands for viewing information about available container images.

To list container images:

```
C: \ngc registry image list
```

Example output

```
+----+
+----+
| Name | Repository | Latest Tag | Image Size | Updated Date |
Permission |
+----+
| BigDFTZ | hpv/bigdftfe | cuda10-ubun| 2.37 GB | Oct 18, 2019 | unlocked
|
| | | | | | | tu1804-ompi| | 2019 |
|
| CANDLE | hpc/candle | 201803263 | 1.52 GB | Oct 18, 2019 | unlocked
|
...|
```

To view detailed information about a specific image, specify the image and the tag.

Example:

```
C:\>ngc registry image info nvidia/caffe:19.02-py2
Image Information
Name: nvidia/caffe:19.02-py2
Architecture: amd64
Schema Version: 1
```

### 11.3.2. Pulling a Container Image

With the NGC Registry CLI you can pull (download) images to your system.

To pull an image to your registry space, specify the image and, optionally, the tag.

C:\>ngc registry image pull <image-name>[:<tag>]

If a tag is not specified, then the tag 'latest' will be used.



Note: nvcr.io/nvidia, nvcr.io/partners and nvcr.io/hpc is reserved namespace and does not grant permissions to users to push or delete container images, models, helm and all artifacts.

## Chapter 12. NGC Container Image Versions

Each release of an NGC image is identified by a version "tag". For simpler images this version tag usually contains the version of the major software package in the image. More complex images which contain multiple software packages or versions may use a separate version solely representing the containerized software configuration. One common scheme is versioning by the year and month of the image release. For example, the 20.01 release of an image was released in January, 2020.

An image name consists of two parts separated by a colon. The first part is the name of the container in the repository and the second part is the "tag" associated with the container. These two pieces of information are shown in Figure 2, which is the output from issuing the **docker images** command.

#### Figure 1. Output from docker images command

REPOSITORY	TAG		IMAGE ID	CREATED	SIZE
nvidia/cuda	8.0-devel	[	5094464ddfe8	2 weeks ago	1.62 GB
ubuntu	latest		f49eec89601e	2 weeks ago	129 MB
nvcr.io/nvidia/tensorflow	17.01		4352527009ae	2 weeks ago	2.77 GB
			$\overline{}$		
Image Name = Reposito	ry:Tag		ImageID = Uniqu	ue Hash	

Figure 2 shows simple examples of image names, such as:

- nvidia-cuda:8.0-devel
- ubuntu:latest
- nvcr.io/nvidia/tensorflow:17.01

If you choose not to add a tag to an image, by default the word "latest " is added as the tag, however all NGC containers have an explicit version tag.

In the next sections, you will use these image names for running containers. Later in the document, there is also a section on creating your own containers or customizing and extending existing containers.

## Chapter 13. NVIDIA Signed Container Images in NGC Catalog

Software signing is the standard mechanism for establishing trust when distributing software, determining which software to trust, and allowing for execution.

Container image signing adds a digital signature to an image. This signature allows users to validate where an image came from and verify the image was not tampered with.

Starting in July 2023, all NVIDIA container images published on the NGC Catalog will be signed.

## 13.1. Checking for Signed Container Images

There are two ways to determine which containers are signed.

### 13.1.1. Using the NGC Catalog UI

Click on Catalog > Containers from the left navigation menu. Expand the Signed Images filter to the left and select Yes. The container images tagged with Signed Images will display.



Select a container image to view the details. On the details page, you will see the Signed Images badge on the left panel and the Signed badge on the pane in the Tags tab.

NICIA. NGC   CATALOG		
CATALOG     Custalog Containers Validator for NVIDIA GPU Operator     Validator for NVIDIA GPU Operator     Validator for NVIDIA GPU Operator     Validator for NVIDIA GPU Operator	rator	Get Container ~
Callections Containers Helm Charts	Overview Tags Layers Security Scanning Related Collections	
Models Resources INFRASTRUCTURE	Search taga	×
Features	A public key is required to validate the signed images below. <u>View all public keys</u> maintained by NVIDIA.	
☆ NVIDIA Al Enterprise Supported     ♥ Signed Images	v23.6.2-ubi8         nvcr.io/nvidis/cloud-native/ openator-validator:v23.6.2-ubit           12/13/2023 5.35 PM         177.77 MB         2 Architectures	10U- 118 Q
Validates NVIDIA GPU Operator components		pu- Q
Publisher NVIDIA Latest Tag	v23.9.1     Signed       12/07/2023 442 PM     167.26 MB       2 Architectures     operator-validator:v23,9.1	Ipu- 🔾
v23.62-ubi8 Modified January 31, 2024	v23.9.1-ubi8         Signed           12/07/2023 441 PM         167.26 MB         2 Architectures	1pu- 118 🖬
Compressed Size 177.77 MB Multinode Support		ipu- 🔾
No Multi-Arch Support Yes	v23.9.0-ubi8 • Signed         nvcr.io/nvidia/cloud-native/ operator-validator:v23.9.0-ub           10/20/2023 12:48 PM         166.31 MB         2 Architectures	)pu- 18 Q
v23.6.2-ubi8 (Latest) Security Scan Results	©         v23.6.1-ubi8         nvcr.io/nvidia/cloud-native/openator-validator:v23.6.1-ub           08/30/2023 10.49 AM         177.26 MB         2 Architectures	pu- i8 Q
Linux / amd64	v23.6.1         nvcr.io/nvidia/cloud-native// operator-validator:v23.6.1	jpu- uqi
Signed images     Infrastructure Software     Kubernetes Infrastructure     Multi-Arch     Australia (S. 4)	v23.6.0-ubi8         nvcr.io/nvidia/cloud-native// operator-validator:v23.6.8-ub           08/04/2023 925 AM         178.15 MB         2 Architectures	jpu- ji8 Q
NVIDIA A Enterprise Supported     KVIDIA A Enterprise Supported	V23.6.0         nvcr.io/nvidia/cloud-native//           08/04/2023 9.25 AM         178.15 MB         2 Architectures         operator-validator:v23.6.8	ipu- a

### 13.1.2. Using the NGC CLI

#### To find signed container images using the CLI, issue the following:

\$ ngc registry image list <image\_name>

#### Example: List all images with name containing 'nginx'

\$ ngc registry image list '\*nginx\*'

Name	Repository	Latest Tag	Image Size	Updated Date	Permission	Signed Tag?
nginx	nvidia/todds_team/ngi   nx	1.24-bullseye-perl	65.35 MB	May 11, 2023	unlocked	False
nginx	nvidia/nvforge/nginx	1.23.1-debian-11-r30	35.83 MB	Apr 27, 2023	unlocked	False
nginx-bharti	nvidia/nginx-bharti	testing-sig	2.47 MB	Jan 06, 2023	unlocked	False
nginx	nvidia/ngc-web/nginx	latest	6.66 MB	Sep 30, 2019	unlocked	False
nginx2	nvidia/nginx2	sig-test2	54.35 MB	May 11, 2023	unlocked	True
testnosignnginx	nvidia/shobin-   test/testnosignnginx	no-signing	54.19 MB	Dec 01, 2022	unlocked	False
busybox nginx	nvidia/busybox nginx	3	754.69 KB	Nov 29, 2022	unlocked	False
nginx	nvidia/nginx	sig-test	54.35 MB	May 20, 2023	unlocked	True
nginx-bharti	h2yxhstnusdo/nginx-   bharti	test3	54.24 MB	Jan 12, 2023	unlocked	False
nginx-bharti2	h2yxhstnusdo/nginx- bharti2	test	54.24 MB	Jan 12, 2023	unlocked	False
nginx	nvidia/shobin-   test/nginx	sig-test	54.35 MB	May 11, 2023	unlocked	True
mynginx	nvidia/mynginx	latest	48.48 MB	Feb 24, 2020	unlocked	False
test_nginx	nvidia/ngc-product-   team/test_nginx	latest	42.73 MB	Mar 10, 2020	unlocked	False
ndash-nginx-router	nvidia/ndash-nginx-	1.0.0	48.62 MB	Nov 19, 2020	unlocked	False

If the image is signed, you can see a value populated in the Latest Tag column.

## 13.2. Finding NVIDIA's Public Key

The public key associated with the signed image can be used to validate its authenticity. You can find the public key of the container in the following ways.

### 13.2.1. Using the NGC Catalog UI

On the container details page, select the Tags tab. Click on "View all public keys" in the banner.

📀 NVIDIA. NGC   CATA	ALOG		
<ul> <li>CATALOG</li> <li>Explore Catalog</li> <li>Al Foundation Models</li> </ul>	Catalog > Containers > Validator for NVIDIA GPU C	operator	Get Container v
Collections Containers Helm Charts	<b>A</b>	Overview Tags Layers Security Scanning Related Collections	
Models Resources	NVIDIA.	Search tags	×
	Features	A public key is required to validate the signed images below. <u>View all public keys</u> maintained by NVIDIA.	
	VVIDIA AI Enterprise Supported     Signed Images	v23.6.2-ubi8         nvcr.io/nvidia/cloud-native/gpu- 12/13/2023 5.35 PM         177.77 MB         2 Architectures         nvcr.io/nvidia/cloud-native/gpu- operator-validator:v23.6.2-ubi8	۹
	Validates NVIDIA GPU Operator components	v23.6.2         nvcr.io/nvidia/cloud-native/gpu- 12/13/2023 5:35 PM         177.77 MB         2 Architectures         nvcr.io/nvidia/cloud-native/gpu- operator-validator:v23.6.2	۰ ٽ

The public key URL will display in the dialog.

