PaddlePaddle

Release Notes
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Chapter 1. PaddlePaddle Overview

The NVIDIA® Deep Learning SDK accelerates widely-used deep learning frameworks such as PaddlePaddle.

PaddlePaddle is the first independent R&D deep learning platform in China and has been officially open-sourced to professional communities since 2016. It is an industrial platform with advanced technologies and rich features that cover core deep learning frameworks, basic model libraries, end-to-end development kits, tools and components and service platforms. PaddlePaddle originated from industrial practices with a dedication and commitments to industrialization.

It has been widely adopted by a wide range of sectors including manufacturing, agriculture, enterprise service, and so on while serving more than 4 million developers, 157,000 companies and generating 476,000 models. With such advantages, PaddlePaddle has helped an increasing number of partners commercialize AI.

For more information about PaddlePaddle, including tutorials, documentation, and examples, see:

- PaddlePaddle tutorials
- PaddlePaddle API
- PaddlePaddle User Guide
Chapter 2. Pulling a Container

About this task

Before you can pull a container from the NGC container registry:

- Install Docker.
  - For NVIDIA DGX™ users, see Preparing to use NVIDIA Containers Getting Started Guide.
  - For non-DGX users, see NVIDIA® GPU Cloud™ (NGC) container registry installation documentation based on your platform.
- Ensure that you have access and can log in to the NGC container registry.
  Refer to NGC Getting Started Guide for more information.

The deep learning frameworks, the NGC Docker containers, and the deep learning framework containers are stored in the nvcr.io/nvidia repository.
Before you begin

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 Running A Container and specify the registry, repository, and tags.

About this task

On a system with GPU support for NGC containers, when you run a container, the following occurs:

‣ The Docker engine loads the image into a container that runs the software.
‣ You define the container’s runtime resources by including the additional flags and settings that are used with the command.

These flags and settings are described in Running A Container.
‣ The GPUs are explicitly defined for the Docker® container, which defaults to all GPUs, but can be specified by using the NVIDIA_VISIBLE_DEVICES environment variable.

For more information, refer to the nvidia-docker documentation.

Note: Starting in Docker 19.03, complete the steps below.

The method implemented in your system depends on the DGX OS version that you installed (for DGX systems), the NGC Cloud Image that was provided by a Cloud Service Provider, or the software that you installed to prepare to run NGC containers on TITAN PCs, Quadro PCs, or NVIDIA Virtual GPUs (vGPUs).

Procedure

1. Issue the command for the applicable release of the container that you want.

   The following command assumes that you want to pull the latest container.

   `docker pull nvcr.io/nvidia/paddlepaddle:24.01-py3`

2. Open a command prompt and paste the pull command.
Ensure that the pull process successfully completes before you proceed to step 3.

3. Run the container image.

- If you have **Docker 19.03 or later**, a typical command to launch the container is:
  
  ```bash
  docker run --gpus all -it --rm nvcr.io/nvidia/paddlepaddle:xx.xx-py3
  ```

- If you have **Docker 19.02 or earlier**, a typical command to launch the container is:
  
  ```bash
  nvidia-docker run -it --rm nvcr.io/nvidia/paddlepaddle:xx.xx-py3
  ```

To run PaddlePaddle, import it as a Python module:

```bash
$ python -c 'import paddle; paddle.utils.run_check()'
```

Running verify PaddlePaddle program ...

W0516 06:36:54.208734   442 device_context.cc:451] Please NOTE: device: 0, GPU
  Compute Capability: 8.0, Driver API Version: 11.7, Runtime API Version: 11.7
  PaddlePaddle works well on 1 GPU.
W0516 06:37:12.706600   442 fuse_all_reduce_op_pass.cc:76] Find all_reduce
  operators: 2. To make the speed faster, some all_reduce ops are fused during
  training, after fusion, the number of all_reduce ops is 2.
  PaddlePaddle works well on 8 GPUs.
PaddlePaddle is installed successfully! Let's start deep learning with
PaddlePaddle now.

To pull data and model descriptions from locations outside the container for use by
PaddlePaddle or save results to locations outside the container, mount one or more
host directories as Docker data volumes.

To share data between GPUs, NVIDIA Collective Communications Library (NCCL) might
require shared system memory for IPC and pinned (page-locked) system memory
resources, so the operating system's limits on these resources might need to be
increased. Refer to your system's documentation for more information.

In particular, Docker containers default to limited shared and pinned memory
resources. When using NCCL inside a container, we recommend that you increase
these resources by issuing:

```bash
--shm-size=1g --ulimit memlock=-1
```

in the command line to:

```bash
docker run --gpus all
```

Similarly, on some Redhat Enterprise Linux (RHEL) systems, Docker limits the number
of simultaneous PIDs in the container to 4096, which might be too small, particularly
for multi-GPU training tasks.

To increase this limit, pass the following option to docker run.

```bash
--pids-limit=819
```
Chapter 4. PaddlePaddle Release 24.06

The NVIDIA container image for PaddlePaddle, release 24.06, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.10
- NVIDIA CUDA 12.5.0.23
- NVIDIA cuBLAS 12.4.5.8
- cuTENSOR 2.0
- NVIDIA cuDNN 9.1.0.70
- NVIDIA NCCL 2.21.5
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2024.2.3.38
- Nsight Compute 2024.2.0.16
- NVIDIA HPC-X 2.19
- TensorRT 10.1.0.27 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.38
- nvImageCodec 0.2.0.7
Driver Requirements

Release 24.06 is based on **NVIDIA CUDA 12.5.0.23**, which requires **NVIDIA Driver** release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 470.57 (or later R470), 525.85 (or later R525), 535.86 (or later R535), or 545.23 (or later R545).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R450, R460, R510, and R520 drivers, which are not forward-compatible with CUDA 12.3. For a complete list of supported drivers, see the [CUDA Application Compatibility](#) topic. For more information, see **CUDA Compatibility and Upgrades**.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 24.06 is based on **v2.6.0**.

Announcements

‣ The [cuDNN frontend](#) has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

‣ The [NVIDIA/LDDL](#) has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the [BERT example](#) for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

‣ The [NVIDIA/Transformer Engine](#) is built on top of PaddlePaddle v2.5.2. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.

