

# cuDNN API Reference

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# Chapter 1. Introduction

NVIDIA® CUDA® Deep Neural Network library<sup>™</sup> (cuDNN) offers a context-based API that allows for easy multithreading and (optional) interoperability with NVIDIA® CUDA® streams. The cuDNN Datatypes Reference API describes all the types and enums of the cuDNN library API. The cuDNN API Reference describes the API of all the routines in the cuDNN library.

The cuDNN library as well as this API document has been split into the following libraries:

- cudnn\_ops\_infer This entity contains the routines related to cuDNN context creation and destruction, tensor descriptor management, tensor utility routines, and the inference portion of common ML algorithms such as batch normalization, softmax, dropout, etc.
- cudnn\_ops\_train This entity contains common training routines and algorithms, such as batch normalization, softmax, dropout, etc. The cudnn\_ops\_train library depends on cudnn ops infer.
- cudnn\_cnn\_infer This entity contains all routines related to convolutional neural networks needed at inference time. The cudnn\_cnn\_infer library depends on cudnn\_ops\_infer.
- cudnn\_cnn\_train This entity contains all routines related to convolutional neural networks needed during training time. The cudnn\_cnn\_train library depends on cudnn\_ops\_infer, cudnn\_ops\_train, and cudnn\_cnn\_infer.
- cudnn\_adv\_infer This entity contains all other features and algorithms. This includes RNNs, CTC loss, and Multihead Attention. The cudnn\_adv\_infer library depends on cudnn\_ops\_infer.
- cudnn\_adv\_train This entity contains all the training counterparts of cudnn\_adv\_infer. The cudnn\_adv\_train library depends on cudnn\_ops\_infer, cudnn ops\_train, and cudnn\_adv\_infer.
- ▶ cudnn This is an optional shim layer between the application layer and the cuDNN code. This layer opportunistically opens the correct library for the API at runtime.

# Chapter 2. Added, Deprecated, And Removed API Functions

# 2.1. API Changes For cuDNN 8.0.2

The following tables show which API functions were added, deprecated, and removed for the cuDNN 8.0.2.

# Table 1. API functions and data types that were added

New functions and data types
cudnnRNNBackwardData_v8()
cudnnRNNBackwardWeights v8()

# 2.2. API Changes For cuDNN 8.0.0 Preview

The following tables show which API functions were added, deprecated, and removed for the cuDNN 8.0.0 Preview Release.

# Table 2. API functions and data types that were added

New functions and data types	
<u>cudnnAdvInferVersionCheck()</u>	
<pre>cudnnAdvTrainVersionCheck()</pre>	
<u>cudnnBackendAttributeName_t</u>	
<u>cudnnBackendAttributeType</u> t	
cudnnBackendCreateDescriptor()	
<u>cudnnBackendDescriptor</u> t	
<u>cudnnBackendDescriptorType_t</u>	

New functions and data types
<pre>cudnnBackendDestroyDescriptor()</pre>
<pre>cudnnBackendExecute()</pre>
cudnnBackendFinalize()
cudnnBackendGetAttribute()
cudnnBackendHeurMode t
cudnnBackendInitialize()
<u>cudnnBackendKnobType_t</u>
<u>cudnnBackendLayoutType_t</u>
<u>cudnnBackendNumericalNote_t</u>
cudnnBackendSetAttribute()
cudnnBuildRNNDynamic()
cudnnCTCLoss v8()
cudnnDeriveNormTensorDescriptor()
<u>cudnnForwardMode_t</u>
<u>cudnnGenStatsMode_t</u>
cudnnGetCTCLossDescriptor v8()
<u>cudnnGetCTCLossDescriptorEx()</u>
cudnnGetCTCLossWorkspaceSize_v8
<pre>cudnnGetFilterSizeInBytes()</pre>
<pre>cudnnGetFoldedConvBackwardDataDescriptors()</pre>
<u>cudnnGetNormalizationBackwardWorkspaceSize()</u>
<u>cudnnGetNormalizationForwardTrainingWorkspaceSize()</u>
<pre>cudnnGetNormalizationTrainingReserveSpaceSize()</pre>
cudnnGetRNNDescriptor_v8()
<pre>cudnnGetRNNMatrixMathType()</pre>
<pre>cudnnGetRNNTempSpaceSizes()</pre>
<u>cudnnGetRNNWeightParams()</u>
<pre>cudnnGetRNNWeightSpaceSize()</pre>
<u>cudnnLRNDescriptor t</u>
<u>cudnnNormAlgo_t</u>
<u>cudnnNormalizationBackward()</u>
<u>cudnnNormalizationForwardInference()</u>
<u>cudnnNormalizationForwardTraining()</u>
<u>cudnnNormMode_t</u>
cudnnNormOps_t
cudnnOpsInferVersionCheck()
cudnnOpsTrainVersionCheck()
<u>cudnnPointwiseMode_t</u>

New functions and data types
cudnnRNNBackwardData_v8()
cudnnRNNBackwardWeights_v8()
<u>cudnnRNNForward()</u>
cudnnRNNGetClip v8()
cudnnRNNSetClip_v8()
cudnnSetCTCLossDescriptor_v8()
cudnnSetRNNDescriptor_v8()
<u>cudnnSeverity_t</u>

For our deprecation policy, refer to the <u>Backward Compatibility And Deprecation Policy</u> section in the *cuDNN Developer Guide*.

Table 3. API functions and data types that were deprecated

Deprecated functions and data types	Replaced with		
<pre>cudnnCopyAlgorithmDescriptor()</pre>			
<pre>cudnnCreateAlgorithmDescriptor()</pre>			
<pre>cudnnCreatePersistentRNNPlan()</pre>	cudnnBuildRNNDynamic()		
<pre>cudnnDestroyAlgorithmDescriptor()</pre>			
cudnnDestroyPersistentRNNPlan()			
cudnnFindRNNBackwardDataAlgorithmEx()			
<pre>cudnnFindRNNBackwardWeightsAlgorithmEx()</pre>			
cudnnFindRNNForwardInferenceAlgorithmEx()			
cudnnFindRNNForwardTrainingAlgorithmEx()			
cudnnGetAlgorithmDescriptor()			
<pre>cudnnGetAlgorithmPerformance()</pre>			
<pre>cudnnGetAlgorithmSpaceSize()</pre>			
cudnnGetRNNBackwardDataAlgorithmMaxCount(	)		
cudnnGetRNNBackwardWeightsAlgorithmMaxCount()			
► cudnnGetRNNDescriptor_v6()	cudnnGetRNNDescriptor_v8()		
<pre>cudnnGetRNNMatrixMathType()</pre>			
<pre>cudnnGetRNNBiasMode()</pre>			
<pre>cudnnGetRNNPaddingMode()</pre>			
<pre>cudnnGetRNNProjectionLayers()</pre>			
cudnnGetRNNForwardInferenceAlgorithmMaxCount()			
cudnnGetRNNForwardTrainingAlgorithmMaxCount()			
<pre>cudnnGetRNNLinLayerBiasParams()</pre>	cudnnGetRNNWeightParams()		