NGC   CA	TALOG		Welcome Guest $ \smallsetminus $		
CATALOG     Explore Catalog     Al Foundation Models	CATALOG     Catalog > Containers > Validator for NVIDIA GPU Operator       Explore Catalog     Validator for NVIDIA GPU Operator       Al Foundation Models     Validator for NVIDIA GPU Operator				
Collections Containers Helm Charts	( <b>A</b> )	Overview Tags Layers Security Scanning Related Collections			
Models Resources	INFRASTRUCTURE	Search tags	×		
	Peatures         ☆ NVIDIA Al Enterprise Sur         ♥ Signed Images         Description         Validates NVIDIA GPU of components         Publisher         NVIDIA         NVIDIA         NVIDIA         Latest Tag	A public key is required to validate the signed images below. <u>View all public keys</u> maintained by NVIDIA.      ignatures for NVIDIA Container Images     egperator-validator:v23.6.2-ubi8     ed a digital signature to this container image to ensure its     and integrity. <u>View our documentation</u> for instructions on the     process.     blick key URL below to verify NVIDIA's signature:     api.ngc.nvidia.com/v2/catalog/containers/public-     process.			
	v23.6.2-ubi8 Modified January 31, 2024 Compressed Size	nvcr.io/nvidia/cloud-native/gpu- 12/07/2023 4:41 PM 167.26 MB 2 Architecture&perator-validator:v23.9.1-ub18	• ř		

### 13.2.2. Using the NGC CLI

To find NVIDIA's public key using the CLI, issue the following command:

```
$ ngc registry image publickey
-----BEGIN PUBLIC KEY-----
MFkwEwYHKoZIzj0CAQYIKoZIzj0DAQcDQgAEULvnBd1pnqM0UfjlSiOXIDpFNLAV
KzeNQpYeJITHFIYUhLr5dIVauww5MXr17+9I+Sh/3BiLNyXzISA+ZgnbDw==
-----END PUBLIC KEY-----
```

## 13.3. Verifying NVIDIA's Signature

The following tools are examples that you can use to verify the signature. There are also other tools available.

### 13.3.1. Using Cosign

Cosign is a tool for signing container images. To begin, follow the installation instructions provided at the URL below to set up Cosign:

https://docs.sigstore.dev/cosign/installation/

Once Cosign is set up, issue the following command to verify the signature of the container image:

\$ cosign verify [--key <key path>|<key url>|<kms uri>] <image uri>

Make sure to replace the placeholders within the square brackets with the appropriate values:

- <key path>: Path to the key file (if using a local key).
- <key URL>: URL pointing to the key file (if using a remote key).
- <KMS URI>: URI for the Key Management Service (if using a KMS for key management).
- <image URI>: URI of the container image you wish to verify.

Cosign 2.x releases introduced a new flag --insecure-ignore-tlog=true for keybased signing with the cosign verify command. Please include this flag when using Cosign 2.x versions. Prior to version 2.x, this flag is not required as it is set as the default behavior.

```
cosign verify --insecure-ignore-tlog [--key <key path>|<key url>|<kms uri>] <image
uri>
```

# 13.3.2. Using an Admission Controller in Kubernetes Clusters

Several Open Source Software (OSS) admission controllers offer the capability of sigstore-based image verification. These powerful tools allow you to verify the integrity and authenticity of containers deployed within your Kubernetes environment.

For example, Connaisseur is a Kubernetes admission controller that can be used to integrate container image signature verification and trust pinning into a cluster. It ensures that only signed images are allowed to run in a cluster.

To set up Connaisseur, follow the steps outlined in the documentation below:

- Getting started Guide
- Cosign Validator setup
- Test Connaisseur

After configuring the Connaisseur validator, you can test it by running a container in the Kubernetes (K8s) cluster using the following command for a signed image:

kubectl run test --image=\${IMAGE}

When you run the container with the command, the request is admitted to the cluster if the image is signed and passes the verification. Kubernetes will return the following response:

pod/test created

## Chapter 14. Running an NGC Container

Before you can run an NGC deep learning framework container, your Docker environment must support NVIDIA GPUs. To run a container, issue the appropriate command as explained in this chapter, specifying the registry, repository, and tags.

# 14.1. Enabling GPU Support for NGC Containers

To obtain the best performance when running NGC containers, three methods of providing GPU support for Docker containers have been developed:

- Native GPU support (included with Docker-ce 19.03 or later)
- NVIDIA Container Runtime for Docker (nvidia-docker2 package)
- Docker Engine Utility for NVIDIA GPUs (nvidia-docker package)

The method implemented in your system depends on the DGX OS version installed (for DGX systems), the specific NGC Cloud Image provided by a Cloud Service Provider, or the software that you have installed in preparation for running NGC containers on TITAN PCs, Quadro PCs, or vGPUs.

Refer to the following table to assist in determining which method is implemented in your system.

GPU Support Method	When Used	How to Determine
Native GPU Support	Included with Docker-ce 19.03 or later	Run docker version to determine the installed Docker version.
NVIDIA Container Runtime for Docker	If the nvidia-docker2 package is installed	Run nvidia-docker version and check for NVIDIA Docker version 2.0 or later
Docker Engine Utility for NVIDIA GPUs	If the nvidia-docker package is installed	Run nvidia-docker version and check for NVIDIA Docker version 1.x

Each method is invoked by using specific Docker commands, described as follows.

#### Using Native GPU support

Q

Note: If Docker is updated to 19.03 on a system which already has nvidia-docker or nvidia-docker2 installed, then the corresponding methods can still be used.

 To use the native support on a new installation of Docker, first enable the new GPU support in Docker.

\$ sudo apt-get install -y docker nvidia-container-toolkit

This step is not needed if you have updated Docker to 19.03 on a system with nvidiadocker2 installed. The native support will be enabled automatically.

- Use docker run --gpus to run GPU-enabled containers.
  - Example using all GPUs

\$ sudo docker run --gpus all ...

Example using two GPUs

\$ sudo docker run --gpus 2 ...

Examples using specific GPUs

\$ sudo docker run --gpus "device=1,2" ...

\$ sudo docker run --gpus "device=UUID-ABCDEF,1" ...

Using the NVIDIA Container Runtime for Docker

With the NVIDIA Container Runtime for Docker installed (nvidia-docker2), you can run GPU-accelerated containers in one of the following ways.

Use docker run and specify runtime=nvidia.

\$ sudo docker run --runtime=nvidia ...

Use nvidia-docker run.

\$ sudo nvidia-docker run ...

The new package provides backward compatibility, so you can still run GPUaccelerated containers by using this command, and the new runtime will be used.

Use docker run with nvidia as the default runtime.

You can set nvidia as the default runtime, for example, by adding the following line to the /etc/docker/daemon.json configuration file as the first entry.

"default-runtime": "nvidia",

The following is an example of how the added line appears in the JSON file. Do not remove any pre-existing content when making this change.

```
{
  "default-runtime": "nvidia",
  "runtimes": {
      "nvidia": {
          "path": "/usr/bin/nvidia-container-runtime",
          "runtimeArgs": []
      }
   },
}
```

You can then use docker run to run GPU-accelerated containers.

\$ sudo docker run ...

CAUTION: If you build Docker images while nvidia is set as the default runtime, make sure the build scripts executed by the Dockerfile specify the GPU architectures that the container will need. Failure to do so may result in the container being optimized only for the GPU architecture on which it was built. Instructions for specifying the GPU architecture depend on the application and are beyond the scope of this document. Consult the specific application build process for guidance.

Using the Docker Engine Utility for NVIDIA GPUs

With the Docker Engine Utility for NVIDIA GPUs installed (nvidia-docker), run GPUenabled containers as follows.

\$ sudo nvidia-docker run ...

### 14.2. Running NGC Containers with Runtime Resources

On a system with GPU support for NGC containers, the following occurs when running a container.

- The Docker Engine loads the image into a container which runs the software.
- You define the runtime resources of the container by including additional flags and settings that are used with the command. These flags and settings are described in the following sections.
- The GPUs are explicitly defined for the Docker container (defaults to all GPUs, can be specified using NV\_GPU environment variable).
  - Note: The base command docker run --gpu all assumes that your system has Docker 19.03-CE installed. See the section Enabling GPU Support for NGC Containers for the command to use for earlier versions of Docker.
- 1. As a user, run the container interactively.

The following example runs the December 2016 release (16.12) of the NVCaffe container in interactive mode. The container is automatically removed when the user exits the container.

\$ docker run --gpus all --rm -ti nvcr.io/nvidia/caffe:16.12

All rights reserved.

```
Various files include modifications (c) NVIDIA CORPORATION. All rights reserved.
NVIDIA modifications are covered by the license terms that apply to the
underlying project or file.
root@df57eb8e0100:/workspace#
```

2. From within the container, start the job that you want to run.

The precise command to run depends on the deep learning framework in the container that you are running and the job that you want to run. For details see the / workspace/README.md file for the container.

The following example runs the caffe time command on one GPU to measure the execution time of the deploy.prototxt model.

# caffe time -model models/bvlc\_alexnet/ -solver deploy.prototxt -gpu=0

3. Optional: Run the December 2016 release (16.12) of the same NVCaffe container but in non-interactive mode.

```
% docker run --gpus all --rm nvcr.io/nvidia/caffe:16.12 caffe time -model
    /workspace/models/bvlc_alexnet -solver /workspace/deploy.prototxt -gpu=0
```

### 14.2.1. Specifying A User

Unless otherwise specified, the user inside the container is the root user.

When running within the container, files created on the host operating system or network volumes can be accessed by the root user. This is unacceptable for some users and they will want to set the ID of the user in the container. For example, to set the user in the container to be the currently running user, issue the following:

% docker run --gpus all -ti --rm -u \$(id -u):\$(id -g) nvcr.io/nvidia/<repository>:<tag>

Typically, this results in warnings due to the fact that the specified user and group do not exist in the container. You might see a message similar to the following:

groups: cannot find name for group ID 1000I have no name! @c177b61e5a93:/workspace\$ The warning can usually be ignored.

### 14.2.2. Setting The Remove Flag

By default, Docker containers remain on the system after being run. Repeated pull or run operations use up more and more space on the local disk, even after exiting the container. Therefore, it is important to clean up the nvidia-docker containers after exiting.