‣ The PaddlePaddle with CUDA Graph integration is re-designed. It eliminates CPU overhead if GPU kernels are small. For example:

```python
from paddle.device.cuda.cuda_graphed_layer import CUDAGraphedLayer
model = Model()
graphed_model = CUDAGraphedLayer(model)
```

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the [Frameworks Support Matrix](#).
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<thead>
<tr>
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<th>Ubuntu</th>
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<th>PaddlePaddle</th>
<th>TensorRT</th>
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Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

‣ ResNet50 v1.5 model: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper.

  The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

‣ BERT model: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper.

  This model script is available on GitHub.

Known Issues

‣ The JIT compilation is malfunctioning due to Thrust within CUDA 12.5. The error message is "multiple definition of `cub::CUB_200400___CUDA_ARCH_LIST___NS::Debug".
Chapter 5. PaddlePaddle Release 24.05

The NVIDIA container image for PaddlePaddle, release 24.05, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.10
- NVIDIA CUDA 12.4.1
- NVIDIA cuBLAS 12.4.5.8
- cuTENSOR 2.0
- NVIDIA cuDNN 9.1.0.70
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- rdma-core 39.0
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- GDRCopy 2.3
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- TensorRT 10.0.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.37.1
- nvImageCodec 0.2.0.7
Driver Requirements

Release 24.05 is based on NVIDIA CUDA 12.4.1, which requires NVIDIA Driver release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 470.57 (or later R470), 525.85 (or later R525), 535.86 (or later R535), or 545.23 (or later R545).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R450, R460, R510, and R520 drivers, which are not forward-compatible with CUDA 12.3. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 24.05 is based on v2.6.0.

Announcements

- The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

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  ```python
  from paddle.device.cuda.cudagraphed_layer import CUDAGraphedLayer
  model = Model()
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**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding
only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

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- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.

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Contents of the PaddlePaddle container

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The container includes the following:

- **Ubuntu 22.04** including **Python 3.10**
- **NVIDIA CUDA 12.4.1**
- **NVIDIA cuBLAS 12.4.5.68**
- **cuTENSOR 2.0**
- **NVIDIA cuDNN 9.1.0.70**
- **NVIDIA NCCL 2.21.5**
- **rdma-core 39.0**
- **OpenMPI 4.1.4+**
- **OpenUCX 1.15.0**
- **GDRCopy 2.3**
- **Nsight Systems 2024.2.1.106**
- **Nsight Compute 2024.1.1.4**
- **NVIDIA HPC-X 2.18**
- **TensorRT 8.6.3** for x64 Linux
- **Paddle-TRT 2.4**
- **SHARP 3.0.2**
- **DALI 1.36**
- **nvImageCodec 0.2.0.7**
Driver Requirements

Release 24.04 is based on NVIDIA CUDA 12.4.1, which requires NVIDIA Driver release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 470.57 (or later R470), 525.85 (or later R525), 535.86 (or later R535), or 545.23 (or later R545).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R450, R460, R510, and R520 drivers, which are not forward-compatible with CUDA 12.3. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 24.04 is based on v2.6.0.

Announcements

‣ The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

‣ The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

‣ The NVIDIA/Transformer Engine is built on top of PaddlePaddle v2.5.2. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.

‣ The PaddlePaddle with CUDA Graph integration is re-designed. It eliminates CPU overhead if GPU kernels are small. For example:

```python
from paddle.device.cuda.cudagraphed_layer import CUDAGraphedLayer
model = Model()
graphed_model = CUDAGraphedLayer(model)
```

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.
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**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding
only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

‣ **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the *Deep Residual Learning for Image Recognition* paper.

The v1.5 has \( \text{stride} = 2 \) in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

‣ **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the *BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding* paper.

This model script is available on GitHub.

Known Issues

‣ Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.
Chapter 7. PaddlePaddle Release 24.03

The NVIDIA container image for PaddlePaddle, release 24.03, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- **Ubuntu 22.04** including **Python 3.10**
- **NVIDIA CUDA 12.4.0.41**
- **NVIDIA cuBLAS 12.4.2.65**
- cuTENSOR 2.0
- **NVIDIA cuDNN 9.0.0.306**
- **NVIDIA NCCL 2.20**
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- **Nsight Systems 2024.2.1.38**
- **Nsight Compute 2024.1.0.13**
- NVIDIA HPC-X 2.18
- TensorRT 8.6.3 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.35
Driver Requirements

Release 24.03 is based on NVIDIA CUDA 12.4.0.41, which requires NVIDIA Driver release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 470.57 (or later R470), 525.85 (or later R525), 535.86 (or later R535), or 545.23 (or later R545).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R450, R460, R510, and R520 drivers, which are not forward-compatible with CUDA 12.3. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 24.03 is based on v2.6.0.

Announcements

- The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.
- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.
- The NVIDIA/Transformer Engine is built on top of PaddlePaddle v2.5.2. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.
- The PaddlePaddle with CUDA Graph integration is re-designed. It eliminates CPU overhead if GPU kernels are small. For example:
  ```python
  from paddle.device.cuda.cudagraphed_layer import CUDAGraphedLayer
  model = Model()
  graphed_model = CUDAGraphedLayer(model)
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NVIDIA PaddlePaddle Container Versions

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For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

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- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.

Known Issues

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.
Chapter 8. PaddlePaddle Release 24.01

The NVIDIA container image for PaddlePaddle, release 24.01, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.10
- NVIDIA CUDA 12.3.2
- NVIDIA cuBLAS 12.3.4.1
- cuTENSOR 2.0
- NVIDIA cuDNN 9.0.0.306
- NVIDIA NCCL 2.19.4
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2023.4.1.97
- Nsight Compute 2023.3.1.1
- NVIDIA HPC-X 2.16rc4
- TensorRT 8.6.3 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.34
Driver Requirements

Release 24.02 is based on CUDA 12.3.0, which requires NVIDIA Driver release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 470.57 (or later R470), 525.85 (or later R525), 535.86 (or later R535), or 545.23 (or later R545).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R450, R460, R510, and R520 drivers, which are not forward-compatible with CUDA 12.3. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 24.02 is based on v2.5.2.

Announcements

- The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on "fuse_resunit" and "fuse_dot_product_attention" flags in the "build_strategy". The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

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- The PaddlePaddle with CUDA Graph integration is re-designed. It eliminates CPU overhead if GPU kernels are small. For example:
  ```python
  from paddle.device.cuda.cudadrived_layer import CUDAGraphedLayer
  model = Model()
  graphed_model = CUDAGraphedLayer(model)
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NVIDIA PaddlePaddle Container Versions

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For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper. The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.