Deprecated functions and data types	Replaced with
<pre>cudnnGetRNNLinLayerMatrixParams()</pre>	
cudnnGetRNNParamsSize()	<u>cudnnGetRNNWeightSpaceSize()</u>
<pre>cudnnGetRNNWorkspaceSize()</pre>	<u>cudnnGetRNNTempSpaceSizes()</u>
► cudnnGetRNNTrainingReserveSize()	
cudnnPersistentRNNPlan_t	
cudnnRestoreAlgorithm()	
<pre>cudnnRNNBackwardData()</pre>	cudnnRNNBackwardData_v8[]
<pre>cudnnRNNBackwardDataEx()</pre>	
	audas DNINDa akurand Waishta (1901)
<pre>cudnnRNNBackwardWeights()</pre>	<u>cudnnRNNBackwardWeights_v8()</u>
<pre>cudnnRNNBackwardWeightsEx()</pre>	
▶ cudnnRNNForwardInference()	cudnnRNNForward()
<pre>cudnnRNNForwardInferenceEx()</pre>	
<pre>cudnnRNNForwardTraining()</pre>	
► cudnnRNNForwardTrainingEx()	
cudnnRNNGetClip()	cudnnRNNGetClip_v8()
cudnnRNNSetClip()	cudnnRNNSetClip_v8()
cudnnSaveAlgorithm()	
cudnnSetAlgorithmDescriptor()	
cudnnSetAlgorithmPerformance()	
cudnnSetPersistentRNNPlan()	
cudnnSetRNNAlgorithmDescriptor()	
cudnnSetRNNBiasMode()	cudnnSetRNNDescriptor_v8()
<pre>cudnnSetRNNDescriptor_v6()</pre>	
<pre>cudnnSetRNNMatrixMathType()</pre>	
<pre>cudnnSetRNNPaddingMode()</pre>	
<pre>cudnnSetRNNProjectionLayers()</pre>	

# Table 4. API functions and data types that were removed

Removed functions and data types	
cudnnConvolutionBwdDataPreference_t	
cudnnConvolutionBwdFilterPreference_t	
cudnnConvolutionFwdPreference_t	

# Removed functions and data types

cudnnGetConvolutionBackwardDataAlgorithm()

cudnnGetConvolutionBackwardFilterAlgorithm()

cudnnGetConvolutionForwardAlgorithm()

cudnnGetRNNDescriptor()

cudnnSetRNNDescriptor()

# Chapter 3. **cudnn\_ops\_infer.so**Library

# 3.1. Data Type References

# 3.1.1. Pointer To Opaque Struct Types

# 3.1.1.1. cudnnActivationDescriptor\_t

cudnnActivationDescriptor\_t is a pointer to an opaque structure holding the description of an activation operation. <a href="cudnnCreateActivationDescriptor">cudnnCreateActivationDescriptor</a>[) is used to create one instance, and cudnnSetActivationDescriptor() must be used to initialize this instance.

# 3.1.1.2. cudnnCTCLossDescriptor\_t

cudnnCTCLossDescriptor\_t is a pointer to an opaque structure holding the description of a CTC loss operation. <a href="mailto:cudnnCreateCTCLossDescriptor">cudnnCreateCTCLossDescriptor</a>[) is used to initialize this instance, and <a href="mailto:cudnnDestroyCTCLossDescriptor">cudnnDestroyCTCLossDescriptor</a>[) is used to destroy this instance.

# 3.1.1.3. cudnnDropoutDescriptor\_t

cudnnDropoutDescriptor\_t is a pointer to an opaque structure holding the description of a dropout operation. <a href="mailto:cudnnCreateDropoutDescriptor">cudnnCreateDropoutDescriptor</a>[) is used to initialize this instance, <a href="mailto:cudnnDestroyDropoutDescriptor">cudnnDestroyDropoutDescriptor</a>[) is used to destroy this instance, <a href="mailto:cudnnGetDropoutDescriptor">cudnnGetDropoutDescriptor</a>[) is used to query fields of a previously initialized instance, <a href="mailto:cudnnRestoreDropoutDescriptor">cudnnRestoreDropoutDescriptor</a>[) is used to restore an instance to a previously saved off state.

# 3.1.1.4. cudnnFilterDescriptor\_t

cudnnFilterDescriptor\_t is a pointer to an opaque structure holding the description
of a filter dataset. <u>cudnnCreateFilterDescriptor()</u> is used to create one instance, and

<u>cudnnSetFilter4dDescriptor()</u> or <u>cudnnSetFilterNdDescriptor()</u> must be used to initialize this instance.

# 3.1.1.5. cudnnHandle\_t

cudnnHandle\_t is a pointer to an opaque structure holding the cuDNN library context. The cuDNN library context must be created using <a href="mailto:cudnnCreate()">cudnnCreate()</a> and the returned handle must be passed to all subsequent library function calls. The context should be destroyed at the end using <a href="mailto:cudnnDestroy()">cudnnDestroy()</a>. The context is associated with only one GPU device, the current device at the time of the call to <a href="mailto:cudnnCreate()">cudnnCreate()</a>. However, multiple contexts can be created on the same GPU device.

# 3.1.1.6. cudnnLRNDescriptor t

cudnnLRNDescriptor\_t is a pointer to an opaque structure holding the parameters of a local response normalization. <a href="mailto:cudnnCreateLRNDescriptor">cudnnCreateLRNDescriptor</a>() is used to create one instance, and the routine <a href="mailto:cudnnSetLRNDescriptor">cudnnSetLRNDescriptor</a>() must be used to initialize this instance.

# 3.1.1.7. cudnnOpTensorDescriptor t

cudnnOpTensorDescriptor\_t is a pointer to an opaque structure holding the description of a Tensor Core operation, used as a parameter to <a href="cudnnOpTensorDescriptor">cudnnOpTensorDescriptor</a> is used to create one instance, and <a href="cudnnSetOpTensorDescriptor">cudnnSetOpTensorDescriptor</a> must be used to initialize this instance.

# 3.1.1.8. cudnnPoolingDescriptor t

cudnnPoolingDescriptor\_t is a pointer to an opaque structure holding the description of a pooling operation. <a href="mailto:cudnnCreatePoolingDescriptor">cudnnCreatePoolingDescriptor</a>) is used to create one instance, and <a href="mailto:cudnnSetPoolingNdDescriptor">cudnnSetPoolingNdDescriptor</a>) or <a href="mailto:cudnnSetPooling2dDescriptor">cudnnSetPooling2dDescriptor</a>) must be used to initialize this instance.

# 3.1.1.9. cudnnReduceTensorDescriptor t

cudnnReduceTensorDescriptor\_t is a pointer to an opaque structure holding the description of a tensor reduction operation, used as a parameter to <a href="cudnnReduceTensorDescriptor">cudnnReduceTensorDescriptor</a>() is used to create one instance, and cudnnSetReduceTensorDescriptor() must be used to initialize this instance.

# 3.1.1.10. cudnnSpatialTransformerDescriptor t

cudnnSpatialTransformerDescriptor\_t is a pointer to an opaque structure holding the description of a spatial transformation operation. <a href="mailto:cudnnCreateSpatialTransformerDescriptor">cudnnCreateSpatialTransformerDescriptor</a>() is used to create one instance, <a href="mailto:cudnnSetSpatialTransformerNdDescriptor">cudnnSetSpatialTransformerNdDescriptor</a>() is used to destroy this instance.