Note: Do not use the --rm flag if you have made changes to the container that you want to save, or if you want to access job logs after the run finishes.

To automatically remove a container when exiting, add the --rm flag to the run command.

% docker run --gpus all --rm nvcr.io/nvidia/<repository>:<tag>

### 14.2.3. Setting The Interactive Flag

By default, containers run in batch mode; that is, the container is run once and then exited without any user interaction. Containers can also be run in interactive mode as a service.

To run in interactive mode, add the -ti flag to the run command. % docker run --gpus all -ti --rm nvcr.io/nvidia/<repository>:<tag>

### 14.2.4. Setting The Volumes Flag

There are no data sets included with the containers, therefore, if you want to use data sets, you need to mount volumes into the container from the host operating system. For more information, see <u>Manage data in containers</u>.

Typically, you would use either Docker volumes or host data volumes. The primary difference between host data volumes and Docker volumes is that Docker volumes are private to Docker and can only be shared amongst Docker containers. Docker volumes are not visible from the host operating system, and Docker manages the data storage. Host data volumes are any directory that is available from the host operating system. This can be your local disk or network volumes.

#### Example 1

Mount a directory /raid/imagedata on the host operating system as /images in the container.

#### Example 2

Mount a local docker volume named data (must be created if not already present) in the container as /imagedata.

% docker run --gpus all -ti --rm -v data:/imagedata nvcr.io/nvidia/<repository>:<tag>

### 14.2.5. Setting The Mapping Ports Flag

Applications such as Deep Learning GPU Training System<sup>™</sup> (DIGITS) open a port for communications. You can control whether that port is open only on the local system or is available to other computers on the network outside of the local system.

Using DIGITS as an example, in DIGITS 5.0 starting in container image 16.12, by default the DIGITS server is open on port 5000. However, after the container is started, you may not easily know the IP address of that container. To know the IP address of the container, you can choose one of the following ways:

Expose the port using the local system network stack (--net=host) where port 5000 of the container is made available as port 5000 of the local system.

or

Map the port (-p 8080:5000) where port 5000 of the container is made available as port 8080 of the local system.

In either case, users outside the local system have no visibility that DIGITS is running in a container. Without publishing the port, the port is still available from the host, however not from the outside.

### 14.2.6. Setting The Shared Memory Flag

Certain applications, such as PyTorch<sup>™</sup> and the Microsoft<sup>®</sup> Cognitive Toolkit<sup>™</sup>, use shared memory buffers to communicate between processes. Shared memory can also be required by single process applications, such as MXNet<sup>™</sup> and TensorFlow<sup>™</sup>, which use the NVIDIA<sup>®</sup> Collective Communications Library <sup>™</sup> (NCCL) (NCCL).

By default, Docker containers are allotted 64MB of shared memory. This can be insufficient, particularly when using all 8 GPUs. To increase the shared memory limit to a specified size, for example 1GB, include the --shm-size=1g flag in your docker run command.

Alternatively, you can specify the --ipc=host flag to re-use the host's shared memory space inside the container. Though this latter approach has security implications as any data in shared memory buffers could be visible to other containers.

### 14.2.7. Setting The Restricting Exposure Of GPUs Flag

From inside the container, the scripts and software are written to take advantage of all available GPUs. To coordinate the usage of GPUs at a higher level, you can use this flag to restrict the exposure of GPUs from the host to the container. For example, if you only want GPU 0 and GPU 1 to be seen in the container, you would issue the following:

Using native GPU support

```
$ docker run --gpus "device=0,1" ...
Using nvidia-docker2
$ NV_GPU=0,1 docker run --runtime=nvidia ...
Using nvidia-docker
```

\$ NV\_GPU=0,1 nvidia-docker run ...

This flag creates a temporary environment variable that restricts which GPUs are used.

Specified GPUs are defined per container using the Docker device-mapping feature, which is currently based on Linux <code>cgroups</code>.

### 14.2.8. Container Lifetime

The state of an exited container is preserved indefinitely if you do not pass the -rm flag to the docker run command. You can list all of the saved exited containers and their size on the disk with the following command:

\$ docker ps --all --size --filter Status=exited

The container size on the disk depends on the files created during the container execution, therefore the exited containers take only a small amount of disk space.

You can permanently remove a exited container by issuing: docker rm [CONTAINER ID] By saving the state of containers after they have exited, you can still interact with them using the standard Docker commands. For example:

- You can examine logs from a past execution by issuing the docker logs command.
   \$ docker logs 9489d47a054e
- You can extract files using the docker cp command.
   \$ docker cp 9489d47a054e:/log.txt .
- You can restart a stopped container using the docker restart command. \$ docker restart <container name>

For the NVCaffe<sup>™</sup> container, issue this command: \$ docker restart caffe

You can save your changes by creating a new image using the docker commit command. For more information, see <u>Example 3: Customizing a Container using</u>.

Note: Use care when committing Docker container changes, as data files created during use of the container will be added to the resulting image. In particular, core dump files and logs can dramatically increase the size of the resulting image.

## Chapter 15. Multi-Architecture Support for NGC Container Images

The NGC Container Registry allows users to leverage <u>docker multi-architecture</u>. It can support multiple architectures, which means that a single image may contain variants for different CPU architectures like ARM, x86, IBM POWER and others; and sometimes for different operating systems, such as Windows. When running an image, docker will automatically select an image variant which matches the target deployment OS and architecture.

#### Manifest Lists and Tags

The NGC Container Registry supports the manifest list schema application/ vnd.docker.distribution.manifest.list.v2+json providing the ability to assign multiple tags per image. To inspect the manifest list, please follow the instructions <u>here</u>.

NGC UI allows users to easily identify multi-architecture containers and see the supported CPU architectures.

	Multi-Arch		Size	
multi				
03/09/2020 10:38AM	0		48.05 MB	
lanifest				
DIGEST		OS/ARCH	COMPRESSED SIZE	CREATED
sha256:3f26741aa0e01b0edfd4e08a4	11e43756ea7b9d649b3b272cea7fff981a4519b	linux/amd64	48.05 MB	03/09/2020
sha256.6d86b91bfb22c74a1ddc5c2ac	8604f37de5621bd4e016a5b3866ec0cf655c712	linux/arm64	46.89 MB	03/09/2020

#### Basic Docker Commands for Multi-architecture Images

Inspect Manifest : Display an image manifest or manifest list

\$ docker manifest inspect <container\_name>:<tag>

More help on manifest: link

Pull a specific image for an architecture

In order to pull an image with a specific architecture, first do docker manifest which lists multiple platforms and then pull with a specific platform name that matches with the manifest digest.

\$ docker pull --platform=<arch>

More help on the above docker command: link

## Chapter 16. Customizing Containers

NGC images come prepackaged, tuned, and ready to run; however, you may want to build a new image from scratch or augment an existing image with custom code, libraries, data, or settings for your corporate infrastructure. This section will guide you through exercises that will highlight how to create a container from scratch, customize a container, extend a deep learning framework to add features, develop some code using that extended framework from the developer environment, then package that code as a versioned release.

By default, you do not need to build a container. The NGC container registry, nvcr.io, has a number of containers that can be used immediately. These include containers for deep learning, scientific computing and visualization, as well as containers with just the CUDA Toolkit.

One of the great things about containers is that they can be used as starting points for creating new containers. This can be referred to as "customizing" or "extending" a container. You can create a container completely from scratch, however, since these containers are likely to run on a GPU system, it is recommended that you are least start with a nvcr.io container that contains the OS and CUDA. However, you are not limited to this and can create a container that runs on the CPUs in the system which does not use the GPUs. In this case, you can start with a bare OS container from Docker. However, to make development easier, you can still start with a container with CUDA - it is just not used when the container is used.

In the case of the DGX-1 and the DGX Station, you can push or save your modified/ extended containers to the NVIDIA DGX container registry, nvcr.io. They can also be shared with other users of the DGX system but this requires some administrator help.

Currently, you cannot save customized containers from the NGC container registry (cloud based) solution to nvcr.io. The customized or extended containers can be saved to a user's private container repository. The customized or extended containers can be saved to a user's private container repository.

It is important to note that all NGC deep learning framework images include the source to build the framework itself as well as all of the prerequisites.

ATTENTION: Do not install an NVIDIA driver into the Docker<sup>®</sup> image at Docker build time. nvidia-docker is essentially a wrapper around Docker that transparently provisions a container with the necessary components to execute code on the GPU. NVIDIA provides a large set of images in the NGC container registry that are already tested, tuned, and are ready to run. You can pull any one of these images to create a container and add software or data of your choosing.

A best-practice is to avoid docker commit usage for developing new docker images, and to use Dockerfiles instead. The Dockerfile method provides visibility and capability to efficiently version-control changes made during development of a docker image. The docker commit method is appropriate for short-lived, disposable images only (see Example 3: Customizing A Container Using docker commit for an example).

For more information on writing a Docker file, see the best practices documentation.

## 16.1. Benefits And Limitations To Customizing A Container

You can customize a container to fit your specific needs for numerous reasons; for example, you depend upon specific software that is not included in the container that NVIDIA provides. No matter your reasons, you can customize a container.

The container images do not contain sample data-sets or sample model definitions unless they are included with the framework source. Be sure to check the container for sample data-sets or models.

### 16.2. Example 1: Building A Container From Scratch

Docker uses Dockerfiles to create or build a Docker image. Dockerfiles are scripts that contain commands that Docker uses successively to create a new Docker image. Simply put, a Dockerfile is the source code for the container image. Dockerfiles always start with a base image to inherit from.

For more information, see **Best practices for writing Dockerfiles**.