Known Issues

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.
Chapter 9. PaddlePaddle Release 24.01

The NVIDIA container image for PaddlePaddle, release 24.01, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.10
- NVIDIA CUDA 12.3.2
- NVIDIA cuBLAS 12.3.4.1
- cuTENSOR 2.0
- NVIDIA cuDNN 8.9.7.29
- NVIDIA NCCL 2.19.4
- rDMA-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2023.4.1.97
- Nsight Compute 2023.3.1.1
- NVIDIA HPC-X 2.16rc4
- TensorRT 8.6.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.33
Driver Requirements

Release 24.01 is based on CUDA 12.3.0, which requires NVIDIA Driver release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 470.57 (or later R470), 525.85 (or later R525), 535.86 (or later R535), or 545.23 (or later R545).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R450, R460, R510, and R520 drivers, which are not forward-compatible with CUDA 12.3. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 24.01 is based on v2.5.2.

Announcements

‣ The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

‣ The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

‣ The NVIDIA/Transformer Engine is built on top of PaddlePaddle v2.5.2. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.

‣ The PaddlePaddle with CUDA Graph integration is re-designed. It eliminates CPU overhead if GPU kernels are small. For example:

```python
from paddle.device.cuda.cuda_graphed_layer import CUDAGraphedLayer
model = Model()
graphed_model = CUDAGraphedLayer(model)
```

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.
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<th>Container Version</th>
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### Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs
can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper.
  The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.
- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper.
  This model script is available on GitHub.

Known Issues

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.

The NVIDIA container image for PaddlePaddle, release 23.12, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module. The container includes the following:

- **Ubuntu 22.04** including **Python 3.8**
- **NVIDIA CUDA 12.3.2**
- **NVIDIA cuBLAS 12.3.4.1**
- **cuTENSOR 1.7.0.1**
- **NVIDIA cuDNN 8.9.7.29**
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- **TensorRT 8.6.1.6** for x64 Linux
- **Paddle-TRT 2.4**
- **SHARP 3.0.2**
- **DALI 1.32**
Driver Requirements

Release 23.12 is based on **CUDA 12.3.0**, which requires **NVIDIA Driver** release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 525.85 (or later R525) 535.86 (or later R535), or 545.23 (or later R545).

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Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.12 is based on **v2.5.2**.

Announcements

- The **cuDNN frontend** has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

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NVIDIA PaddlePaddle Container Versions

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For more information about AMP, see the [Training With Mixed Precision Guide](#).
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The v1.5 has $\text{stride} = 2$ in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

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Known Issues

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.
Chapter 11. PaddlePaddle Release 23.11

The NVIDIA container image for PaddlePaddle, release 23.11, is available on NGC.

Contents of the PaddlePaddle container

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- NVIDIA HPC-X 2.16
- TensorRT 8.6.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.30.0
Driver Requirements

Release 23.11 is based on **CUDA 12.3.0**, which requires **NVIDIA Driver** release 545 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 525.85 (or later R525) 535.86 (or later R535), or 545.23 (or later R545).

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Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.11 is based on **v2.5.2**.

Announcements

- The **cuDNN frontend** has been integrated into PaddlePaddle. It can be activated by turning on "fuse_resunit" and "fuse_dot_product_attention" flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

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<td>NVIDIA CUDA 11.7.1</td>
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<td>TensorRT 8.2.5</td>
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<td>22.06</td>
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<td>NVIDIA CUDA 11.7.1</td>
<td>2.2.2</td>
<td>TensorRT 8.2.5</td>
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<td>22.05</td>
<td></td>
<td>NVIDIA CUDA 11.7.1</td>
<td>2.2.2</td>
<td>TensorRT 8.2.5</td>
</tr>
</tbody>
</table>

**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.
Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper. The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.

Known Issues

- The data loader has a small chance to trigger segmentation fault if the loop of loading data has a “break” statement. For instance, running N-th step, then using “break” to suspend the process. It only affects NLP tasks for now. The root cause is under investigation and will be fixed in a future release. See the issue#48964 for details.

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.
Chapter 12. PaddlePaddle Release 23.10

The NVIDIA container image for PaddlePaddle, release 23.10, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.8
- NVIDIA CUDA 12.2.2
- NVIDIA cuBLAS 12.2.5.6
- cuTENSOR 1.7.0.1
- NVIDIA cuDNN 8.9.5
- NVIDIA NCCL 2.19.3
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2023.3.1.92
- Nsight Compute 2023.2.1.3
- NVIDIA HPC-X 2.16
- TensorRT 8.6.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.30.0
Driver Requirements

Release 23.10 is based on CUDA 12.2.2, which requires NVIDIA Driver release 535 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 525.85 (or later R525), or 535.86 (or later R535).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.2. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.10 is based on v2.5.1.

Announcements

- The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

- The NVIDIA/Transformer Engine is built on top of PaddlePaddle v2.5.0. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
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<tr>
<td>23.10</td>
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<td>NVIDIA CUDA 12.2.2</td>
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<td>Container Version</td>
<td>Ubuntu</td>
<td>CUDA Toolkit</td>
<td>PaddlePaddle</td>
<td>TensorRT</td>
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<td>TensorRT 8.4.1</td>
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<td>TensorRT 8.2.5</td>
</tr>
<tr>
<td>22.05</td>
<td></td>
<td>NVIDIA CUDA 11.7</td>
<td></td>
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</tr>
</tbody>
</table>

**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the [Training With Mixed Precision Guide](#).
Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the *Deep Residual Learning for Image Recognition* paper. The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the *BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding* paper. This model script is available on GitHub.

Known Issues

- The data loader has a small chance to trigger segmentation fault if the loop of loading data has a “break” statement. For instance, running N-th step, then using “break” to suspend the process. It only affects NLP tasks for now. The root cause is under investigation and will be fixed in a future release. See the issue#48964 for details.

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.
Chapter 13. PaddlePaddle Release 23.09

The NVIDIA container image for PaddlePaddle, release 23.09, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in `/opt/paddlepaddle`. It is prebuilt and installed as a system Python module.