# 3.1.1.11. cudnnTensorDescriptor\_t

cudnnCreateTensorDescriptor\_t is a pointer to an opaque structure holding the description of a generic n-D dataset. <a href="cudnnCreateTensorDescriptor">cudnnCreateTensorDescriptor</a>[] is used to create one instance, and one of the routines <a href="cudnnSetTensorNdDescriptor">cudnnSetTensorAdDescriptor</a>[], <a href="cudnnSetTensor4dDescriptor">cudnnSetTensor4dDescriptor</a>[] must be used to initialize this instance.

# 3.1.1.12. cudnnTensorTransformDescriptor\_t

 ${\tt cudnnTensorTransformDescriptor\_t}\ is\ an\ opaque\ structure\ containing\ the\ description\ of\ the\ tensor\ transform.\ Use\ the\ \underline{cudnnCreateTensorTransformDescriptor()}\ function\ to\ create\ an\ instance\ of\ this\ descriptor,\ and\ \underline{cudnnDestroyTensorTransformDescriptor()}\ function\ to\ destroy\ a\ previously\ created\ instance.$ 

# 3.1.2. Enumeration Types

# 3.1.2.1. cudnnActivationMode\_t

cudnnActivationMode\_t is an enumerated type used to select the neuron activation function used in <u>cudnnActivationForward()</u>, <u>cudnnActivationBackward()</u>, and cudnnConvolutionBiasActivationForward().

#### **Values**

# CUDNN\_ACTIVATION\_SIGMOID

Selects the sigmoid function.

# CUDNN\_ACTIVATION\_RELU

Selects the rectified linear function.

## CUDNN ACTIVATION TANH

Selects the hyperbolic tangent function.

# CUDNN\_ACTIVATION\_CLIPPED\_RELU

Selects the clipped rectified linear function.

# CUDNN\_ACTIVATION\_ELU

Selects the exponential linear function.

## CUDNN ACTIVATION IDENTITY

Selects the identity function, intended for bypassing the activation step in <a href="mailto:cudnnConvolutionBiasActivationForward(">cudnnConvolutionBiasActivationForward()</a>. (The <a href="mailto:cudnnConvolutionForward(">cudnnConvolutionForward()</a>. (The <a href="mailto:cudnnConvolutionForward(">cudnnConvolutionForward()</a>. Does not work with <a href="mailto:cudnnActivationForward(">cudnnActivationForward()</a>. or <a href="mailto:cudnnActivationBackward(">cudnnActivationBackward()</a>.

# 3.1.2.2. cudnnAlgorithm\_t

This function has been deprecated in cuDNN 8.0.

# 3.1.2.3. cudnnBatchNormMode\_t

cudnnBatchNormMode\_t is an enumerated type used to specify the mode of operation in <a href="cudnnBatchNormalizationForwardInference">cudnnBatchNormalizationForwardInference</a>(), <a href="cudnnBatchNormalizationBackward">cudnnBatchNormalizationBackward</a>() and <a href="cudnnDeriveBNTensorDescriptor">cudnnBatchNormalizationBackward</a>() and <a href="cudnnDeriveBntensorDescriptor">cudnnBatchNormaliza

## **Values**

## CUDNN BATCHNORM PER ACTIVATION

Normalization is performed per-activation. This mode is intended to be used after the non-convolutional network layers. In this mode, the tensor dimensions of bnBias and bnScale and the parameters used in the cudnnBatchNormalization\* functions, are 1xCxHxW.

## CUDNN BATCHNORM SPATIAL

Normalization is performed over N+spatial dimensions. This mode is intended for use after convolutional layers (where spatial invariance is desired). In this mode the bnBias and bnScale tensor dimensions are 1xCx1x1.

# CUDNN\_BATCHNORM\_SPATIAL\_PERSISTENT

This mode is similar to CUDNN BATCHNORM SPATIAL but it can be faster for some tasks.

An optimized path may be selected for CUDNN\_DATA\_FLOAT and CUDNN\_DATA\_HALF types, compute capability 6.0 or higher for the following two batch normalization API calls: <a href="mailto:cudnnBatchNormalizationForwardTraining(">cudnnBatchNormalizationForwardTraining()</a>, and <a href="mailto:cudnnBatchNormalizationBackward()">cudnnBatchNormalizationBackward()</a>. In the case of <a href="mailto:cudnnBatchNormalizationBackward()">cudnnBatchNormalizationBackward()</a>, the savedMean and savedInvVariance arguments should not be <a href="mailto:null">null</a>.

## The rest of this section applies to NCHW mode only:

This mode may use a scaled atomic integer reduction that is deterministic but imposes more restrictions on the input data range. When a numerical overflow occurs, the algorithm may produce NaN-s or Inf-s (infinity) in output buffers.

When Inf-s/NaN-s are present in the input data, the output in this mode is the same as from a pure floating-point implementation.

For finite but very large input values, the algorithm may encounter overflows more frequently due to a lower dynamic range and emit Inf-s/NaN-s while CUDNN\_BATCHNORM\_SPATIAL will produce finite results. The user can invoke <a href="mailto:cudnnQueryRuntimeError">cudnnQueryRuntimeError</a>() to check if a numerical overflow occurred in this mode.

# 3.1.2.4. cudnnBatchNormOps\_t

cudnnBatchNormOps\_t is an enumerated type used to specify the mode of operation in <a href="mailto:cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize()">cudnnBatchNormalizationForwardTrainingEx()</a>, cudnnGetBatchNormalizationBackwardExWorkspaceSize(),

cudnnBatchNormalizationBackwardEx(), and cudnnGetBatchNormalizationTrainingExReserveSpaceSize() functions.

## **Values**

## CUDNN BATCHNORM OPS BN

Only batch normalization is performed, per-activation.

## CUDNN\_BATCHNORM\_OPS\_BN\_ACTIVATION

First, the batch normalization is performed, and then the activation is performed.

## CUDNN BATCHNORM OPS BN ADD ACTIVATION

Performs the batch normalization, then element-wise addition, followed by the activation operation.

# 3.1.2.5. cudnnCTCLossAlgo t

cudnnCTCLossAlgo t is an enumerated type that exposes the different algorithms available to execute the CTC loss operation.

## **Values**

# CUDNN CTC LOSS ALGO DETERMINISTIC

Results are guaranteed to be reproducible.

# CUDNN CTC LOSS ALGO NON DETERMINISTIC

Results are not guaranteed to be reproducible.

# 3.1.2.6. cudnnDataType\_t

cudnnDataType t is an enumerated type indicating the data type to which a tensor descriptor or filter descriptor refers.

## **Values**

## CUDNN DATA FLOAT

The data is a 32-bit single-precision floating-point (float).

#### CUDNN DATA DOUBLE

The data is a 64-bit double-precision floating-point (double).

## CUDNN DATA HALF

The data is a 16-bit floating-point.

## CUDNN DATA INT8

The data is an 8-bit signed integer.

#### CUDNN DATA UINT8

The data is an 8-bit unsigned integer.

## CUDNN\_DATA\_INT32

The data is a 32-bit signed integer.

# CUDNN\_DATA\_INT8x4

The data is 32-bit elements each composed of 4 8-bit signed integers. This data type is only supported with tensor format CUDNN TENSOR NCHW VECT C.