- 1. Create a working directory on your local hard-drive.
- 2. In that directory, open a text editor and create a file called Dockerfile. Save the file to your working directory.
- 3. Open your Dockerfile and include the following:

```
FROM ubuntu:14.04

RUN apt-get update && apt-get install -y curl

CMD echo "hello from inside a container"

Where the last line CMD, executes the indicated command when creating the

container. This is a way to check that the container was built correctly.
```

For this example, we are also pulling the container from the Docker repository and not the  $DGX^{M}$  system repository. There will be subsequent examples using the NVIDIA<sup>®</sup> repository.

4. Save and close your Dockerfile.

5. Build the image. Issue the following command to build the image and create a tag. \$ docker build -t <new image name>:<new tag> .

Note: This command was issued in the same directory where the Dockerfile is located.

The output from the docker build process lists "Steps"; one for each line in the Dockerfile.

For example, let us name the container test1 and tag it with latest. Also, for illustrative purposes, let us assume our private DGX system repository is called nvidian sas. The command below builds the container. Some of the output is shown below so you know what to expect.

```
$ docker build -t test1:latest .
Sending build context to Docker daemon 3.072 kB
Step 1/3 : FROM ubuntu:14.04
14.04: Pulling from library/ubuntu
Step 2/3 : RUN apt-get update && apt-get install -y curl
Step 3/3 : CMD echo "hello from inside a container"
 ---> Running in 1f491b9235d8
---> 934785072daf
Removing intermediate container 1f491b9235d8
Successfully built 934785072daf
```

For information about building your image, see <u>docker build</u>. For information about tagging your image, see <u>docker tag</u>.

6. Verify that the build was successful. You should see a message similar to the following:

Successfully built 934785072daf

This message indicates that the build was successful. Any other message and the build was not successful.

Note: The number, 934785072daf, is assigned when the image is built and is random.

7. Confirm you can view your image by issuing the following command and view your container.

\$ docker images				
REPOSITORY	TAG	IMAGE ID	CREATED	SIZE
test1	latest	934785072daf	19 minutes ago	222 MB
The new contai	ner is now avai	ilable to be used	d.	



Note: The container is local to this DGX system. If you want to store the container in your private repository, follow the next step.

8. Store the container in your private Docker repository by pushing it.



Note: This applies if you have a private registry account associated with the DGX system purchased by your organization.

- a). The first step in pushing it, is to tag it.
  - \$ docker tag test1 nvcr.io/nvidian\_sas/test1:latest

b). Now that the image has been tagged, you can push it to, for example, a private project on nvcr.io named nvidian\_sas.

```
$ docker push nvcr.io/nvidian_sas/test1:latest
The push refers to a repository [nvcr.io/nvidian_sas/test1]
```

c). Verify that the container appears in the nvidian\_sas repository.

### 16.3. Example 2: Customizing A Container Using Dockerfile

This example uses a Dockerfile to customize the NVCaffe container in nvcr.io. Before customizing the container, you should ensure the NVCaffe 17.03 container has been loaded into the registry using the docker pull command before proceeding. \$ docker pull nvcr.io/nvidia/caffe:17.03

As mentioned earlier in this document, the Docker containers on nvcr.io also provide a sample Dockerfile that explains how to patch a framework and rebuild the Docker image. In the directory /workspace/docker-examples, there are two sample Dockerfiles. For this example, we will use the Dockerfile.customcaffe file as a template for customizing a container.

- 1. Create a working directory called my docker images on your local hard drive.
- 2. Open a text editor and create a file called Dockerfile. Save the file to your working directory.
- 3. Open your Dockerfile again and include the following lines in the file:

```
FROM nvcr.io/nvidia/caffe:17.03
# APPLY CUSTOMER PATCHES TO CAFFE
# Bring in changes from outside container to /tmp
# (assumes my-caffe-modifications.patch is in same directory as
Dockerfile)
#COPY my-caffe-modifications.patch /tmp
# Change working directory to NVCaffe source path
WORKDIR /opt/caffe
# Apply modifications
#RUN patch -p1 < /tmp/my-caffe-modifications.patch</pre>
# Note that the default workspace for caffe is /workspace
RUN mkdir build && cd build && \
  cmake -DCMAKE INSTALL PREFIX:PATH=/usr/local -DUSE NCCL=ON
-DUSE CUDNN=ON -DCUDA ARCH NAME=Manual -DCUDA ARCH BIN="35 52 60 61"
-DCUDA_ARCH_PTX="61" .. && \
 make -j"$(nproc)" install && \
 make clean && \
 cd .. && rm -rf build
# Reset default working directory
WORKDIR /workspace
Save the file.
```

4. Build the image using the docker build command and specify the repository name and tag. In the following example, the repository name is *corp/caffe* and the tag is *17.03.1PlusChanges*. For the case, the command would be the following:

\$ docker build -t corp/caffe:17.03.1PlusChanges .

5. Run the Docker image using the command appropriate to the methoid of GPU support installed.

\$ docker run --gpus all -ti --rm corp/caffe:17.03.1PlusChanges .

Note: The base command docker run --gpu all assumes that your system has Docker 19.03-CE installed. See the section <u>Enabling GPU Support for NGC Containers</u> for the command to use for earlier versions of Docker.

### 16.4. Example 3: Customizing A Container Using docker commit

This example uses the docker commit command to flush the current state of the container to a Docker image. This is not a recommended best practice, however, this is useful when you have a container running to which you have made changes and want to save them. In this example, we are using the apt-get tag to install packages which requires that the user run as root.

#### Note:

- The NVCaffe image release 17.04 is used in the example instructions for illustrative purposes.
- Do not use the --rm flag when running the container. If you use the --rm flag when running the container, your changes will be lost when exiting the container.
- 1. Pull the Docker container from the nvcr.io repository to the DGX system. For example, the following command will pull the NVCaffe container:

\$ docker pull nvcr.io/nvidia/caffe:17.04

2. Run the container on the DGX system.

```
$ docker run --gpus all -ti nvcr.io/nvidia/caffe:17.04
```

```
=== NVIDIA Caffe ==
```

NVIDIA Release 17.04 (build 26740)

Container image Copyright (c) 2017, NVIDIA CORPORATION. All rights reserved. Copyright (c) 2014, 2015, The Regents of the University of California (Regents) All rights reserved.

Various files include modifications (c) NVIDIA CORPORATION. All rights reserved. NVIDIA modifications are covered by the license terms that apply to the underlying project or file.
```
NOTE: The SHMEM allocation limit is set to the default of 64MB. This may be insufficient
for NVIDIA Caffe. NVIDIA recommends the use of the following flags:
nvidia-docker run --shm-size=1g --ulimit memlock=-1 --ulimit stack=67108864 ...
```

root@1fe228556a97:/workspace#



Note: The base command docker run --gpu all assumes that your system has Docker 19.03-CE installed. See the section <u>Enabling GPU Support for NGC Containers</u> for the command to use for earlier versions of Docker.

3. You should now be the root user in the container (notice the prompt). You can use the command apt to pull down a package and put it in the container.

Note: The NVIDIA containers are built using Ubuntu which uses the apt-get package manager. Check the container release notes <u>Deep Learning Documentation</u> for details on the specific container you are using.

In this example, we will install Octave; the GNU clone of MATLAB, into the container.

```
# apt-get update
# apt install octave
```

**Note: You have to first issue** apt-get update before you install Octave using apt.

4. Exit the workspace.

# exit

5. Display the list of containers using docker ps -a. As an example, here is some of the output from the docker ps -a command:

```
$ docker ps -a
CONTAINER ID IMAGE CREATED ...
1fe228556a97 nvcr.io/nvidia/caffe:17.04 3 minutes ago ...
```

6. Now you can create a new image from the container that is running where you have installed Octave. You can commit the container with the following command.

```
$ docker commit 1fe228556a97 nvcr.io/nvidian_sas/caffe_octave:17.04
sha256:0248470f46e22af7e6cd90b65fdee6b4c6362d08779a0bc84f45de53a6ce9294
```

7. Display the list of images.

\$ docker images			
REPOSITORY	TAG	IMAGE ID	
nvidian_sas/caffe_octave	17.04	75211f8ec225	

8. To verify, let's run the container again and see if Octave is actually there.

Note: This only works for the DGX-1 and the DGX Station.

```
Various files include modifications (c) NVIDIA CORPORATION. All rights reserved. NVIDIA
modifications are covered by the license terms that apply to the underlying project or
file.
NOTE: The SHMEM allocation limit is set to the default of 64MB. This may be insufficient
for NVIDIA Caffe. NVIDIA recommends the use of the following flags:
  nvidia-docker run --shm-size=1g --ulimit memlock=-1 --ulimit stack=67108864 ...
root@2fc3608ad9d8:/workspace# octave
octave: X11 DISPLAY environment variable not set
octave: disabling GUI features
GNU Octave, version 4.0.0
Copyright (C) 2015 John W. Eaton and others.
This is free software; see the source code for copying conditions.
There is ABSOLUTELY NO WARRANTY; not even for MERCHANTABILITY or
FITNESS FOR A PARTICULAR PURPOSE. For details, type 'warranty'.
Octave was configured for "x86_64-pc-linux-gnu".
Additional information about Octave is available at http://www.octave.org.
Please contribute if you find this software useful.
For more information, visit http://www.octave.org/get-involved.html
Read http://www.octave.org/bugs.html to learn how to submit bug reports.
For information about changes from previous versions, type 'news'.
octave:1>
```

Since the Octave prompt displayed, Octave is installed.

9. If you want to save the container into your private repository (Docker uses the phrase "push"), then you can use the command docker push ....

```
$ docker push nvcr.io/nvidian_sas/caffe_octave:17.04
```

The new Docker image is now available for use. You can check your local Docker repository for it.

# 16.5. Example 4: Developing A Container Using Docker

There are two primary use cases for a developer to extend a container:

- 1. Create a development image that contains all of the immutable dependencies for the project, but not the source code itself.
- 2. Create a production or testing image that contains a fixed version of the source and all of the software dependencies.

The datasets are not packaged in the container image. Ideally, the container image is designed to expect volume mounts for datasets and results.

