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# Chapter 1. CUDNN OVERVIEW

NVIDIA cuDNN is a GPU-accelerated library of primitives for deep neural networks. It provides highly tuned implementations of routines arising frequently in DNN applications:

- Convolution forward and backward, including cross-correlation
- Pooling forward and backward
- Softmax forward and backward
- Neuron activations forward and backward:
  - Rectified linear (ReLU)
  - Sigmoid
  - Hyperbolic tangent (TANH)
- Tensor transformation functions
- ▶ LRN, LCN and batch normalization forward and backward

cuDNN's convolution routines aim for performance competitive with the fastest GEMM (matrix multiply) based implementations of such routines while using significantly less memory.

cuDNN features customizable data layouts, supporting flexible dimension ordering, striding, and subregions for the 4D tensors used as inputs and outputs to all of its routines. This flexibility allows easy integration into any neural network implementation and avoids the input/output transposition steps sometimes necessary with GEMM-based convolutions.

cuDNN offers a context-based API that allows for easy multi-threading and (optional) interoperability with CUDA streams.

# Chapter 2. CUDNN RELEASE NOTES V7.0.4

# **Key Features and Enhancements**

Performance improvements for grouped convolutions when input channels and output channels per group are 1, 2, or 4 for the following algorithms:

- CUDNN CONVOLUTION FWD ALGO IMPLICIT GEMM
- ► CUDNN CONVOLUTION BWD DATA ALGO0
- ▶ CUDNN CONVOLUTION BWD DATA ALGO 1
- CUDNN CONVOLUTION BWD FILTER ALGO 0
- CUDNN\_CONVOLUTION\_BWD\_FILTER\_ALGO\_1

#### **Known Issues**

Following are known issues in this release:

- ► The CUDA 8.0 build of cuDNN may produce incorrect computations when run on Volta.
- cuDNN library triggers CPU floating point exception when FP exceptions are enabled by user. This issue exists for all 7.0.x releases.
- There are heavy use cases of RNN layers that might hit a memory allocation issue in the CUDA driver when using cuDNN v7 with CUDA 8.0 and R375 driver on pre-Pascal architectures (Kepler and Maxwell). In these cases, subsequent CUDA kernels may fail to launch with an Error Code 30. To resolve the issue, it is recommended to use the latest R384 driver (from NVIDIA driver downloads) or to ensure that the persistence daemon is started. This behavior is observed on all 7.0.x releases.
- When using TENSOR\_OP\_MATH mode with cudnnConvolutionBiasActivationForward, the pointer to the bias must be aligned to 16 bytes and the size of allocated memory must be multiples of 256 elements. This behavior exists for all 7.0.x releases.

#### **Fixed Issues**

The following issues have been fixed in this release:

- ► Fixed out-of-band global memory accesses in the 256-point 1D FFT kernel. The problem affected convolutions with 1x1 filters and tall but narrow images, e.g., 1x500 (WxH). In those cases, the workspace size for the FFT\_TILING algo was computed incorrectly. There was no error in the FFT kernel.
- ► Eliminated a source of floating point exceptions in the CUDNN\_CONVOLUTION\_FWD\_ALGO\_WINOGRAD\_NONFUSED algorithm. The host code to generate a negative infinity floating point value was substituted with a different logic. By default, FP exceptions are disabled. However, a user program enabled them by invoking feenableexcept(). There are at least two other sources of FP exceptions in the cuDNN library, affecting for example BATCHNORM\_SPATIAL\_PERSISTENT. Those sources of FP exceptions will be eliminated in future releases of the cuDNN library.

# Chapter 3. CUDNN RELEASE NOTES V7.0.3

# **Key Features and Enhancements**

Performance improvements for various cases:

- Forward Grouped Convolutions where input channel per groups is 1, 2 or 4 and hardware is Volta or Pascal.
- **cudnnTransformTensor()** where input and output tensor is packed.



This is an improved fallback, improvements will not be seen in all cases.

### **Known Issues**

The following are known issues in this release:

► CUDNN\_CONVOLUTION\_FWD\_ALGO\_FFT\_TILING may cause

CUDA\_ERROR\_ILLEGAL\_ADDRESS. This issue affects input images of just one 1 pixel in width and certain n, c, k, h combinations.