#### CUDNN DATA INT8x32

The data is 32-element vectors, each element being an 8-bit signed integer. This data type is only supported with the tensor format CUDNN\_TENSOR\_NCHW\_VECT\_C. Moreover, this data type can only be used with algo 1, meaning, CUDNN\_CONVOLUTION\_FWD\_ALGO\_IMPLICIT\_PRECOMP\_GEMM. For more information, see <a href="mailto:cudnnConvolutionFwdAlgo-t">cudnnConvolutionFwdAlgo-t</a>.

## CUDNN\_DATA\_UINT8x4

The data is 32-bit elements each composed of 4 8-bit unsigned integers. This data type is only supported with tensor format CUDNN TENSOR NCHW VECT C.

# 3.1.2.7. cudnnDeterminism\_t

cudnnDeterminism\_t is an enumerated type used to indicate if the computed results are deterministic (reproducible). For more information, see <u>Reproducibility (determinism)</u>.

#### **Values**

# CUDNN NON DETERMINISTIC

Results are not guaranteed to be reproducible.

# CUDNN DETERMINISTIC

Results are guaranteed to be reproducible.

# 3.1.2.8. cudnnDivNormMode\_t

cudnnDivNormMode\_t is an enumerated type used to specify the mode of operation in cudnnDivisiveNormalizationForward() and cudnnDivisiveNormalizationBackward().

#### Values

## CUDNN DIVNORM PRECOMPUTED MEANS

The means tensor data pointer is expected to contain means or other kernel convolution values precomputed by the user. The means pointer can also be NULL, in that case, it's considered to be filled with zeroes. This is equivalent to spatial LRN.



Note: In the backward pass, the means are treated as independent inputs and the gradient over means is computed independently. In this mode, to yield a net gradient over the entire LCN computational graph, the destDiffMeans result should be backpropagated through the user's means layer (which can be implemented using average pooling) and added to the destDiffData tensor produced by <u>cudnnDivisiveNormalizationBackward()</u>.

# 3.1.2.9. cudnnErrQueryMode\_t

cudnnErrQueryMode t is an enumerated type passed to cudnnQueryRuntimeError() to select the remote kernel error query mode.

## **Values**

## CUDNN ERRQUERY RAWCODE

Read the error storage location regardless of the kernel completion status.

# CUDNN\_ERRQUERY\_NONBLOCKING

Report if all tasks in the user stream of the cuDNN handle were completed. If that is the case, report the remote kernel error code.

## CUDNN ERRQUERY BLOCKING

Wait for all tasks to complete in the user stream before reporting the remote kernel error code.

# 3.1.2.10. cudnnFoldingDirection t

cudnnFoldingDirection t is an enumerated type used to select the folding direction. For more information, see cudnnTensorTransformDescriptor t.

## Data Member

# CUDNN TRANSFORM FOLD = 0U

Selects folding.

## CUDNN TRANSFORM UNFOLD = 1U

Selects unfolding.

# 3.1.2.11. cudnnIndicesType t

cudnnIndicesType t is an enumerated type used to indicate the data type for the indices to be computed by the cudnnReduceTensor() routine. This enumerated type is used as a field for the cudnnReduceTensorDescriptor t descriptor.

# **Values**

# CUDNN 32BIT INDICES

Compute unsigned int indices.

# CUDNN 64BIT INDICES

Compute unsigned long indices.

# CUDNN 16BIT INDICES

Compute unsigned short indices.

# CUDNN 8BIT INDICES

Compute unsigned char indices.

# 3.1.2.12. cudnnLRNMode t

cudnnLRNMode t is an enumerated type used to specify the mode of operation in cudnnLRNCrossChannelForward() and cudnnLRNCrossChannelBackward().

## **Values**

#### CUDNN LRN CROSS CHANNEL DIM1

LRN computation is performed across tensor's dimension dimA[1].

# 3.1.2.13. cudnnMathType t

cudnnMathType t is an enumerated type used to indicate if the use of Tensor Core operations is permitted in a given library routine.

## Values

#### CUDNN DEFAULT MATH

Tensor Core operations are not used on pre-NVIDIA A100 GPU devices. On A100 GPU devices, Tensor Core TF32 operation is permitted.

# CUDNN TENSOR OP MATH

The use of Tensor Core operations is permitted but will not actively perform datatype down conversion on tensors in order to utilize Tensor Cores

#### CUDNN TENSOR OP MATH ALLOW CONVERSION

The use of Tensor Core operations is permitted and will actively perform datatype down conversion on tensors in order to utilize Tensor Cores.

# CUDNN FMA MATH

Restricted to only kernels that use FMA instructions.

On pre-NVIDIA A100 GPU devices, CUDNN DEFAULT MATH and CUDNN FMA MATH have the same behavior: Tensor Core kernels will not be selected. With NVIDIA Ampere GPU architecture and CUDA Toolkit 11, CUDNN DEFAULT MATH permits TF32 Tensor Core operation and CUDNN FMA MATH does not. The TF32 behavior for CUDNN DEFAULT MATH can be explicitly disabled by the environment variable NVIDIA TF32 OVERRIDE=0.

# 3.1.2.14. cudnnNanPropagation t

cudnnNanPropagation t is an enumerated type used to indicate if a given routine should propagate Nan numbers. This enumerated type is used as a field for the cudnnActivationDescriptor t descriptor and cudnnPoolingDescriptor t descriptor.

## Values

## CUDNN NOT PROPAGATE NAN

Nan numbers are not propagated.

## CUDNN PROPAGATE NAN

Nan numbers are propagated.

# 3.1.2.15. cudnnNormAlgo t

cudnnNormAlgo t is an enumerated type used to specify the algorithm to execute the normalization operation.

#### Values

## CUDNN NORM ALGO STANDARD

Standard normalization is performed.

#### CUDNN NORM ALGO PERSIST

This mode is similar to CUDNN NORM ALGO STANDARD, however it only supports CUDNN NORM PER CHANNEL and can be faster for some tasks.

An optimized path may be selected for CUDNN DATA FLOAT and CUDNN DATA HALF types, compute capability 6.0 or higher for the following two normalization API calls: cudnnNormalizationForwardTraining() and cudnnNormalizationBackward(). In the case of cudnnNormalizationBackward(), the savedMean and savedInvVariance arguments should not be NULL.

The rest of this section applies to NCHW mode only: This mode may use a scaled atomic integer reduction that is deterministic but imposes more restrictions on the input data range. When a numerical overflow occurs, the algorithm may produce NaN-s or Inf-s (infinity) in output buffers.

When Inf-s/NaN-s are present in the input data, the output in this mode is the same as from a pure floating-point implementation.

For finite but very large input values, the algorithm may encounter overflows more frequently due to a lower dynamic range and emit Inf-s/NaN-s while CUDNN\_NORM\_ALGO\_STANDARD will produce finite results. The user can invoke <a href="mailto:cudnnQueryRuntimeError()">cudnnQueryRuntimeError()</a> to check if a numerical overflow occurred in this mode.

# 3.1.2.16. cudnnNormMode t

cudnnNormMode\_t is an enumerated type used to specify the mode of operation in <a href="mailto:cudnnNormalizationForwardInference">cudnnNormalizationForwardInference()</a>, <a href="mailto:cudnnBatchNormalizationBackward">cudnnBatchNormalizationBackward()</a>, <a href="mailto:cudnnGetNormalizationBackwardWorkspaceSize()">cudnnGetNormalizationBackwardWorkspaceSize()</a>, and <a href="mailto:cudnnGetNormalizationTrainingReserveSpaceSize()">cudnnGetNormalizationTrainingReserveSpaceSize()</a> routines.