In these examples, we mount our local dataset from /raid/datasets on our host to /dataset as a read-only volume inside the container. We also mount a job specific directory to capture the output from a current run.

In these examples, we will create a timestamped output directory on each container launch and map that into the container at /output. Using this method, the output for each successive container launch is captured and isolated.

Including the source into a container for developing and iterating on a model has many awkward challenges that can over complicate the entire workflow. For instance, if your source code is in the container, then your editor, version control software, dotfiles, etc. also need to be in the container.

However, if you create a development image that contains everything you need to run your source code, you can map your source code into the container to make use of your host workstation's developer environment. For sharing a fixed version of a model, it is best to package a versioned copy of the source code and trained weights with the development environment.

As an example, we will work though a development and delivery example for the open source implementation of the work found in <u>Image-to-Image Translation</u> with Conditional Adversarial Networks by Isola et. al. and is available at <u>pix2pix</u>. Pix2Pix is a Torch implementation for learning a mapping from input images to output images using a Conditional Adversarial Network. Since online projects can change over time, we will focus our attention on the snapshot version d7e7b8b557229e75140cbe42b7f5dbf85a67d097 change-set.

In this section, we are using the container as a virtual environment, in that the container has all the programs and libraries needed for our project.

Note: We have kept the network definition and training script separate from the container image. This is a useful model for iterative development because the files that are actively being worked on are persistent on the host and only mapped into the container at runtime.

The differences to the original project can be found here Comparing changes.

If the machine you are developing on is not the same machine on which you will be running long training sessions, then you may want to package your current development state in the container.

- Create a working directory on your local hard-drive.
   mkdir Projects
   cd ~/Projects
- 2. Git clone the Pix2Pix git repository.
  - \$ git clone https://github.com/phillipi/pix2pix.git \$ cd pix2pix
- 3. Run the git checkout command.

\$ git checkout -b devel d7e7b8b557229e75140cbe42b7f5dbf85a67d097

4. Download the dataset:

```
bash ./datasets/download_dataset.sh facades
```

```
I want to put the dataset on my fast /raid storage.
```

```
$ mkdir -p /raid/datasets
$ mv ./datasets/facades /raid/datasets
```

5. Create a file called Dockerfile, and add the following lines:

```
FROM nvcr.io/nvidia/torch:17.03
RUN luarocks install nngraph
RUN luarocks install
https://raw.githubusercontent.com/szym/display/master/display-scm-0.rockspec
WORKDIR /source
```

6. Build the development Docker container image (build-devel.sh).

docker build -t nv/pix2pix-torch:devel .

7. Create the following train.sh script:

```
#!/bin/bash -x
ROOT="${ROOT:-/source}"
DATASET="${DATASET:-facades}"
DATA_ROOT="${DATA_ROOT:-/datasets/$DATASET}"
DATA_ROOT=$DATA_ROOT name="${DATASET}_generation"
which_direction=BtoA th train.lua
```

If you were actually developing this model, you would be iterating by making changes to the files on the host and running the training script which executes inside the container.

- 8. Optional: Edit the files and execute the next step after each change.
- 9. Run the training script (run-devel.sh).

```
docker run --gpus all --rm -ti -v $PWD:/source -v
/raid/datasets:/datasets nv/pix2pix-torch:devel ./train.sh
```

Note: The base command docker run --gpu all assumes that your system has Docker 19.03-CE installed. See the section <u>Enabling GPU Support for NGC Containers</u> for the command to use for earlier versions of Docker.

## 16.5.1. Example 4.1: Package The Source Into The Container

Packaging the model definition and script into the container is very simple. We simply add a COPY step to the Dockerfile.

We've updated the run script to simply drop the volume mounting and use the source packaged in the container. The packaged container is now much more portable than our devel container image because the internal code is fixed. It would be good practice to version control this container image with a specific tag and store it in a container registry.

The updates to run the container are equally subtle. We simply drop the volume mounting of our local source into the container.

## Chapter 17. Models

A discussion of NGC models and how to download them from the NGC Catalog.

#### 17.1. What are Models

Many AI applications have common needs: classification, object detection, language translation, text-to-speech, recommender engines, sentiment analysis, and more. When developing applications with these capabilities, it is much faster to start with a model that is pre-trained and then tune it for a specific use case.

NGC offers pre-trained models for a large number of AI tasks that are optimized for NVIDIA Tensor Core GPUs, and can be easily re-trained by updating just a few layers, saving valuable time.

So whether you're looking for content you can simply retrain for your specific use case or a complete model you can grab and deploy right away, NGC has you covered.

## 17.2. Searching and Filtering Models

To view NGC models, navigate to Catalog > Models in the left menu. Use the search bar at the top of the page to filter the types of models or sort the list using the criteria from the dropdown menu. You can refine your search by utilizing the filters under Use Case, NVIDIA Platform, NVIDIA AI Enterprise, and many others. The descriptions for the filtering options are as follows:

- Use Case: Choose from the available common use cases.
- NVIDIA AI Enterprise Support: Select this option to find publicly available models supported by NVAIE.
- NVIDIA Platform: Choose from Clara, DeepStream, TensorFlow, and many others.
- > NVIDIA AI Enterprise Exclusive: Choose products under this to see entitled entities.
- Framework: Filter by framework such as TAO Toolkit, PyTorch, and Riva.
- Industry: Select by available industries.
- Solution: Select the solution that closely matches your use case.
- > Publisher: Filter by publisher.

- Language: Select by language.
- Other: Miscellaneous options.

The following example page shows the available models when searching on 'deep learning':



The filters will contain the results for the matching search criteria or "No results found" if there aren't any matches.

## 17.3. Downloading Models via NGC CLI

A discussion of NGC models and how to download them from the NGC Catalog.

To download a model from the registry to your local disk, specify the model name and version.

```
$ ngc registry model download-version <org-name>/<model-name:version>
```

#### Example

 $\$  ngc registry model download-version nvidia/ngcdocsmodel:1

The following is an example showing the output confirming completion of the download:

Downloaded 230.92 MB in 38s, Download speed: 6.07 MB/s

```
Transfer id: trt_onnx_vgg16_v100_16g_int8_v1 Download status: Completed.
Downloaded local path: C:\ngcdocsmodel
Total files downloaded: 3
Total downloaded size: 230.92 MB
Started at: 2019-03-18 14:09:31.664000
Completed at: 2019-03-18 14:10:09.712000
Duration taken: 38s seconds
```

The model is downloaded to a folder that corresponds to the model name in the current directory. You can specify another path using the -d . option.

Example: Downloading a model to a specific directory (/models).

### 17.4. Downloading Models via WGET/ cURL

## 17.4.1. Downloading Guest Access Models via WGET/cURL

How to download guest access models via WGET/cURL.

To get a copy of a single file from an NGC Model via wget/curl you can use the URL provided in the NGC UI.

1. Open the NGC UI, click Models from the left navigation menu and then locate and click the model you want to download.



2. Click the Download button on the top right or navigate to the File Browser tab.



3. Select the Copy curl cmd or Copy wget cmd to copy the relevant code to the clipboard.

atalog > Models > TrafficCamNet				Dc	wnload ~
	Overview Ve	rsion History File Browser Related Collections			
<b>@</b>	pruned_v1.0.3	Filter files			×
TAO	pruned_v1.0.2	File	Size	Modified	Actions
	pruned_v1.0.1				
Features	pruned_v1.0	labels.txt	29 B	a year ago	
☆ NVIDIA AI Enterprise Supported	unpruned_v	nvinfer_config.txt	310 B	a year ago	
escription class object detection network to etect cars in an image.		resnet18_trafficcamnet_pruned.etIt	5.20 MB	a year ago	
Publisher NVIDIA		trafficcamnet_int8.txt	5 kB	a yea ;	opy curl cm
atest Version				ΥD	ownload File
pruned_v1.0.3					

The following will then be added to your clipboard:

```
$ wget https://api.ngc.nvidia.com/v2/models/nvidia/<model-name>/versions/
<version>/files/<filename>
```

## 17.4.2. Downloading Authenticated Access Models via WGET/cURL

How to download authenticated access models via WGET/cURL.

- 1. Obtain an NGC API Key. See <u>Generating NGC API Keys</u>. This will be referred to as <*API-key*> below.
- 2. Find orgs and teams scope and model name, model version.

In the example below the *<org>* is nvidia and *<team>* is riva, *<model-name>* is speechtotext\_en\_us\_conformer\_xl, *<version>* is trainable\_v4.0, *<file-name>* is Conformer-CTC-XL\_spe-128\_en-US\_Riva-ASR-SET-4.0.nemo



Note: Not all models are within a team. In this case, the model name follows directly after the org name.

3. Generate a Bearer token.

Note: The token is valid for 15 minutes. If the model is not in a team context, /<team> is ommitted.

```
API_KEY=<API-key>
TOKEN=$(curl -s -u "\$oauthtoken":"$API_KEY" -H 'Accept:application/json'
    'https://authn.nvidia.com/token?service=ngc&scope=group/ngc:<org>&group/
ngc:<org>/<team>' | jq -r '.token')
```

- 4. Download the model using curl.
  - a). Download the model ZIP using curl.

Note: If the model is not in a team context, team/<team>/ is omitted.

echo "Download Model ZIP"

```
curl -L0 'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/models/<model-
name>/versions/<version>/zip' -H "Authorization: Bearer ${TOKEN}" -H "Content-
Type: application/json"
```

Example model zip download:

echo "Download Model ZIP"

```
curl -LO 'https://api.ngc.nvidia.com/v2/org/nvidia/team/riva/models/
speechtotext_en_us_conformer_xl/versions/trainable_v4.0/zip' -H
"Authorization: Bearer ${TOKEN}" -H "Content-Type: application/json"
```

#### b). Download a model file using curl

Note: If the model is not in a team context, team/<team>/ is omitted.

echo "Download Model file"

```
curl -LO --request GET 'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/
models/<model-name>/versions/<version>/files/<file-name>' -H "Authorization:
Bearer ${TOKEN}" -H "Content-Type: application/json"
```

Example model file download:

```
echo "Download Model file"
curl -LO --request GET 'https://api.ngc.nvidia.com/v2/org/nvidia/team/
riva/models/speechtotext_en_us_conformer_x1/versions/trainable_v4.0/files/
Conformer-CTC-XL_spe-128_en-US_Riva-ASR-SET-4.0.nemo' -H "Authorization:
Bearer ${TOKEN}" -H "Content-Type: application/json"
```

#### 5. Download the model using wget.

a). Download the model ZIP using wget.