The container includes the following:

- **Ubuntu 22.04** including **Python 3.8**
- **NVIDIA CUDA 12.2.1**
- **NVIDIA cuBLAS 12.2.5.6**
- **cuTENSOR 1.7.0.1**
- **NVIDIA cuDNN 8.9.5**
- **NVIDIA NCCL 2.18.5**
- **rdma-core 39.0**
- **OpenMPI 4.1.4+**
- **OpenUCX 1.15.0**
- **GDRCopy 2.3**
- **Nsight Systems 2023.3.1.92**
- **Nsight Compute 2023.2.1.3**
- **NVIDIA HPC-X 2.16**
- **TensorRT 8.6.1.6** for x64 Linux
- **Paddle-TRT 2.4**
- **SHARP 3.0.2**
- **DALI 1.29.0**
Driver Requirements

Release 23.09 is based on **CUDA 12.2.1**, which requires **NVIDIA Driver** release 535 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 525.85 (or later R525), or 535.86 (or later R535).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.2. For a complete list of supported drivers, see the **CUDA Application Compatibility** topic. For more information, see **CUDA Compatibility and Upgrades**.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.09 is based on **v2.5.0**.

Announcements

- The **cuDNN frontend** has been integrated into PaddlePaddle. It can be activated by turning on "fuse_resunit" and "fuse_dot_product_attention" flags in the "build_strategy". The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

- The **NVIDIA/LDDL** has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

- The **NVIDIA/Transformer Engine** is built on top of PaddlePaddle v2.5.0. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
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<td>23.09</td>
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<td>NVIDIA CUDA 12.2.1</td>
<td>2.5.0</td>
<td>TensorRT 8.6.1.6</td>
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<tr>
<td>23.08</td>
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</tr>
</tbody>
</table>
Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.
Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the *Deep Residual Learning for Image Recognition* paper.
  
The v1.5 has \texttt{stride = 2} in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the *BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding* paper.
  
  This model script is available on GitHub.

**Known Issues**

- The data loader has a small chance to trigger segmentation fault if the loop of loading data has a “break” statement. For instance, running N-th step, then using “break” to suspend the process. It only affects NLP tasks for now. The root cause is under investigation and will be fixed in a future release. See the issue#48964 for details.

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.

- The parameter server might have a small chance to trigger segmentation fault.
Chapter 14. PaddlePaddle Release 23.08

The NVIDIA container image for PaddlePaddle, release 23.08, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.8
- NVIDIA CUDA 12.2.1
- NVIDIA cuBLAS 12.2.5
- cuTENSOR 1.7.0.1
- NVIDIA cuDNN 8.9.4
- NVIDIA NCCL 2.18.3
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2023.2.3.1001
- Nsight Compute 2023.2.1.3
- NVIDIA HPC-X 2.15
- TensorRT 8.6.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.28.0
Driver Requirements

Release 23.08 is based on CUDA 12.2.1, which requires NVIDIA Driver release 535 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 525.85 (or later R525), or 535.86 (or later R535). The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.2. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 23.08 is based on v2.5.0.

Announcements

‣ The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

‣ The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

‣ The NVIDIA/Transformer Engine is built on top of PaddlePaddle v2.5.0. The Transformer Engine has FP8 training to accelerate LLM models with Ada and Hopper GPU. The legacy version of PaddlePaddle is not supported.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
</thead>
<tbody>
<tr>
<td>23.08</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.2.1</td>
<td>2.5.0</td>
<td>TensorRT 8.6.1.6</td>
</tr>
</tbody>
</table>
**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the [Training With Mixed Precision Guide](#).

**Tensor Core Examples**

The [tensor core examples provided in GitHub](#) and [NGC](#) focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest [deep learning example](#) networks and [model scripts](#) for training.
Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the *Deep Residual Learning for Image Recognition* paper. The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the *BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding* paper. This model script is available on GitHub.

**Known Issues**

- The data loader has a small chance to trigger segmentation fault if the loop of loading data has a “break” statement. For instance, running N-th step, then using “break” to suspend the process. It only affects NLP tasks for now. The root cause is under investigation and will be fixed in a future release. See the issue#48964 for details.

- Some APIs are deprecated by PaddlePaddle 2.5. It affects the BERT example. It will be fixed in a future release.

- The parameter server might have a small chance to trigger segmentation fault.

- The output of *FuseGemmEpiloguePassRelu* is slightly different from the unfused kernel.
Chapter 15. PaddlePaddle Release 23.07

The NVIDIA container image for PaddlePaddle, release 23.07, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.8
- NVIDIA CUDA 12.1.1
- NVIDIA cuBLAS 12.1.3.1
- cuTENSOR 1.7.0.1
- NVIDIA cuDNN 8.9.3
- NVIDIA NCCL 2.18.3
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2023.2.3.1001
- Nsight Compute 2023.1.1.4
- NVIDIA HPC-X 2.15
- TensorRT 8.6.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.27.0
Driver Requirements

Release 23.07 is based on CUDA 12.1.1, which requires NVIDIA Driver release 530 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), 515.65 (or later R515), 525.85 (or later R525), or 530.30 (or later R530).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.1. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 23.07 is based on v2.4.1.

Announcements

‣ The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

‣ The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

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Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper.
The v1.5 has \texttt{stride = 2} in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT** model: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the *BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding* paper.

  This model script is available on GitHub.

**Known Issues**

None.
Chapter 16. PaddlePaddle Release 23.06

The NVIDIA container image for PaddlePaddle, release 23.06, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 22.04 including Python 3.8
- NVIDIA CUDA 12.1.1
- NVIDIA cuBLAS 12.1.3.1
- cuTENSOR 1.7
- NVIDIA cuDNN 8.9.2
- NVIDIA NCCL 2.18.1
- rdma-core 39.0
- OpenMPI 4.1.4+
- OpenUCX 1.15.0
- GDRCopy 2.3
- Nsight Systems 2023.2.3.1001
- Nsight Compute 2023.1.1.4
- NVIDIA HPC-X 2.15
- TensorRT 8.6.1.6 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.26.0
Driver Requirements

Release 23.06 is based on CUDA 12.1.1, which requires NVIDIA Driver release 530 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), 515.65 (or later R515), 525.85 (or later R525), or 530.30 (or later R530).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.1. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.06 is based on v2.4.1.

Announcements

- The cuDNN frontend has been integrated into PaddlePaddle. It can be activated by turning on “fuse_resunit” and “fuse_dot_product_attention” flags in the “build_strategy”. The cuDNN frontend provides advanced fusion kernels which accelerates training speed.

- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
</thead>
<tbody>
<tr>
<td>23.06</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.1.1</td>
<td>2.4.1</td>
<td>TensorRT 8.6.1.6</td>
</tr>
<tr>
<td>23.04</td>
<td>20.04</td>
<td>NVIDIA CUDA 12.1.0</td>
<td></td>
<td>TensorRT 8.6.1</td>
</tr>
<tr>
<td>23.03</td>
<td></td>
<td></td>
<td></td>
<td>TensorRT 8.5.3</td>
</tr>
</tbody>
</table>
Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper.
The v1.5 has \texttt{stride = 2} in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT** model: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the \textit{BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding} paper. This model script is available on GitHub.