# **Values**

#### CUDNN NORM PER ACTIVATION

Normalization is performed per-activation. This mode is intended to be used after the non-convolutional network layers. In this mode, the tensor dimensions of normBias and normScale and the parameters used in the cudnnNormalization\* functions, are 1xCxHxW.

#### CUDNN NORM PER CHANNEL

Normalization is performed per-channel over N+spatial dimensions. This mode is intended for use after convolutional layers (where spatial invariance is desired). In this mode, the normBias and normScale tensor dimensions are 1xCx1x1.

# 3.1.2.17. cudnnNormOps t

cudnnNormOps\_t is an enumerated type used to specify the mode of
operation in <u>cudnnGetNormalizationForwardTrainingWorkspaceSize()</u>,
<u>cudnnNormalizationForwardTraining()</u>, <u>cudnnGetNormalizationBackwardWorkspaceSize()</u>,
<u>cudnnNormalizationBackward()</u>, and <u>cudnnGetNormalizationTrainingReserveSpaceSize()</u>
functions.

## Values

#### CUDNN NORM OPS NORM

Only normalization is performed.

#### CUDNN NORM OPS NORM ACTIVATION

First, the normalization is performed, then the activation is performed.

# CUDNN NORM OPS NORM ADD ACTIVATION

Performs the normalization, then element-wise addition, followed by the activation operation.

# 3.1.2.18. cudnnOpTensorOp t

cudnnOpTensorOp t is an enumerated type used to indicate the Tensor Core operation to be used by the <u>cudnnOpTensor()</u> routine. This enumerated type is used as a field for the cudnnOpTensorDescriptor t descriptor.

## **Values**

## CUDNN OP TENSOR ADD

The operation to be performed is addition.

## CUDNN OP TENSOR MUL

The operation to be performed is multiplication.

#### CUDNN OP TENSOR MIN

The operation to be performed is a minimum comparison.

#### CUDNN OP TENSOR MAX

The operation to be performed is a maximum comparison.

#### CUDNN OP TENSOR SQRT

The operation to be performed is square root, performed on only the A tensor.

#### CUDNN OP TENSOR NOT

The operation to be performed is negation, performed on only the A tensor.

# 3.1.2.19. cudnnPoolingMode t

cudnnPoolingMode t is an enumerated type passed to cudnnSetPooling2dDescriptor() to select the pooling method to be used by <a href="mailto:cudnnPoolingForward">cudnnPoolingBackward()</a>.

# **Values**

#### CUDNN POOLING MAX

The maximum value inside the pooling window is used.

#### CUDNN POOLING AVERAGE COUNT INCLUDE PADDING

Values inside the pooling window are averaged. The number of elements used to calculate the average includes spatial locations falling in the padding region.

## CUDNN POOLING AVERAGE COUNT EXCLUDE PADDING

Values inside the pooling window are averaged. The number of elements used to calculate the average excludes spatial locations falling in the padding region.

## CUDNN POOLING MAX DETERMINISTIC

The maximum value inside the pooling window is used. The algorithm used is deterministic.

# 3.1.2.20. cudnnReduceTensorIndices t

cudnnReduceTensorIndices t is an enumerated type used to indicate whether indices are to be computed by the <a href="mailto:cudnnReduceTensor">cudnnReduceTensor</a> routine. This enumerated type is used as a field for the cudnnReduceTensorDescriptor t descriptor.

## **Values**

## CUDNN REDUCE TENSOR NO INDICES

Do not compute indices.

#### CUDNN REDUCE TENSOR FLATTENED INDICES

Compute indices. The resulting indices are relative, and flattened.

# 3.1.2.21. cudnnReduceTensorOp t

cudnnReduceTensorOp t is an enumerated type used to indicate the Tensor Core operation to be used by the cudnnReduceTensor() routine. This enumerated type is used as a field for the cudnnReduceTensorDescriptor t descriptor.

#### Values

# CUDNN\_REDUCE\_TENSOR\_ADD

The operation to be performed is addition.

## CUDNN REDUCE TENSOR MUL

The operation to be performed is multiplication.

## CUDNN REDUCE TENSOR MIN

The operation to be performed is a minimum comparison.

## CUDNN REDUCE TENSOR MAX

The operation to be performed is a maximum comparison.

## CUDNN REDUCE TENSOR AMAX

The operation to be performed is a maximum comparison of absolute values.

## CUDNN REDUCE TENSOR AVG

The operation to be performed is averaging.

#### CUDNN REDUCE TENSOR NORM1

The operation to be performed is addition of absolute values.

# CUDNN REDUCE TENSOR NORM2

The operation to be performed is a square root of the sum of squares.

## CUDNN REDUCE TENSOR MUL NO ZEROS

The operation to be performed is multiplication, not including elements of value zero.

# 3.1.2.22. cudnnRNNAlgo t

cudnnRNNAlgo t is an enumerated type used to specify the algorithm used in the cudnnRNNForwardInference(), cudnnRNNForwardTraining(), cudnnRNNBackwardData() and cudnnRNNBackwardWeights() routines.

## Values

## CUDNN RNN ALGO STANDARD

Each RNN layer is executed as a sequence of operations. This algorithm is expected to have robust performance across a wide range of network parameters.

## CUDNN RNN ALGO PERSIST STATIC

The recurrent parts of the network are executed using a *persistent kernel* approach. This method is expected to be fast when the first dimension of the input tensor is small (meaning, a small minibatch).

CUDNN RNN ALGO PERSIST STATIC is only supported on devices with compute capability >= 6.0.

## CUDNN RNN ALGO PERSIST DYNAMIC

The recurrent parts of the network are executed using a *persistent kernel* approach. This method is expected to be fast when the first dimension of the input tensor is small (meaning, a small minibatch). When using CUDNN RNN ALGO PERSIST DYNAMIC persistent kernels are prepared at runtime and are able to optimize using the specific parameters of the network and active GPU. As such, when using CUDNN RNN ALGO PERSIST DYNAMIC a one-time plan preparation stage must be executed. These plans can then be reused in repeated calls with the same model parameters.

The limits on the maximum number of hidden units supported when using CUDNN RNN ALGO PERSIST DYNAMIC are significantly higher than the limits when using CUDNN RNN ALGO PERSIST STATIC, however throughput is likely to significantly reduce when exceeding the maximums supported by CUDNN RNN ALGO PERSIST STATIC. In this regime, this method will still outperform CUDNN RNN ALGO STANDARD for some cases.

CUDNN RNN ALGO PERSIST DYNAMIC is only supported on devices with compute capability >= 6.0 on Linux machines.

# 3.1.2.23. cudnnSamplerType t

cudnnSamplerType\_t is an enumerated type passed to <u>cudnnSetSpatialTransformerNdDescriptor()</u> to select the sampler type to be used by <u>cudnnSpatialTfSamplerForward()</u> and <u>cudnnSpatialTfSamplerBackward()</u>.

# **Values**

# CUDNN SAMPLER BILINEAR

Selects the bilinear sampler.