### **Fixed Issues**

The following issues have been fixed in this release:

- ▶ AddTensor and TensorOp produce incorrect results for half and INT8 inputs for various use cases.
- cudnnPoolingBackward() can produce incorrect values for rare cases of non-deterministic MAX pooling with window\_width > 256. These rare cases are when the maximum element in a window is duplicated horizontally (along width) by a stride of 256\*k for some k. The behavior is now fixed to accumulate derivatives for the duplicate that is left-most.
- cudnnGetConvolutionForwardWorkspaceSize() produces incorrect workspace size for algorithm FFT\_TILING for 1d convolutions. This only occurs for large sized

- convolutions where intermediate calculations produce values greater than  $2^31$  (2 to the power of 31).
- ► CUDNN\_STATUS\_NOT\_SUPPORTED returned by cudnnPooling\*() functions for small x image (channels \* height \* width < 4).

# Chapter 4. CUDNN RELEASE NOTES V7.0.2

# **Key Features and Enhancements**

This is a patch release of cuDNN 7.0 and includes bug fixes and performance improvements mainly on Volta.

# Algo 1 Convolutions Performance Improvements

Performance improvements were made to CUDNN\_CONVOLUTION\_FWD\_ALGO\_IMPLICIT\_PRECOMP\_GEMM, CUDNN\_CONVOLUTION\_BWD\_FILTER\_ALGO\_1, and CUDNN\_CONVOLUTION\_BWD\_DATA\_ALGO\_1. These improvements consist of new SASS kernels and improved heuristics. The new kernels implement convolutions over various data sizes and tile sizes. The improved heuristics take advantage of these new kernels.

#### **Known Issues**

The following are known issues in this release:

- cudnnGetConvolutionForwardWorkspaceSize() returns overflowed size\_t value for certain input shape for CUDNN\_CONVOLUTION\_\*\_ALGO\_FFT\_TILING.
- cudnnPoolingBackward() fails for pooling window size > 256.

# Fixed Issues

The following issues have been fixed in this release:

- ▶ Batch Norm **CUDNN\_BATCHNORM\_SPATIAL\_PERSISTENT** might get into race conditions in certain scenarios.
- ► cuDNN convolution layers using **TENSOR\_OP\_MATH** with fp16 inputs and outputs and fp32 compute will use "round to nearest" mode instead of "round to zero" mode as in 7.0.1. This rounding mode has proven to achieve better results in training.

- ► Fixed synchronization logic in the CUDNN\_CTC\_LOSS\_ALGO\_DETERMINISTIC algo for CTC. The original code would hang in rare cases.
- Convolution algorithms using TENSOR\_OP\_MATH returned a workspace size from
   \*GetWorkspaceSize() smaller than actually necessary.
- ► The results of int8 are inaccurate in certain cases when calling cudnnConvolutionForward() in convolution layer.
- cudnnConvolutionForward() called with xDesc's channel = yDesc's
  channel = groupCount could compute incorrect values when vertical padding >
  0.

# Chapter 5. CUDNN RELEASE NOTES V7.0.1

cuDNN v7.0.1 is the first release to support the Volta GPU architecture. In addition, cuDNN v7.0.1 brings new layers, grouped convolutions, and improved convolution find as error query mechanism.

# **Key Features and Enhancements**

This cuDNN release includes the following key features and enhancements.

#### **Tensor Cores**

Version 7.0.1 of cuDNN is the first to support the Tensor Core operations in its implementation. Tensor Cores provide highly optimized matrix multiplication building blocks that do not have an equivalent numerical behavior in the traditional instructions, therefore, its numerical behavior is slightly different.

# cudnnSetConvolutionMathType, cudnnSetRNNMatrixMathType, and cudnnMathType t

The cudnnSetConvolutionMathType and cudnnSetRNNMatrixMathType functions enable you to choose whether or not to use Tensor Core operations in the convolution and RNN layers respectively by setting the math mode to either CUDNN\_TENSOR\_OP\_MATH or CUDNN\_DEFAULT\_MATH.

Tensor Core operations perform parallel floating point accumulation of multiple floating point products.

Setting the math mode to **CUDNN\_TENSOR\_OP\_MATH** indicates that the library will use Tensor Core operations.

The default is **CUDNN\_DEFAULT\_MATH**. This default indicates that the Tensor Core operations will be avoided by the library. The default mode is a serialized operation

whereas, the Tensor Core is a parallelized operation, therefore, the two might result in slightly different numerical results due to the different sequencing of operations.



The library falls back to the default math mode when Tensor Core operations are not supported or not permitted.