**Known Issues**

- Grouped Conv2D lacks FP16/BF16 precision due to TensorRT on H100.
- Tensor parallelism and pipeline parallelism training might hang on multiple H100.
Chapter 17. PaddlePaddle Release 23.04

The NVIDIA container image for PaddlePaddle, release 23.04, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 12.1.0
- NVIDIA cuBLAS 12.1.3
- cuTENSOR 1.7
- NVIDIA cuDNN 8.9.0
- NVIDIA NCCL 2.17.1
- rdma-core 36.0
- OpenMPI 4.1.4+
- GDRCopy 2.3
- Nsight Systems 2023.1.1.127
- Nsight Compute 2023.1.0.15
- NVIDIA HPC-X 2.13
- TensorRT 8.5.3 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.24.0

Driver Requirements

Release 23.04 is based on CUDA 12.1.0, which requires NVIDIA Driver release 530 or later. However, if you are running on a data center GPU (for example, T4 or any other data
center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), 515.65 (or later R515), 525.85 (or later R525), or 530.30 (or later R530).

The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.1. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.04 is based on v2.4.1.

Announcements

- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
</thead>
<tbody>
<tr>
<td>23.04</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.1.0</td>
<td>2.4.1</td>
<td>TensorRT 8.6.1</td>
</tr>
<tr>
<td>23.03</td>
<td></td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.4</td>
<td>TensorRT 8.5.3</td>
</tr>
<tr>
<td>23.02</td>
<td></td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.3.2</td>
<td>TensorRT 8.5.2.2</td>
</tr>
<tr>
<td>23.01</td>
<td></td>
<td>NVIDIA CUDA 11.8.0</td>
<td>2.3.1</td>
<td>TensorRT 8.5.1</td>
</tr>
<tr>
<td>22.12</td>
<td></td>
<td>NVIDIA CUDA 11.7.1</td>
<td>2.3.1</td>
<td>TensorRT 8.5.1</td>
</tr>
<tr>
<td>22.11</td>
<td></td>
<td>NVIDIA CUDA 11.7.1</td>
<td>2.3.1</td>
<td>TensorRT 8.5.0.12</td>
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<tr>
<td>22.10</td>
<td></td>
<td>NVIDIA CUDA 11.7.1</td>
<td>2.3.1</td>
<td>TensorRT 8.5.1</td>
</tr>
<tr>
<td>22.09</td>
<td></td>
<td>NVIDIA CUDA 11.7.1</td>
<td>2.3.1</td>
<td>TensorRT 8.4.2.4</td>
</tr>
</tbody>
</table>
Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper. The v1.5 has $\text{stride} = 2$ in the $3 \times 3$ convolution instead of $1 \times 1$ convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.
Known Issues

- Grouped Conv2D lacks FP16/BF16 precision due to TensorRT.
- Sparse kernel, CSR to COO format conversion has functional regression on P100.
- The Conv2D fusion kernel, `convBiasAct`, has functional regression due to cuDNN on P100.
- RNN of Paddle-TRT has functional regression due to TensorRT.
- Asynchronous tensor copy might malfunction in inference on P100.
- The communication kernels (i.e., NCCL) might be unstable on H100. It might take a longer time than the previous version, or hang.
Chapter 18. PaddlePaddle Release 23.03

The NVIDIA container image for PaddlePaddle, release 23.03, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- **Ubuntu 20.04** including **Python 3.8**
- **NVIDIA CUDA 12.1.0**
- **NVIDIA cuBLAS from CUDA 12.1.0**
- **cuTENSOR 1.6.2.3**
- **NVIDIA cuDNN 8.8.1.3**
- **NVIDIA NCCL 2.17.1**
- **rdma-core 36.0**
- **OpenMPI 4.1.4+**
- **GDRCopy 2.3**
- **Nsight Systems 2023.1.127**
- **Nsight Compute 2023.1.0.15**
- **NVIDIA HPC-X 2.13**
- **TensorRT 8.5.3** for x64 Linux
- **Paddle-TRT 2.4**
- **SHARP 3.0.2**
- **DALI 1.23.0**

Driver Requirements

Release 23.03 is based on **CUDA 12.1.0**, which requires **NVIDIA Driver** release 530 or later. However, if you are running on a data center GPU (for example, T4 or any other data
center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), 515.65 (or later R515), 525.85 (or later R525), or 530.30 (or later R530).

The CUDA driver's compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.1. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.03 is based on v2.4.1.

Announcements

- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
</thead>
<tbody>
<tr>
<td>23.03</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.1.0</td>
<td>2.4.1</td>
<td>TensorRT 8.5.3</td>
</tr>
<tr>
<td>23.02</td>
<td></td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.4</td>
<td>TensorRT 8.5.2.2</td>
</tr>
<tr>
<td>23.01</td>
<td></td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.3.2</td>
<td>TensorRT 8.5.1</td>
</tr>
<tr>
<td>22.12</td>
<td></td>
<td>NVIDIA CUDA 11.8.0</td>
<td>2.3.1</td>
<td>TensorRT 8.5.0.12</td>
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<td>22.11</td>
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<tr>
<td>22.08</td>
<td></td>
<td>NVIDIA CUDA 11.7.1</td>
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<td>TensorRT 8.4.2.4</td>
</tr>
</tbody>
</table>
Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the [Training With Mixed Precision Guide](#).

Tensor Core Examples

The [tensor core examples provided in GitHub](#) and [NGC](#) focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and [model scripts](#) for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the [Deep Residual Learning for Image Recognition](#) paper.
  
The v1.5 has \texttt{stride = 2} in the 3x3 convolution instead of 1x1 convolution. This model script is available on [GitHub](#).

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the [BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding](#) paper.
  
  This model script is available on [GitHub](#).
Known Issues

- None.
Chapter 19. PaddlePaddle Release 23.02

The NVIDIA container image for PaddlePaddle, release 23.02, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 12.0.1
- cuTENSOR 1.6.2.3
- NVIDIA cuDNN 8.7.0
- NVIDIA NCCL 2.16.5
- rdma-core 36.0
- OpenMPI 4.1.4+
- GDRCopy 2.3
- Nsight Systems 2022.5.1
- Nsight Compute 2022.4.1.6
- NVIDIA HPC-X 2.13
- TensorRT 8.5.3 for x64 Linux
- Paddle-TRT 2.4
- SHARP 3.0.2
- DALI 1.22.0

Driver Requirements

Release 23.02 is based on CUDA 12.0.1, which requires NVIDIA Driver release 525 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), 515.65 (or later R515), or 525.85 (or later R525).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, R460, and R520 drivers, which are not forward-compatible with CUDA 12.0. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

**Key Features and Enhancements**

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.02 is based on v2.4.