Note: If the model is not in a team context, team/<team>/ is omitted.

```
echo "Download Model ZIP"
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/models/<model-name>/
versions/<version>/zip' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

#### Example model zip download:

```
echo "Download Model ZIP"
```

```
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/nvidia/team/riva/models/
speechtotext_en_us_conformer_xl/versions/trainable_v4.0/zip' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

#### b). Download a model file using wget

Note: If the model is not in a team context, team/<team>/ is omitted.

echo "Download Model file"

```
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/models/<model-name>/
versions/<version>/files/<file-name>' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

#### Example model file download:

echo "Download Model file"

```
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/nvidia/team/riva/models/
speechtotext_en_us_conformer_xl/versions/trainable_v4.0/files/Conformer-CTC-
XL_spe-128_en-US_Riva-ASR-SET-4.0.nemo' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

## 17.5. Downloading Models via Web UI

How to download NGC models via the Web UI.

#### Downloading the Latest Version of a Model

To download the latest version of a model to your local machine, performing the following.

- 1. Open the NGC UI, click Models from the top content type ribbon and then locate and click the model you want to download.
- 2. Click the actions menu from the top right corner of the model detail page and then click Download <version>.

Example



#### Downloading a Specific Version of a Model

To download a specific version of a model, performing the following.

- 1. Open the NGC UI, click Models from the top content type ribbon and then locate and click the model you want to download.
- 2. Click the Version History tab, then click the actions icon for the version to download and then click Download .

The following diagram illustrates the steps.

atalog > Models > PeopleSemSegnet PeopleSemSegnet		Download
_	Overview Version History File Browser Related Collections	
	deployable_quantized_vanilla_unet_v2.0 08/22/2022 11:55 AM Accuracy: 80 120 Epochs Batch Size: 1 GPU: V10	0 118.71 MB ~
Features	deployable_vanilla_unet_v2.0.1     08/22/2022 11:54 AM Accuracy: 80 120 Epochs Batch Size: 1 GPU: V10	0 🛓 Download
☆ NVIDIA AI Enterprise Supported Description	1. MODEL OVERVIEW	View Files
Semantic segmentation of persons in an	KEY VALUE	
inage.	2. Model Architecture UNet	
Publisher	7. RUNTIME(S) Deepstream	
	8. Supported OS LINUX, LINUX4TEGRA	
Latest Version	6. Trainable False	
deployable_quantized_vanilia_unet_v2.0	5. Output Category label (person or bi	
Modified	1. Description Semantic segmentation of J	
July 24, 2023	3. Backbone Vanilla UNet Dynamic	
Size	4. Input <u>TYPE:RGBIMAGE:DIMENSIC</u>	
118.71 MB	9. Supported Hardware All NVIDIA GPUS INCLUDIN	
AI Computer Vision DL NVIDIA AI		
NVIDIA AI Enterprise Supported Retail	• • • • • • • • • • • • • • • • • • •	
Smart Cities / Spaces Application	deployable_vanilla_unet_v2.0 05/25/2022 8:47 AM Accuracy: 80 120 Epochs Batch Size: 1 GPU: V100	118.71 MB ~
	gram         trainable_vanilla_unet_v2.0           05/25/2022 8:44 AM         Accuracy: 80         120 Epochs         Batch Size: 1         GPU: V100	1.77 GB ~

## Chapter 18. Resources

Description of NGC resources, their purpose, and how to use them.

#### 18.1. What are Resources?

NGC resources offer documentation, code samples, and many other assets such as Jupyter Notebooks, deployment pipelines, and step-by-step instructions and scripts for creating deep learning models. These scripts have sample performance and accuracy metrics that allow you to compare your results. These scripts provide expert guidance on building DL models for image classification, language translation, text-to-speech, and more. Data scientists can quickly build performance-optimized models by easily adjusting the hyperparameters.

## 18.2. Searching and Filtering Resources

To view NGC resources, navigate to Catalog > Resources in the left menu. Use the search bar at the top of the page to filter on resources or sort the list using the criteria from the dropdown menu. You can refine your search by utilizing the filters under Use Case, NVIDIA Platform, NVIDIA AI Enterprise, and many others. The descriptions for the filtering options are as follows:

- Use Case: Choose from the available common use cases.
- NVIDIA Platform: Choose from Clara, DeepStream, TensorFlow, and many others.
- NVIDIA AI Enterprise Support: Select this option to find publicly available resources supported by NVAIE.
- NVIDIA AI Enterprise: Choose products under this to see entitled entities.
- Quick Deploy: Select this option to find containers to quickly deploy your artifacts in a Jupyter environment.
- Framework: Filter by framework such as MXNet or NeMo.
- Industry: Select by available industries.
- Solution: Select the solution that closely matches your use case.
- Publisher: Filter by publisher.

- Type: Filter by type.
- Language: Select by language.
- Other: Miscellaneous options.

The following example page shows the search and filtering options available when logging in as a guest user:

📀 NVIDIA. NGC   CATA	ALOG			Welcome Guest $ arsia $
CATALOG Explore Catalog A Foundation Models Collections Containers Helm Charts Models Resources	Catalog > Resources The NGC catalog off machine learning, comp	ers step outer visi	Resources by-step instructions and scripts through Jupyter Notebo on, and conversational AL These resources help you exi build AI faster, while taking advantage of best practi	boks for various use cases, including amine, understand, customize, test, and ces.
	Q Search resources			Sort: Most Popular
	Use Case	×	Displaying 241 resources	
	NVIDIA Platform	×		
	NVIDIA AI Enterprise Support 🜒	^		
	Yes	3	TOTOTIALS	nine.
	NVIDIA AI Enterprise Exclusive	^	Getting Start with Recommender S	Riva Skills Quick Start
	NVIDIA AI Enterprise Essentials	2	collaborative filtering focuses on providing recommendations.	with Riva Speech Skills
	Quick Deploy	×		
	Industry	* v		
	Solution	~	View Labels Learn More	View Labels Learn More
	Publisher	~		
	Туре	×		<b></b>
	Language	~	DEEP LEARNING EXAMPLES	TAO
Collapse</th <th>Other</th> <th>×</th> <th>Wide &amp; Deep for TensorFlow2</th> <th>TAO Converter</th>	Other	×	Wide & Deep for TensorFlow2	TAO Converter

# 18.3. Downloading Resources via the NGC CLI

To download a resource from the registry to your local disk, specify the resource name and version.

\$ ngc registry resource download-version nvidia/<resource-name:version>

Example: Downloading a resource to the current directory.

\$ ngc registry resource download-version nvidia/gnmt\_v2\_for\_tensorflow:1

The following is an example showing the output confirming completion of the download:

Downloaded 130.6 KB in 1s, Download speed: 130.6 KB/s Transfer id: gnmt\_v2\_for\_tensorflow\_v1 Download status: Completed. Downloaded local path: C:\gnmt\_v2\_for\_tensorflow\_v1 Total files downloaded: 35 Total downloaded size: 130.6 KB Started at: 2019-03-20 11:24:00.168000 Completed at: 2019-03-20 11:24:01.176000 Duration taken: 1s seconds

The model is downloaded to a folder that corresponds to the model name in the current directory. You can specify another path using the -d option.

Example: Downloading a resource to a specific directory (/resources).

#### 18.4. Downloading Resources via WGET/ cURL

#### 18.4.1. Downloading Guest Access Resources via WGET/cURL

How to download guest access resources via WGET/cURL.

To get a copy of a single file from an NGC Resource via wget/curl you can use the URL provided in the NGC UI.

1. Open the NGC UI, click Resources from the left navigation menu and then locate and click the resource you want to download.



2. Click the Download button on the top right or navigate to the File Browser tab.



3. Select the Copy curl cmd or Copy wget cmd to copy the relevant code to the clipboard.

Catalog > Resources > TAO Image Classification TAO Image Classification							Download	d ~ Dep	bloy to Vertex Al
	Overview	Ver	sion History	File Browser	Release Notes	Related Collec	tions		
	1		Filter files						×
TUTORIALS			File				Size	Modified	Actions
Features			늘 classificatio	on					
不 Quick Deploy			specs						
In this notebook, you will learn how to			Classifica	ation.ipynb View No	tebook		3.26 MB	2 years a	go •••
TAO to take a pretrained resnet18 model and finetune on a sample dataset									🛓 Deploy Notel
converted from PascalVOC.									Copy curl cm
NVIDIA									
Latest Version									

The following will then be added to your clipboard:

```
wget --content-disposition https://api.ngc.nvidia.com/v2/resources/nvidia/
tao_classification/versions/1/zip -0 tao_classification_1.zip
```

```
curl -L0 'https://api.ngc.nvidia.com/v2/resources/nvidia/tao_classification/
versions/1/files/classification/classification.ipynb'
```

#### 18.4.2. Downloading Authenticated Access Resources via WGET/cURL

How to download authenticated access resources via WGET/cURL.

- 1. Obtain an NGC API Key. See <u>Generating NGC API Keys</u>. This will be referred to as <*API-key*> below.
- 2. Find orgs and teams scope and resource name, resource version.