# 3.1.2.24. cudnnSeverity t

cudnnSeverity\_t is an enumerated type passed to the customized callback function for logging that users may set. This enumerate describes the severity level of the item, so the customized logging call back may react differently.

#### **Values**

## CUDNN SEV FATAL

This value indicates a fatal error emitted by cuDNN.

## CUDNN SEV ERROR

This value indicates a normal error emitted by cuDNN.

#### CUDNN SEV WARNING

This value indicates a warning emitted by cuDNN.

## CUDNN SEV INFO

This value indicates a piece of information (for example, API log) emitted by cuDNN.

# 3.1.2.25. cudnnSoftmaxAlgorithm\_t

cudnnSoftmaxAlgorithm\_t is used to select an implementation of the softmax function used in cudnnSoftmaxForward() and cudnnSoftmaxBackward().

#### **Values**

# CUDNN SOFTMAX FAST

This implementation applies the straightforward softmax operation.

## CUDNN SOFTMAX ACCURATE

This implementation scales each point of the softmax input domain by its maximum value to avoid potential floating point overflows in the softmax evaluation.

#### CUDNN SOFTMAX LOG

This entry performs the log softmax operation, avoiding overflows by scaling each point in the input domain as in CUDNN SOFTMAX ACCURATE.

# 3.1.2.26. cudnnSoftmaxMode t

cudnnSoftmaxMode\_t is used to select over which data the <a href="cudnnSoftmaxForward">cudnnSoftmaxForward()</a> and cudnnSoftmaxBackward() are computing their results.

# **Values**

# CUDNN\_SOFTMAX\_MODE\_INSTANCE

The softmax operation is computed per image (N) across the dimensions C, H, W.

## CUDNN SOFTMAX MODE CHANNEL

The softmax operation is computed per spatial location (H, W) per image (N) across the dimension C.

# 3.1.2.27. cudnnStatus\_t

cudnnStatus\_t is an enumerated type used for function status returns. All cuDNN library functions return their status, which can be one of the following values:

#### Values

# CUDNN\_STATUS\_SUCCESS

The operation was completed successfully.

## CUDNN STATUS NOT INITIALIZED

The cuDNN library was not initialized properly. This error is usually returned when a call to <a href="mailto:cudnnCreate()">cudnnCreate()</a> fails or when <a href="mailto:cudnnCreate()">cudnnCreate()</a> has not been called prior to calling another cuDNN routine. In the former case, it is usually due to an error in the CUDA Runtime API called by <a href="mailto:cudnnCreate()">cudnnCreate()</a> or by an error in the hardware setup.

# CUDNN\_STATUS\_ALLOC\_FAILED

Resource allocation failed inside the cuDNN library. This is usually caused by an internal cudaMalloc() failure.

To correct, prior to the function call, deallocate previously allocated memory as much as possible.

# CUDNN\_STATUS\_BAD\_PARAM

An incorrect value or parameter was passed to the function.

To correct, ensure that all the parameters being passed have valid values.

#### CUDNN STATUS ARCH MISMATCH

The function requires a feature absent from the current GPU device. Note that cuDNN only supports devices with compute capabilities greater than or equal to 3.0.

To correct, compile and run the application on a device with appropriate compute capability.

## CUDNN STATUS MAPPING ERROR

An access to GPU memory space failed, which is usually caused by a failure to bind a texture.

To correct, prior to the function call, unbind any previously bound textures.

Otherwise, this may indicate an internal error/bug in the library.

# CUDNN STATUS EXECUTION FAILED

The GPU program failed to execute. This is usually caused by a failure to launch some cuDNN kernel on the GPU, which can occur for multiple reasons.

To correct, check that the hardware, an appropriate version of the driver, and the cuDNN library are correctly installed.

Otherwise, this may indicate an internal error/bug in the library.

# CUDNN STATUS INTERNAL ERROR

An internal cuDNN operation failed.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The functionality requested is not presently supported by cuDNN.

## CUDNN STATUS LICENSE ERROR

The functionality requested requires some license and an error was detected when trying to check the current licensing. This error can happen if the license is not present or is expired or if the environment variable NVIDIA LICENSE FILE is not set properly.

## CUDNN STATUS RUNTIME PREREQUISITE MISSING

The runtime library that is required by RNN calls (libcuda.so or nvcuda.dll) cannot be found in predefined search paths.

# CUDNN\_STATUS\_RUNTIME\_IN\_PROGRESS

Some tasks in the user stream are not completed.

## CUDNN STATUS RUNTIME FP OVERFLOW

Numerical overflow occurred during the GPU kernel execution.

# 3.1.2.28. cudnnTensorFormat t

cudnnTensorFormat t is an enumerated type used by <a href="mailto:cudnnSetTensor4dDescriptor">cudnnTensorFormat t is an enumerated type used by <a href="mailto:cudnnSetTensor4dDescriptor">cudnnTensorFormat t is an enumerated type used by <a href="mailto:cudnnSetTensor4dDescriptor">cudnnSetTensor4dDescriptor</a>() to create a tensor with a pre-defined layout. For a detailed explanation of how these tensors are arranged in memory, see the <u>Data Layout Formats</u> section in the cuDNN Developer Guide.

## **Values**

# CUDNN\_TENSOR\_NCHW

This tensor format specifies that the data is laid out in the following order: batch size, feature maps, rows, columns. The strides are implicitly defined in such a way that the data are contiguous in memory with no padding between images, feature maps, rows, and columns; the columns are the inner dimension and the images are the outermost dimension.

#### CUDNN TENSOR NHWC

This tensor format specifies that the data is laid out in the following order: batch size, rows, columns, feature maps. The strides are implicitly defined in such a way that the data are contiguous in memory with no padding between images, rows, columns, and feature maps; the feature maps are the inner dimension and the images are the outermost dimension.

#### CUDNN TENSOR NCHW VECT C

This tensor format specifies that the data is laid out in the following order: batch size, feature maps, rows, columns. However, each element of the tensor is a vector of multiple feature maps. The length of the vector is carried by the data type of the tensor. The strides are implicitly defined in such a way that the data are contiguous in memory with no padding between images, feature maps, rows, and columns; the columns are the inner dimension and the images are the outermost dimension. This format is only supported with tensor data types CUDNN\_DATA\_INT8x4, CUDNN\_DATA\_INT8x32, and CUDNN\_DATA\_UINT8x4.

The CUDNN\_TENSOR\_NCHW\_VECT\_C can also be interpreted in the following way: The NCHW INT8x32 format is really N x (C/32) x H x W x 32 (32 Cs for every W), just as the NCHW INT8x4 format is N x (C/4) x H x W x 4 (4 Cs for every W). Hence, the VECT\_C name - each W is a vector [4 or 32] of Cs.

# 3.2. API Functions

# 3.2.1. cudnnActivationForward()

```
cudnnStatus_t cudnnActivationForward(
    cudnnHandle_t handle,
    cudnnActivationDescriptor_t activationDesc,
    const void *alpha,
    const cudnnTensorDescriptor_t xDesc,
    const void *x,
    const void *beta,
    const cudnnTensorDescriptor_t yDesc,
    void *y)
```

This routine applies a specified neuron activation function element-wise over each input value.