**Announcements**

- The NVIDIA/LDDL has been integrated in PaddlePaddle. The Language Datasets and Data Loaders (LDDL) is a utility library that minimizes the friction during dataset retrieval, preprocessing and loading for the language models. It successfully accelerates BERT pre-training phase 2 to 2X. See the BERT example for details. The training results with multinode are added in the BERT example, including 1 node to 32 nodes.

**NVIDIA PaddlePaddle Container Versions**

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
</thead>
<tbody>
<tr>
<td>23.02</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.4</td>
<td>TensorRT 8.5.3</td>
</tr>
<tr>
<td>23.01</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.3.2</td>
<td>TensorRT 8.5.2.2</td>
</tr>
<tr>
<td>22.12</td>
<td>22.11</td>
<td>NVIDIA CUDA 11.8.0</td>
<td>TensorRT 8.5.1</td>
<td></td>
</tr>
<tr>
<td>22.10</td>
<td>22.09</td>
<td>NVIDIA CUDA 11.7.1</td>
<td>TensorRT 8.5.0.12</td>
<td></td>
</tr>
<tr>
<td>22.08</td>
<td>22.08</td>
<td>NVIDIA CUDA 11.7.1</td>
<td>2.3.1</td>
<td>TensorRT 8.4.2.4</td>
</tr>
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<td>22.07</td>
<td>22.07</td>
<td>NVIDIA CUDA 11.7 Update 1 Preview</td>
<td>2.3.0</td>
<td>TensorRT 8.4.1</td>
</tr>
<tr>
<td>22.06</td>
<td>22.06</td>
<td>NVIDIA CUDA 11.7</td>
<td>2.2.2</td>
<td>TensorRT 8.2.5</td>
</tr>
<tr>
<td>22.05</td>
<td>22.05</td>
<td>NVIDIA CUDA 11.7</td>
<td></td>
<td></td>
</tr>
</tbody>
</table>
Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper. The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.

Known Issues

- None.
Chapter 20. PaddlePaddle Release 23.01

The NVIDIA container image for PaddlePaddle, release 23.01, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 12.0.1
- cuTENSOR 1.6.2.3
- NVIDIA cuDNN 8.7.0
- NVIDIA NCCL 2.16.5
- rdma-core 36.0
- OpenMPI 4.1.4+
- GDRCopy 2.3
- Nsight Systems 2022.5.1
- Nsight Compute 2022.4.1.6
- NVIDIA HPC-X 2.13
- TensorRT 8.5.2.2 for x64 Linux
- Paddle-TRT 2.3.2
- SHARP 3.0.2
- DALI 1.21.0

Driver Requirements

Release 23.01 is based on CUDA 12.0.1, which requires NVIDIA Driver release 525 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), 515.65 (or later R515), or 525.85 (or later R525).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 12.0. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

**Key Features and Enhancements**

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 23.01 is based on v2.3.2.

**Announcements**

- Paddle-TRT is now included.
  
  Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddllePaddle in a few lines in the Python and C++ APIs.

**NVIDIA PaddlePaddle Container Versions**

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

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<th>Container Version</th>
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<th>PaddlePaddle</th>
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</tr>
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<tbody>
<tr>
<td>23.01</td>
<td>22.04</td>
<td>NVIDIA CUDA 12.0.1</td>
<td>2.3.2</td>
<td>TensorRT 8.5.2.2</td>
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<td>22.12</td>
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<td>NVIDIA CUDA 11.8.0</td>
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**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set
of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper. The v1.5 has stride = 2 in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

- **BERT model**: This model is a new method of pre-training language representations that obtains state-of-the-art results on a wide array of Natural Language Processing (NLP) tasks that was introduced in the BERT: Pre-training of Deep Bidirectional Transformers for Language Understanding paper. This model script is available on GitHub.

Known Issues

- In rare cases, using the adam optimizer with multi-threading might cause segmentation fault. Setting the environment variable `FLAGS_inner_op_parallelism` to 1 can disable the multi-threading feature and resolve this issue.

The NVIDIA container image for PaddlePaddle, release 22.12, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 11.8.0
- cuTENSOR 1.6.1.5
- NVIDIA cuDNN 8.7.0
- NVIDIA NCCL 2.15.5 (optimized for NVLink™)
- rdma-core 36.0
- OpenMPI 4.1.4+
- GDRCopy 2.3
- Nsight Systems 2022.4.2.1
- Nsight Compute 2022.3.0.22
- NVIDIA HPC-X 2.13
- TensorRT 8.5.1 for x64 Linux
- Paddle-TRT 2.3.2
- SHARP 3.0.2
- DALI 1.20.0

Driver Requirements

Release 22.12 is based on CUDA 11.8.0, which requires NVIDIA Driver release 520 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 515.65 (or later R515).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 11.8. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 22.12 is based on v2.3.2.

Announcements

‣ Paddle-TRT is now included.

Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

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Tensor Core Examples

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Known Issues

‣ In rare cases, using the adam optimizer with multi-threading might cause segmentation fault. Setting the environment variable FLAG_inner_op_parallelism to 1 can disable the multi-threading feature and resolve this issue.

‣ On H100 NVLink systems using 2 GPUs for training, certain communication patterns can trigger a corner-case bug that manifests either as a hang or as an "illegal instruction" exception. A workaround for this case is to set the environment variable NCCL_PROTO=^LL128. This issue will be addressed in an upcoming release.
Chapter 22. PaddlePaddle Release 22.11

The NVIDIA container image for PaddlePaddle, release 22.11, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 11.8.0
- cuTENSOR 1.6.1.5
- NVIDIA cuDNN 8.7.0
- NVIDIA NCCL 2.15.5 (optimized for NVLink™)
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- Nsight Compute 2022.3.0.22
- NVIDIA HPC-X 2.12.2tp1
- TensorRT 8.5.1 for x64 Linux
- Paddle-TRT 2.3.2
- SHARP 3.0.2
- DALI 1.18.0

Driver Requirements

Release 22.11 is based on CUDA 11.8.0, which requires NVIDIA Driver release 520 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 515.65 (or later R515).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 11.8. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements
This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 22.11 is based on v2.3.2.