In the example below, the *<org>* is nvidia and *<team>* is riva, *<resource-name>* is riva\_quickstart, *<version>* is 2.9.0, *<file-name>* is riva\_init.sh

Rive Stells Quick Start   M/D/A   X + Org team resource name version     -      X									
$\leftarrow$ $\rightarrow$ C $\leftrightarrows$ catalog.ngc.nvid	dia.com/orgs, nvidia 'teams/riva/resources, 'riva_quicksta	art <mark>'files?</mark> version=2.14.0		☆ ⊉   =	r 🛛 💽 i				
📀 NVIDIA. NGC   CATALOG									
CATALOG     Catalog     Al Foundation Models	Catalog > Resources > Riva Skills Quick Start Riva Skills Quick Start				Download ~				
Enterprise Catalog Collections		Overview Ver	sion History File Browser Release No	otes Related Collec	tions				
Containers Helm Charts		2.14.0	Filter files		×				
Models Resources	<b>NVIDIA</b> . RIVA	2.13.1	File	Size Modified	Actions				
A		2.13.0							
I PRIVATE REGISTRY ∨	Description	2.12.1	asr_Im_tools						
	Publisher NVIDIA Latest Version 2.14.0 Modified December 19, 2023	2.12.0	examples						
		2.11.0							
		2.10.0	pictos						
		2.9.0	Config.sh	19 kB 2 months ago					
		2.8.1	nemo2riva-2.14.0-py3-none-any.whl	33 kB 2 months ago					
		2.8.0							
	Compressed Size 147.85 KB	2.7.0	📄 riva_clean.sh 🗲 file name	3 kB 2 months ago					
	AL Automatic Strength Desperatition	2.6.0	🗈 riva_init.sh	9 kB 2 months ago					
	AI Automatic Speech Recognition	2.5.0	D. rive start ab	F kP 2 months ago					
	Natural Language Understanding Riva	2.4.0	nva_start.sn	SKB 2 Months ago					
	Text To Speech	2.3.0	riva_start_client.sh	3 kB 2 months ago					
		2.2.1	🗈 riva stop.sh	1 kB 2 months ago					
NGC Catalog v1.159.1		2.2.0			]				

3. Generate a Bearer token.

Note: The token is valid for 15 minutes. If the resource is not in a team context, / <team> is ommitted.

```
API_KEY=<API-key>
TOKEN=$(curl -s -u "\$oauthtoken":"$API_KEY" -H 'Accept:application/json'
    'https://authn.nvidia.com/token?service=ngc&scope=group/ngc:<org>&group/
ngc:<org>/<team>' | jq -r '.token')
```

- 4. Download the resource using curl.
  - a). Download the resource ZIP using curl.

Note: If the resource is not in a team context, team/<team>/ is omitted.

```
echo "Download Resource ZIP"
curl -LO 'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/resources/
<resource-name>/versions/<version>/zip' -H "Authorization: Bearer ${TOKEN}" -H
"Content-Type: application/json"
```

Example resource zip download:

```
echo "Download Resource ZIP"
curl -LO 'https://api.ngc.nvidia.com/v2/org/nvidia/team/riva/resources/
riva_quickstart/versions/2.9.0/zip' -H "Authorization: Bearer ${TOKEN}" -H
"Content-Type: application/json"
```

b). Download a resource file using curl.

Note: If the resource is not in a team context, team/<team>/ is omitted.

```
echo "Download Resource file"
curl -LO --request GET 'https://api.ngc.nvidia.com/v2/org/<org>/team/
<team>/reources/<resource-name>/versions/<version>/files/<file-name>' -H
"Authorization: Bearer ${TOKEN}" -H "Content-Type: application/json"
```

Example resource file download:

```
echo "Download Resource file"
curl -LO --request GET 'https://api.ngc.nvidia.com/v2/org/nvidia/team/
riva/resources/riva_quickstart/versions/2.9.0/files/riva_init.sh' -H
"Authorization: Bearer ${TOKEN}" -H "Content-Type: application/json"
```

- 5. Download the resource using wget.
  - a). Download the resource ZIP using wget.

Note: If the resource is not in a team context, team/<team>/ is omitted.

```
echo "Download Resource ZIP"
```

```
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/resources/<resource-
name>/versions/<version>/zip' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

#### Example resource zip download:

```
echo "Download Resource ZIP"
```

```
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/nvidia/team/riva/resources/riva_quickstart/
versions/2.9.0/zip' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

b). Download a resource file using wget

Note: If the resource is not in a team context, team/<team>/ is omitted.

```
echo "Download Resource file"
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/<org>/team/<team>/resources/<resource-
name>/versions/<version>/files/<file-name>' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

#### Example resource file download:

```
echo "Download Resource file"
wget --header="Authorization: Bearer $TOKEN" \
--header="Content-Type: application/json" \
'https://api.ngc.nvidia.com/v2/org/nvidia/team/riva/resources/riva_quickstart/
versions/2.9.0/files/riva_quickstart.sh' \
2>&1 \
| awk '/Location:/ {print $2}' \
| xargs wget --content-disposition
```

## 18.5. Downloading Resources via Web UI

- 1. From a browser, go to the <u>NGC Catalog</u> website.
- 2. Sign in. Refer to Registering and Activating Your NGC Account.

3. Click Resources from the left navigation menu.



You will see a page with available Resources.

4. Select one of the Resource cards.

The details page provides additional information for each Resource.



The Download menu on the upper right corner offers three different ways to download the Resource.

1	Download 🗸 🛛 Deploy to Vertex Al
÷	Browser (Direct Download)
ec	WGET
	CLI

Click either Browser (Direct Download) to start the download, or WGET or CLI to copy the download commands to the clipboard.

The File Browser tab lets you see the file content of the Resources.

Catalog > Resources > Object Detection using TAO Det Object Detection using TAO Det	ectNet_v2 etectNet_v2				Download 🗸 Deploy to Vertex Al
	Overview Version	History File Browse	Release Notes	Related Coll	ections More
VUDIA. TUTORIALS	> version1	Filter files			×
		FILE	2	SIZE MOD	NFIED
Description Detectnet_v2 is an object detection model.		D specs			
Object detection is a popular computer vi- sion technique that can detect one or mul- tiple objects in a frame.		TAO_detectnet_v2.ipyn	b View Notebook	4.99 MB a mo	onth ago ***
Publisher NVIDIA					
Use Case Other					
Framework Other					
Latest Version version1					
Modified May 24, 2022					
Compressed Size 5.01 MB					
1-Cilick Deploy     Google Cloud       Jupyter Notebook     One Click Deploy       Quick Deploy     Vertex Al					

## 18.6. Deploying Jupyter Notebooks to Google Cloud Vertex AI Workbench using Quick Deploy

NGC provides a Quick Deploy feature that allows you to deploy content to Google Cloud Vertex AI Workbench service directly from the NGC Catalog, making it easier to start building with NVIDIA AI. With just a click of a button, the NGC quick deploy feature takes care of end-to-end setup requirements such as fetching the Jupyter notebooks, configuring the GPU instance, installing dependencies, and running a JupyterLab interface to get started with the development quickly.

To use NGC's quick deploy feature, you'll need to be signed in to NGC. Refer to <u>Registering and Activating Your NGC Account</u> for instructions on registering for a free account and logging in.

1. Sign in to NGC with your user account at <a href="https://ngc.nvidia.com/signin">https://ngc.nvidia.com/signin</a>. The NGC Catalog appears with curated content. You may need to click Explore Catalog from the left navigation menu.



All Jupyter notebooks on NGC are hosted under the Resources tab on the left navigation menu.

2. Click Resources and then select a resource that has the Quick Deploy functionality enabled.



The following example shows the <u>TAO Image Classification Jupyter Notebook</u>. This page contains a wealth of information on the TAO Toolkit, the model architecture, and the procedure to run a sample Jupyter notebook.



3. Click Deploy from the upper right corner. A window with information about the resource, AI platform and an option for Deploy pops up.



4. Click Deploy at the pop-up to open the Google Cloud Vertex Al Workbench.

≡	Google Cloud	ngc-catalog 🔻	Q Search Products, resources, docs (/)
⇒	Vertex Al	<ul> <li>Deploy to managed notebook</li> </ul>	
:::	Dashboard Datasets Features	Notebook file: TAO Image Classification 22 To deploy this file, select an existing managed noted specifications or create a new one.	book with the required
۹	Labeling tasks	Create a new managed notebook	
	Workbench	To ensure that the chosen notebook file is deplo	yed smoothly, the
t)	Pipelines	below.	
(¢)	Training	custom docker image: nvcr.io/nvidia/tao/tao-too py3 GPU type: NVIDIA Tesla V100	OIKIT-TT:V3.21.11-TT1.15.4-
×	Experiments	GPU count: 1 Data disk size: 150	
	Models	National and a	
((@))	Endpoints	managed-notebook-1656452913	
Ō	Batch predictions	63-char limit with lowercase letters, digits, or '-' only. Must start with a '-'.	with a letter. Cannot end
	Metadata	Region us-central1 (lowa)	<b>~ 0</b>
ംറ്റം	Matching Engine	(	
		Permission JupyterLab access modes determine who can use a notebo credentials are used to call Google APIs. This cannot be cha created.	ook instance and which anged once the notebook is

The following information is pre-configured (but mutable):

- Name of the notebook
- Region
- Docker container environment
- Machine type, GPU type, Number of GPUs
- Disk type and Data size

You can keep the recommended configuration as is or change it as required.

5. Scroll down to Advanced Settings and select Install NVIDIA GPU Driver automatically for me.



6. Click Create at the bottom of the page.

	Vertex Al	<ul> <li>Deploy to managed notebook</li> </ul>					
!i!	Dashboard	Create and access additional custom Jupyter kernels by providing your own custom docker images. All available Jupyter kernels on the container will be imported.					
<b>=</b>	Datasets	Provide custom docker images					
۲	Features	Docker container image path 1 nvcr.io/nvidia/tao/tao-toolkit-tf:v3.21.11-tf1.15.4-py3 SELECT					
•	Labeling tasks	Enter your image path, or choose from Google Container / Artifact Registry.					
	Workbench	+ ADD ANOTHER DOCKER IMAGE					
£¢	Pipelines						
( <del>ç</del> i)	Training	Hardware configuration					
×	Experiments	Machine type *n1-standard-4 (4 vCPUs, 15 GB RAM) ~ 🗸 🚱					
ę	Models	GPU type Number of GPUs					
((@))	Endpoints	NVIDIA Tesla V100   I I					
	Patab aradiationa	Install NVIDIA GPU driver automatically for me					
ы	Batch predictions	C Data disk type C Data disk size in GB *					
	Metadata	Standard Persistent Disk 👻 🕐 150					
မိုင်စိ	Matching Engine	Delete to trash?					
		Disk encryption					
		Google-managed encryption key     No configuration required					
		Customer-managed encryption key (CMEK)     Manage via Google Cloud Key Management Service					
		Idle shutdown					
		✓ Enable Idle Shutdown 🚱					
		Time of inactivity before shutdown (Minutes) *					
		Range: 10 minutes to 1 day (1,440 minutes)					
		Networking					
		Learn more about the networking options below.					
		Google-managed networks No configuration required					
		Networks in this project					
		Private service access required					
		Private service access required					
		Security					
		✓ Enable nbconvert <b>?</b>					
		Enable file downloading from Notebook UI					
)\$	Marketplace	Enable terminal					
</th <th></th> <th>CREATE CANCEL</th>		CREATE CANCEL					
Juli	чy						

7. Creating the GPU compute instance and setting up the JupyterLab environment takes about a couple of minutes.

≡	Google Cloud	🐉 ngc-catalog 👻	Q Search Products, resources, docs (/)		~
	Vertex Al	← Deploy to managed notebook			
512	Dashboard	Create and access additional custom Jupyter kernels by docker images. All available Jupyter kernels on the cont	r providing your own custom ainer will be imported.		
::	Datasets	Provide custom docker images			
۲	Features	Docker container image path 1 nvcr.io/nvidia/tao/tao-toolkit-tf:v3.21.11-tf1.15.4-py3	SELECT		
•	Labeling tasks	Enter your image path, or choose from Google Container /	Artifact Registry.		
	Workbench	+ ADD ANOTHER DOCKER IMAGE			
tî.	Pipelines				
(¢)	Training	Hardware configuration	pring notabook with Jupytor ab		
x	Experiments	n1-standard-4 (4 vCPUs, 15 GB RAM)	aning notebook with SupyterLab		
Ŧ	Models	GPU type This m NVIDIA Tesla V100 V	ay take a few minutes I up notebook		
((ĝ))	Endpoints	CUDA 11.0 will be pre-installed in your environme			
Q	Batch predictions	Install NVIDIA GPU driver automatically f		CANCEL OPEN	
	Metadata	Standard Persistent Disk 👻 😧 150	0		
പ്പും	Matching Engine	Delete to trash?			
		Disk encryption			
		Google-managed encryption key No configuration required			
		Customer-managed encryption key (CMEK) Manage via Google Cloud Key Management Service			

8. Start up the interface by clicking Open.

=	Google Cloud	ngc-catalog 👻	Q Search Products, resources, docs (/)		~	2.	۰		: (к)
	Vertex Al	← Deploy to managed notebook							S LEARN
::: :::	Dashboard Datasets Features	Notebook file: <u>TAO Image Classification</u> 27 To deploy this file, select an existing manage specifications or create a new one.	jed notebook with the required						
Š	Labeling tasks	<ul> <li>Select an existing managed notebook</li> <li>Create a new managed notebook</li> </ul>							
8	Workbench	Region us-central1 (lowa) 👻 🕖							
tt	Pipelines	= Silter Custom desker images : sver int	uidia (tao (tao do likit di 🔿 Estar reporte name or value				~	6	m
( <del>ç</del> )	Training	Compatibilit			Owner	Last modified	^	•	
*	Experiments	PREFERREE	Ready to open notebook	ly to open notebook	Service account	Jun 28, 2022, 2:24:36	PM		
	Models		Your notebook is ready to use. Click open to go to JupyterLab.						
((g))	Endpoints	CONTINUE CANCEL							
â	Batch predictions		CLOSI	OPEN					
0	Metadata								
*	Matching Engine								
1	Marketplace								

9. Authenticate your managed notebook.



10.Confirm deployment to notebook server.



11.The instance loads up with the resources (Jupyter notebooks) pulled and an environment set up as a kernel in the JupyterLab, as shown below. If prompted to select a kernel for the notebook, select the custom kernel.

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12.Double click on the Jupyter Notebook file in the file browser on the left-hand side to open the Notebook.



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# 18.7. Viewing Jupyter Notebooks using the NGC Catalog Website

You can preview a Jupyter notebook contained within a Resource within the NGC Website.

- 1. Search for a Resource with the Jupyter Notebook label.
- 2. Go to the File Browser tab.
- 3. Expand the folders until you find the Jupyter Notebook (.ipynb file) you are looking for.
- 4. Now click on View Notebook.

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## Chapter 19. Helm Charts

Helm is an application package manager running on top of Kubernetes. This section describes how to use access Helm charts from the NGC Catalog.

#### Prerequisites

These instructions assume the following prerequisites are met.

Helm v 2.16.1 installed

The helm push plugin does not support Helm v3 yet - make sure you are using v2.16.x.

See <u>https://github.com/helm/helm/releases/tag/v2.16.1</u> for the Helm download and installation instructions.

NGC organization account

See <u>Setting Up and Activating Your NGC Account</u> for instructions.

## 19.1. Setting Up an NGC Helm Repository

1. Obtain an NGC API Key.

See Generating Your NGC API Key for instructions.

2. Export the API Key for use in commands.

\$ export NGC\_API\_KEY=<your-api-key>

3. Add the NGC org to your Helm repository.

\$ helm repo add <repo-name> https://helm.ngc.nvidia.com/<org-name> --username=\
\$oauthtoken --password=\$NGC\_API\_KEY

Where <*repo-name*> is a name of your choosing by which you will reference the repository.

# 19.2. Searching for Available Helm Charts in the NGC Catalog

To view a list of available Chart packages in your org, issue the following.

\$ helm search <repo-name>

#### Example

\$ helm search nvidian

## 19.3. Fetching Helm Charts

To download (or "fetch") a Helm chart package from the repo, issue the following. \$ helm fetch <repo-name>/<chart-name>

### 19.4. Using the NGC Website to View the List of Helm Charts and Get Fetch Commands

From the NGC website you can

- View the contents of the Helm chart repository.
- Get the push command for a specific Helm chart in the repository.
- 1. From a browser, log in to https://ngc.nvidia.com.
- 2. If you are a member of more than one org, select the one that contains the Helm charts that you are interested in, then click Sign In.
- 3. Click Helm Charts from the left-side navigation pane.





The page presents cards for each available Helm chart.

4. Select one of the Helm chart cards.

The page for each Helm chart provides information about the chart.



The Fetch Command section shows the command to use for downloading the Helm chart package.

Click either the Fetch download button from the upper right corner or the copy icon next to the fetch command to copy the fetch command to the clipboard.

The File Browser tab lets you see the file content of the Helm chart package.

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Helm Chart to deploy TAO Toolkit APIs	3.22.05-beta	templates		
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# Chapter 20. SDK and AI Toolkits

NVIDIA AI toolkits provide libraries and tools to train, fine-tune, optimize and deploy pretrained NGC models across a broad domain of industries and AI applications.

These include

- An <u>AI-assisted annotation tool</u> to help users label their datasets for training.
- A <u>transfer learning toolkit</u> to fine-tune pre-trained models with user data, saving the cost of training from scratch.
- Federated learning that preserves privacy by allowing users to collaborate and train Al models without sharing private data between clients.
- The <u>NeMo toolkit</u> to quickly build state-of-the-art models for speech recognition and natural language processing.
- The Service Maker toolkit that exposes trained models as a gRPC service that can be scaled and easily deployed on a Kubernetes service.
- Models built using the toolkits can be integrated inside client applications and deployed in production with the software development kits offered by NVIDIA. These SDKs leverage <u>TensorRT</u> and the <u>Triton Inference Server</u> as foundational building blocks.

NVIDIA provides AI toolkits and application frameworks targeted towards industries or specific use cases. These are listed in the table below.

Industry or AI Application	AI Toolkits
Healthcare and Life Sciences	NVIDIA Clara
Streaming video analytics	NVIDIA Metropolis
	NVIDIA DeepStream
Robotics	NVIDIA Isaac Sim
5G acceleration	NVIDIA Aerial
Recommender Systems	NVIDIA Merlin
Conversational AI	NVIDIA Riva

# Chapter 21. Deep Learning Frameworks

Deep learning frameworks offer building blocks for designing, training and validating deep neural networks, through a high level programming interface. Widely used deep learning frameworks such as MXNet, PyTorch, TensorFlow and others rely on GPU-accelerated libraries such as cuDNN, NCCL and DALI to deliver high-performance multi-GPU accelerated training.

Developers, researchers and data scientists can get easy access to NVIDIA optimized deep learning framework containers with deep learning examples, that are performance tuned and tested for NVIDIA GPUs. This eliminates the need to manage packages and dependencies or build deep learning frameworks from source

## 21.1. GPU Operator

The Operator Framework within Kubernetes takes operational business logic and allows the creation of an automated framework for the deployment of applications within Kubernetes using standard Kubernetes APIs and kubectl. The NVIDIA GPU Operator automates the management of all NVIDIA software components needed to provision GPUs within Kubernetes. NVIDIA, Red Hat, and others in the community have collaborated on creating the GPU Operator. The GPU Operator is an important component of the <u>NVIDIA EGX</u> software-defined platform that is designed to make large-scale hybrid-cloud and edge operations possible and efficient.





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