#### Note:

- In-place operation is allowed for this routine; meaning, xData and yData pointers may be equal. However, this requires xDesc and yDesc descriptors to be identical (particularly, the strides of the input and output must match for an in-place operation to be allowed).
- All tensor formats are supported for 4 and 5 dimensions, however, the best performance is obtained when the strides of xDesc and yDesc are equal and HW-packed. For more than 5 dimensions the tensors must have their spatial dimensions packed.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### activationDesc

Input. Activation descriptor. For more information, see <u>cudnnActivationDescriptor</u> t.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

Input. Handle to the previously initialized input tensor descriptor. For more information, see <u>cudnnTensorDescriptor</u> t.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### yDesc

*Input.* Handle to the previously initialized output tensor descriptor.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

## Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ The parameter mode has an invalid enumerant value.
- The dimensions n, c, h, w of the input tensor and output tensor differ.

- ▶ The datatype of the input tensor and output tensor differs.
- The strides nStride, cStride, hStride, wStride of the input tensor and output tensor differ and in-place operation is used (meaning, x and y pointers are equal).

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

#### 3.2.2. cudnnAddTensor()

```
cudnnStatus t cudnnAddTensor(
   cudnnHandle t
                                      handle,
   const void
                                     *alpha,
   const cudnnTensorDescriptor t
                                      aDesc,
   const void
                                      *A,
                                     *beta,
   const void
   const cudnnTensorDescriptor t
                                      cDesc.
```

This function adds the scaled values of a bias tensor to another tensor. Each dimension of the bias tensor A must match the corresponding dimension of the destination tensor C or must be equal to 1. In the latter case, the same value from the bias tensor for those dimensions will be used to blend into the c tensor.



Note: Up to dimension 5, all tensor formats are supported. Beyond those dimensions, this routine is not supported

#### **Parameters**

# handle

Input. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the source value with the prior value in the destination tensor as follows:

```
dstValue = alpha[0]*srcValue + beta[0]*priorDstValue
```

For more information, see Scaling Parameters in the cuDNN Developer Guide.

#### aDesc

Input. Handle to a previously initialized tensor descriptor. For more information, see cudnnTensorDescriptor t.

Α

*Input*. Pointer to data of the tensor described by the aDesc descriptor.

#### cDesc

*Input.* Handle to a previously initialized tensor descriptor.

С

Input/Output. Pointer to data of the tensor described by the cDesc descriptor.

#### Returns

#### CUDNN STATUS SUCCESS

The function executed successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN\_STATUS\_BAD PARAM

The dimensions of the bias tensor refer to an amount of data that is incompatible with the output tensor dimensions or the dataType of the two tensor descriptors are different.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# cudnnBatchNormalizationForwardInference()

```
cudnnStatus t cudnnBatchNormalizationForwardInference(
    cudnnHandle t
                                     handle.
    cudnnBatchNormMode t
                                     mode.
                                     *alpha,
    const void
    const void
                                    *beta,
    const cudnnTensorDescriptor t
                                     xDesc.
    const void
                                    *x,
    const cudnnTensorDescriptor t
                                     yDesc,
                                     *y,
    void
    const cudnnTensorDescriptor t
                                    bnScaleBiasMeanVarDesc,
                                    *bnScale,
    const void
    const void
                                    *bnBias,
    const void
                                    *estimatedMean,
    const void
                                    *estimatedVariance,
    double
```

This function performs the forward batch normalization layer computation for the inference phase. This layer is based on the paper Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift, S. Ioffe, C. Szegedy, 2015.



#### Note:

- Only 4D and 5D tensors are supported.
- The input transformation performed by this function is defined as:

```
y = beta*y + alpha *[bnBias + (bnScale * (x-estimatedMean)/sqrt(epsilon +
estimatedVariance)]
```

- ▶ The epsilon value has to be the same during training, backpropagation and inference.
- For the training phase, use <u>cudnnBatchNormalizationForwardTraining()</u>.
- Higher performance can be obtained when HW-packed tensors are used for all of x and dx.

For more information, see cudnnDeriveBNTensorDescriptor() for the secondary tensor descriptor generation for the parameters used in this function.

cuDNN API Reference

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

*Input*. Mode of operation (spatial or per-activation). For more information, see <u>cudnnBatchNormMode</u> t.

# alpha, beta

*Inputs.* Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### xDesc, yDesc

*Input*. Handles to the previously initialized tensor descriptors.

#### \*x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc, for the layer's x input data.

#### \*у

*Input.* Data pointer to GPU memory associated with the tensor descriptor yDesc, for the youtput of the batch normalization layer.

#### bnScaleBiasMeanVarDesc, bnScale, bnBias

*Inputs.* Tensor descriptors and pointers in device memory for the batch normalization scale and bias parameters (in the original paper bias is referred to as beta and scale as gamma).

# estimatedMean, estimatedVariance

Inputs. Mean and variance tensors (these have the same descriptor as the bias and scale). The resultRunningMean and resultRunningVariance, accumulated during the training phase from the <u>cudnnBatchNormalizationForwardTraining()</u> call, should be passed as inputs here.

#### epsilon

Input. Epsilon value used in the batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN BN MIN EPSILON in cudnn.h.

# Supported configurations

This function supports the following combinations of data types for various descriptors.

Table 5. Supported configurations

Data Type Configurations	xDesc	bnScaleBiasMean	alpha, beta	yDesc
INT8_CONFIG	CUDNN_DATA_INT8	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_INT8
PSEUDO_HALF_CONF	ICUDNN_DATA_HALF	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_HALF
FLOAT_CONFIG	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT
DOUBLE_CONFIG	CUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL

# Returns

#### CUDNN STATUS SUCCESS

The computation was performed successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the pointers alpha, beta, x, y, bnScale, bnBias, estimatedMean, estimatedInvVariance is NULL.
- The number of xDesc or yDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported.)
- bnScaleBiasMeanVarDesc dimensions are not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- epsilon value is less than CUDNN\_BN\_MIN\_EPSILON.
- Dimensions or data types mismatch for xDesc, yDesc.

# 3.2.4. cudnnCopyAlgorithmDescriptor()

This function has been deprecated in cuDNN 8.0.

# 3.2.5. cudnnCreate()

cudnnStatus t cudnnCreate(cudnnHandle t \*handle)

This function initializes the cuDNN library and creates a handle to an opaque structure holding the cuDNN library context. It allocates hardware resources on the host and device and must be called prior to making any other cuDNN library calls.

The cuDNN library handle is tied to the current CUDA device (context). To use the library on multiple devices, one cuDNN handle needs to be created for each device.

For a given device, multiple cuDNN handles with different configurations (for example, different current CUDA streams) may be created. Because cudnnCreate() allocates some internal resources, the release of those resources by calling cudnnDestroy() will implicitly call

cudaDeviceSynchronize; therefore, the recommended best practice is to call cudnnCreate/ cudnnDestroy outside of performance-critical code paths.

For multithreaded applications that use the same device from different threads, the recommended programming model is to create one (or a few, as is convenient) cuDNN handle(s) per thread and use that cuDNN handle for the entire life of the thread.

#### **Parameters**

#### handle

Output. Pointer to pointer where to store the address to the allocated cuDNN handle. For more information, see cudnnHandle t.

#### Returns

# CUDNN STATUS BAD PARAM

Invalid (NULL) input pointer supplied.