Announcements
‣ Paddle-TRT is now included.

Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

NVIDIA PaddlePaddle Container Versions
The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

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Known Issues

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- On H100 NVLink systems using 2 GPUs for training, certain communication patterns can trigger a corner-case bug that manifests either as a hang or as an "illegal instruction" exception. A workaround for this case is to set the environment variable `NCCL_PROTO=^LL128`. This issue will be addressed in an upcoming release.
Chapter 23. PaddlePaddle Release 22.10

The NVIDIA container image for PaddlePaddle, release 22.10, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 11.8.0
- cuTENSOR 1.6.1.5
- NVIDIA cuDNN 8.6.0.163
- NVIDIA NCCL 2.15.5 (optimized for NVLink™)
- rdma-core 36.0
- OpenMPI 4.1.4+
- GDRCopy 2.3
- Nsight Systems 2022.4.2.1
- Nsight Compute 2022.3.0.22
- NVIDIA HPC-X 2.12.2tp1
- TensorRT 8.5.0.12 for x64 Linux
- Paddle-TRT 2.3.2
- SHARP 3.0.2
- DALI 1.18.0

Driver Requirements

Release 22.10 is based on CUDA 11.8.0, which requires NVIDIA Driver release 520 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 515.65 (or later R515).
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### Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 22.10 is based on v2.3.2.

### Announcements

- Paddle-TRT is now included.
  
Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

### NVIDIA PaddlePaddle Container Versions

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### Automatic Mixed Precision (AMP)

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Tensor Core Examples

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Known Issues

- In rare cases, using the adam optimizer with multi-threading might cause segmentation fault. Setting the environment variable `FLAGS_inner_op_parallelism` to 1 can disable the multi-threading feature and resolve this issue.
- On H100 NVLink systems using 2 GPUs for training, certain communication patterns can trigger a corner-case bug that manifests either as a hang or as an "illegal instruction" exception. A workaround for this case is to set the environment variable `NCCL_PROTO=^LL128`. This issue will be addressed in an upcoming release.
- The `phi::funcs::ReduceAnyKernel` function has a data-racing issue. It will be fixed in an upcoming release.
Chapter 24. PaddlePaddle Release 22.09

The NVIDIA container image for PaddlePaddle, release 22.09, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

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- SHARP 2.6.0
- DALI 1.17.0

Driver Requirements

Release 22.09 is based on CUDA 11.8.0, which requires NVIDIA Driver release 520 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), 510.47 (or later R510), or 515.65 (or later R515).
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Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

‣ The PaddlePaddle container image version 22.09 is based on v2.3.2.

Announcements

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NVIDIA PaddlePaddle Container Versions

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For more information about AMP, see the Training With Mixed Precision Guide.

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- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper. The v1.5 has \( \text{stride} = 2 \) in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

Known Issues

- In rare cases, using the adam optimizer with multi-threading might cause segmentation fault. Setting the environment variable `FLAGS_inner_op_parallelism` to 1 can disable the multi-threading feature and resolve this issue.
- On H100 NVLink systems using 2 GPUs for training, certain communication patterns can trigger a corner-case bug that manifests either as a hang or as an "illegal instruction" exception. A workaround for this case is to set the environment variable `NCCL_PROTO=^LL128`. This issue will be addressed in an upcoming release.
Chapter 25. PaddlePaddle Release 22.08

The NVIDIA container image for PaddlePaddle, release 22.08, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 11.7.1 with NVIDIA cuBLAS 11.10.3.66
- cuTENSOR 1.6.0.2
- NVIDIA cuDNN 8.5.0.96
- NVIDIA NCCL 2.12.12 (optimized for NVLink™)
- rdma-core 36.0
- OpenMPI 4.1.2rc4+
- GDRCopy 2.3
- Nsight Systems 2022.1.3.18
- Nsight Compute 2022.2.1.0
- NVIDIA HPC-X 2.10 with OpenUCX 1.12.0
- TensorRT 8.4.2.4 for x64 Linux
- Paddle-TRT 2.3.1
- SHARP 2.6.0
- DALI 1.16.0

Driver Requirements

Release 22.08 is based on CUDA 11.7.1, which requires NVIDIA Driver release 515 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), or 510.47 (or later R510).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 11.7. For a complete list of supported drivers, see the CUDA Applications Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

**Key Features and Enhancements**

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 22.08 is based on v2.3.1.

**Announcements**

- Paddle-TRT is now included.

  Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

**NVIDIA PaddlePaddle Container Versions**

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
<th>Container Version</th>
<th>Ubuntu</th>
<th>CUDA Toolkit</th>
<th>PaddlePaddle</th>
<th>TensorRT</th>
</tr>
</thead>
<tbody>
<tr>
<td>22.08</td>
<td>22.04</td>
<td><strong>NVIDIA CUDA 11.7.1</strong></td>
<td>2.3.1</td>
<td><strong>TensorRT 8.4.2.4</strong></td>
</tr>
<tr>
<td>22.07</td>
<td></td>
<td><strong>NVIDIA CUDA 11.7 Update 1 Preview</strong></td>
<td>2.3.0</td>
<td><strong>TensorRT 8.4.1</strong></td>
</tr>
<tr>
<td>22.06</td>
<td></td>
<td></td>
<td>2.2.2</td>
<td><strong>TensorRT 8.2.5</strong></td>
</tr>
<tr>
<td>22.05</td>
<td></td>
<td><strong>NVIDIA CUDA 11.7</strong></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.
Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper.
  
  The v1.5 has \( \text{stride} = 2 \) in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

Known Issues

None.
Chapter 26. PaddlePaddle Release 22.07

The NVIDIA container image for PaddlePaddle, release 22.07, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 11.7 Update 1 Preview with NVIDIA cuBLAS 11.10.1.25
- cuTENSOR 1.5.0.3
- NVIDIA cuDNN 8.4.1
- NVIDIA NCCL 2.12.12 (optimized for NVLink™)
- rdma-core 36.0
- OpenMPI 4.1.2rc4+
- GDRCopy 2.3
- Nsight Systems 2022.1.3.3
- Nsight Compute 2022.2.1.0
- NVIDIA HPC-X 2.10 with OpenUCX 1.12.0
- TensorRT 8.4.1 for x64 Linux
- Paddle-TRT 2.3.0
- SHARP 2.6.0
- DALI 1.15.0

Driver Requirements

Release 22.07 is based on CUDA 11.7 Update 1 Preview, which requires NVIDIA Driver release 515 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), or 510.47 (or later R510).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 11.7. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 22.07 is based on v2.3.0.