#### cudnnSetConvolutionGroupCount

A new interface that allows applications to perform convolution groups in the convolution layers in a single API call.

#### cudnnCTCLoss

**cudnnCTCLoss** provides a GPU implementation of the Connectionist Temporal Classification (CTC) loss function for RNNs. The CTC loss function is used for phoneme recognition in speech and handwriting recognition.

### CUDNN BATCHNORM SPATIAL PERSISTENT

The CUDNN\_BATCHNORM\_SPATIAL\_PERSISTENT function is a new batch normalization mode for cudnnBatchNormalizationForwardTraining and cudnnBatchNormalizationBackward. This mode is similar to CUDNN\_BATCHNORM\_SPATIAL, however, it can be faster for some tasks.

#### cudnnQueryRuntimeError

The cudnnQueryRuntimeError function reports error codes written by GPU kernels when executing cudnnBatchNormalizationForwardTraining and cudnnBatchNormalizationBackward with the CUDNN BATCHNORM SPATIAL PERSISTENT mode.

#### cudnnGetConvolutionForwardAlgorithm v7

This new API returns all algorithms sorted by expected performance (using internal heuristics). These algorithms are output similarly to cudnnFindConvolutionForwardAlgorithm.

#### cudnnGetConvolutionBackwardDataAlgorithm v7

This new API returns all algorithms sorted by expected performance (using internal heuristics). These algorithms are output similarly to cudnnFindConvolutionBackwardAlgorithm.

# cudnnGetConvolutionBackwardFilterAlgorithm\_v7

This new API returns all algorithms sorted by expected performance (using internal heuristics). These algorithms are output similarly to cudnnFindConvolutionBackwardFilterAlgorithm.

#### CUDNN REDUCE TENSOR MUL NO ZEROS

The **MUL\_NO\_ZEROS** function is a multiplication reduction that ignores zeros in the data.

#### CUDNN OP TENSOR NOT

The **OP\_TENSOR\_NOT** function is a unary operation that takes the negative of (alpha\*A).

#### cudnnGetDropoutDescriptor

The **cudnnGetDropoutDescriptor** function allows applications to get dropout values.

#### Using cuDNN v7.0.1

Ensure you are familiar with the following notes when using this release.

- Multi-threading behavior has been modified. Multi-threading is allowed only when using different cuDNN handles in different threads.
- In cudnnConvolutionBackwardFilter, dilated convolution did not support cases where the product of all filter dimensions was odd for half precision floating point. These are now supported by CUDNN\_CONVOLUTION\_BWD\_FILTER\_ALGO1.
- Fixed bug that produced a silent computation error for when a batch size was larger than 65536 for CUDNN\_CONVOLUTION\_FWD\_ALGO\_IMPLICIT\_PRECOMP\_GEMM.
- ► In getConvolutionForwardAlgorithm, an error was not correctly reported in v5 when the output size was larger than expected. In v6 the CUDNN\_STATUS\_NOT\_SUPPORTED, error message displayed. In v7, this error is modified to CUDNN\_STATUS\_BAD\_PARAM.
- In cudnnConvolutionBackwardFilter, cuDNN now runs some exceptional cases correctly where it previously erroneously returned CUDNN\_STATUS\_NOT\_SUPPORTED. This impacted the algorithms CUDNN\_CONVOLUTION\_BWD\_FILTER\_ALGOO and CUDNN CONVOLUTION BWD FILTER ALGO3.

#### Deprecated Features

The following routines have been removed:

- cudnnSetConvolution2dDescriptor v4
- cudnnSetConvolution2dDescriptor v5
- cudnnGetConvolution2dDescriptor\_v4
- cudnnGetConvolution2dDescriptor v5



Only the non-suffixed versions of these routines remain.

The following routines have been created and have the same API prototype as their non-suffixed equivalent from cuDNN v6:

cudnnSetRNNDescriptor\_v5 - The non-suffixed version of the routines in cuDNN v7.0.1 are now mapped to their \_v6 equivalent.



Attention It is strongly advised to use the non-suffixed version as the \_v5 and \_v6 routines will be removed in the next cuDNN release.

cudnnGetConvolutionForwardAlgorithm, cudnnGetConvolutionBackwardDataAlgorithm, and cudnnGetConvolutionBackwardFilterAlgorithm - A \_v7 version of this routine has been created. For more information, see the Backward compatibility and deprecation policy chapter of the cuDNN documentation for details.

#### **Known Issues**

cuDNN pooling backwards fails for pooling window size > 256.

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