Announcements

- Paddle-TRT is now included.
  
Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
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<td>2.3.0</td>
<td>TensorRT 8.4.1</td>
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<tr>
<td>22.06</td>
<td>22.04</td>
<td>NVIDIA CUDA 11.7 Update 1 Preview</td>
<td>2.2.2</td>
<td>TensorRT 8.2.5</td>
</tr>
<tr>
<td>22.05</td>
<td>22.04</td>
<td>NVIDIA CUDA 11.7</td>
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<td></td>
</tr>
</tbody>
</table>

Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.
Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the *Deep Residual Learning for Image Recognition* paper.

  The v1.5 has \( \text{stride} = 2 \) in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

Known Issues

None.
Chapter 27. PaddlePaddle Release 22.06

The NVIDIA container image for PaddlePaddle, release 22.06, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- **Ubuntu 20.04** including **Python 3.8**
- **NVIDIA CUDA 11.7 Update 1 Preview** with **NVIDIA cuBLAS 11.10.1.25**
- cuTENSOR 1.5.0.3
- **NVIDIA cuDNN 8.4.1**
- **NVIDIA NCCL 2.12.12** (optimized for NVLink™)
- rdma-core 36.0
- OpenMPI 4.1.2rc4+
- GDRCopy 2.3
- Nsight Systems 2022.1.3.3
- Nsight Compute 2022.2.0.0
- NVIDIA HPC-X 2.10 with OpenUCX 1.12.0
- TensorRT 8.2.5 for x64 Linux
- PaddlePaddle-TRT 2.2.2
- SHARP 2.6.0
- **DALI 1.14.0**

Driver Requirements

Release 22.06 is based on **CUDA 11.7 Update 1 Preview**, which requires **NVIDIA Driver** release 515 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), or 510.47 (or later R510).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 11.7. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

**Key Features and Enhancements**

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 22.06 is based on v2.2.2.

**Announcements**

- The Paddle-TRT is now included.

  Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

**NVIDIA PaddlePaddle Container Versions**

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

<table>
<thead>
<tr>
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<tr>
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<td>2.2.2</td>
<td>TensorRT 8.2.5</td>
</tr>
<tr>
<td>22.05</td>
<td></td>
<td>NVIDIA CUDA 11.7</td>
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**Automatic Mixed Precision (AMP)**

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.
Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.

Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the Deep Residual Learning for Image Recognition paper.

  The v1.5 has \( \text{stride} = 2 \) in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

Known Issues

None.
Chapter 28. PaddlePaddle Release 22.05

The NVIDIA container image for PaddlePaddle, release 22.05, is available on NGC.

Contents of the PaddlePaddle container

This container image includes the complete source of the NVIDIA version of PaddlePaddle in /opt/paddlepaddle. It is prebuilt and installed as a system Python module.

The container includes the following:

- Ubuntu 20.04 including Python 3.8
- NVIDIA CUDA 11.7 with NVIDIA cuBLAS 11.10.1.25
- cuTensor 1.5.0.3
- NVIDIA cuDNN 8.4.0.27
- NVIDIA NCCL 2.12.10 (optimized for NVLink™)
- rdma-core 36.0
- OpenMPI 4.1.2rc4+
- GDRCopy 2.3
- Nsight Systems 2022.1.3.3
- Nsight Compute 2022.2.0.0
- NVIDIA HPC-X 2.10 with OpenUCX 1.12.0
- TensorRT 8.2.5.1 for x64 Linux
- PaddlePaddle-TRT 2.2.2
- SHARP 2.6.0
- DALI 1.13.0

Driver Requirements

Release 22.05 is based on CUDA 11.7, which requires NVIDIA Driver release 515 or later. However, if you are running on a data center GPU (for example, T4 or any other data center GPU), you can use NVIDIA driver release 450.51 (or later R450), 470.57 (or later R470), or 510.47 (or later R510).
The CUDA driver’s compatibility package only supports particular drivers. Thus, users should upgrade from all R418, R440, and R460 drivers, which are not forward-compatible with CUDA 11.7. For a complete list of supported drivers, see the CUDA Application Compatibility topic. For more information, see CUDA Compatibility and Upgrades.

Key Features and Enhancements

This PaddlePaddle release includes the following key features and enhancements.

- The PaddlePaddle container image version 22.05 is based on v2.2.2.

Announcements

- The Paddle-TRT is now included.
  Paddle-TRT is the TensorRT integration for PaddlePaddle and brings the capabilities of TensorRT to PaddlePaddle in a few lines in the Python and C++ APIs.

NVIDIA PaddlePaddle Container Versions

The following table shows what versions of Ubuntu, CUDA, PaddlePaddle, and TensorRT are supported in each of the NVIDIA containers for PaddlePaddle. For older container versions, refer to the Frameworks Support Matrix.

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Automatic Mixed Precision (AMP)

Automatic Mixed Precision (AMP) for PaddlePaddle is available in this container through the native implementation. AMP enables users to try mixed precision training by adding only 3 lines of Python to an existing FP32 (default) script. AMP will select an optimal set of operations to cast to FP16. FP16 operations require 2X reduced memory bandwidth (resulting in a 2X speedup for bandwidth-bound operations like most pointwise ops) and 2X reduced memory storage for intermediates (reducing the overall memory consumption of your model). Additionally, GEMMs and convolutions with FP16 inputs can run on Tensor Cores, which provide an 8X increase in computational throughput over FP32 arithmetic.

For more information about AMP, see the Training With Mixed Precision Guide.

Tensor Core Examples

The tensor core examples provided in GitHub and NGC focus on achieving the best performance and convergence from NVIDIA Volta™ tensor cores by using the latest deep learning example networks and model scripts for training.
Each example model trains with mixed precision Tensor Cores on Volta and NVIDIA Turing™, so you can get results much faster than training without Tensor Cores. This model is tested against each NGC monthly container release to ensure consistent accuracy and performance over time.

- **ResNet50 v1.5 model**: This model is a modified version of the regular ResNet model that was introduced in the *Deep Residual Learning for Image Recognition* paper.

  The v1.5 has $\text{stride} = 2$ in the 3x3 convolution instead of 1x1 convolution. This model script is available on GitHub.

**Known Issues**

None.
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