# CUDNN STATUS NOT INITIALIZED

No compatible GPU found, CUDA driver not installed or disabled, CUDA runtime API initialization failed.

## CUDNN STATUS ARCH MISMATCH

NVIDIA GPU architecture is too old.

#### CUDNN STATUS ALLOC FAILED

Host memory allocation failed.

# CUDNN STATUS INTERNAL ERROR

CUDA resource allocation failed.

#### CUDNN STATUS LICENSE ERROR

cuDNN license validation failed (only when the feature is enabled).

# CUDNN STATUS SUCCESS

cuDNN handle was created successfully.

# 3.2.6. cudnnCreateActivationDescriptor()

```
cudnnStatus t cudnnCreateActivationDescriptor(
       cudnnActivationDescriptor t *activationDesc)
```

This function creates an activation descriptor object by allocating the memory needed to hold its opaque structure. For more information, see cudnnActivationDescriptor t.

#### Returns

## CUDNN STATUS SUCCESS

The object was created successfully.

#### CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# 3.2.7. cudnnCreateAlgorithmDescriptor()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus_t cudnnCreateAlgorithmDescriptor(
    cudnnAlgorithmDescriptor_t *algoDesc)
```

This function creates an algorithm descriptor object by allocating the memory needed to hold its opaque structure.

#### Returns

#### CUDNN STATUS SUCCESS

The object was created successfully.

#### CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# 3.2.8. cudnnCreateAlgorithmPerformance()

This function creates multiple algorithm performance objects by allocating the memory needed to hold their opaque structures.

# Returns

#### CUDNN STATUS SUCCESS

The object was created successfully.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# 3.2.9. cudnnCreateDropoutDescriptor()

```
cudnnStatus_t cudnnCreateDropoutDescriptor(
    cudnnDropoutDescriptor t *dropoutDesc)
```

This function creates a generic dropout descriptor object by allocating the memory needed to hold its opaque structure. For more information, see <u>cudnnDropoutDescriptor\_t</u>.

# Returns

# CUDNN\_STATUS\_SUCCESS

The object was created successfully.

#### CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# 3.2.10. cudnnCreateFilterDescriptor()

```
cudnnStatus t cudnnCreateFilterDescriptor(
    cudnnFilterDescriptor t *filterDesc)
```

This function creates a filter descriptor object by allocating the memory needed to hold its opaque structure. For more information, see cudnnFilterDescriptor t.

# Returns

# CUDNN STATUS SUCCESS

The object was created successfully.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

#### 3.2.11. cudnnCreateLRNDescriptor()

```
cudnnStatus_t cudnnCreateLRNDescriptor(
           cudnnLRNDescriptor t *poolingDesc)
```

This function allocates the memory needed to hold the data needed for LRN and DivisiveNormalization layers operation and returns a descriptor used with subsequent layer forward and backward calls.

#### Returns

#### CUDNN STATUS SUCCESS

The object was created successfully.

```
CUDNN STATUS ALLOC FAILED
```

The resources could not be allocated.

# 3.2.12. cudnnCreateOpTensorDescriptor()

```
cudnnStatus t cudnnCreateOpTensorDescriptor(
    cudnnOpTensorDescriptor t* opTensorDesc)
```

This function creates a tensor pointwise math descriptor. For more information, see cudnnOpTensorDescriptor t.

#### **Parameters**

#### opTensorDesc

Output. Pointer to the structure holding the description of the tensor pointwise math such as add, multiply, and more.

# Returns

# CUDNN STATUS SUCCESS

The function returned successfully.

# CUDNN\_STATUS\_BAD\_PARAM

Tensor pointwise math descriptor passed to the function is invalid.

# CUDNN STATUS ALLOC FAILED

Memory allocation for this tensor pointwise math descriptor failed.

# cudnnCreatePoolingDescriptor()

```
cudnnStatus t cudnnCreatePoolingDescriptor(
   cudnnPoolingDescriptor t *poolingDesc)
```

This function creates a pooling descriptor object by allocating the memory needed to hold its opaque structure.

# Returns

#### CUDNN STATUS SUCCESS

The object was created successfully.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# 3.2.14. cudnnCreateReduceTensorDescriptor()

```
cudnnStatus_t cudnnCreateReduceTensorDescriptor(
cudnnReduceTensorDescriptor t* reduceTensorDesc)
```

This function creates a reduced tensor descriptor object by allocating the memory needed to hold its opaque structure.

# Returns

# CUDNN STATUS SUCCESS

The object was created successfully.

# CUDNN\_STATUS\_BAD\_PARAM

reduceTensorDesc is a NULL pointer.

# CUDNN\_STATUS\_ALLOC\_FAILED

The resources could not be allocated.

# cudnnCreateSpatialTransformerDescriptor()

```
cudnnStatus t cudnnCreateSpatialTransformerDescriptor(
   cudnnSpatialTransformerDescriptor t *stDesc)
```

This function creates a generic spatial transformer descriptor object by allocating the memory needed to hold its opaque structure.

#### Returns

#### CUDNN STATUS SUCCESS

The object was created successfully.

```
CUDNN STATUS ALLOC FAILED
```

The resources could not be allocated.

# 3.2.16. cudnnCreateTensorDescriptor()

```
cudnnStatus t cudnnCreateTensorDescriptor(
   cudnnTensorDescriptor t *tensorDesc)
```

This function creates a generic tensor descriptor object by allocating the memory needed to hold its opaque structure. The data is initialized to all zeros.

#### **Parameters**

#### tensorDesc

Input. Pointer to pointer where the address to the allocated tensor descriptor object should be stored.

# Returns

# CUDNN STATUS BAD PARAM

Invalid input argument.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# CUDNN STATUS SUCCESS

The object was created successfully.

# 3.2.17. cudnnCreateTensorTransformDescriptor()

```
cudnnStatus_t cudnnCreateTensorTransformDescriptor(
cudnnTensorTransformDescriptor t *transformDesc);
```

This function creates a tensor transform descriptor object by allocating the memory needed to hold its opaque structure. The tensor data is initialized to be all zero. Use the cudnnSetTensorTransformDescriptor() function to initialize the descriptor created by this function.

# **Parameters**

#### transformDesc

Output. A pointer to an uninitialized tensor transform descriptor.

# Returns

# CUDNN STATUS SUCCESS

The descriptor object was created successfully.

# CUDNN STATUS BAD PARAM

The transformDesc is NULL.

# CUDNN STATUS ALLOC FAILED

The memory allocation failed.

#### 3.2.18. cudnnDeriveBNTensorDescriptor()

```
cudnnStatus t cudnnDeriveBNTensorDescriptor(
   cudnnTensorDescriptor_t
                                  derivedBnDesc,
                                xDesc,
   const cudnnTensorDescriptor t
   cudnnBatchNormMode t
                                  mode)
```

This function derives a secondary tensor descriptor for the batch normalization scale, invVariance, bnBias, and bnScale subtensors from the layer's x data descriptor.

Use the tensor descriptor produced by this function as the bnScaleBiasMeanVarDesc parameter for the cudnnBatchNormalizationForwardInference() and <u>cudnnBatchNormalizationForwardTraining()</u> functions, and as the bnScaleBiasDiffDesc parameter in the <u>cudnnBatchNormalizationBackward()</u> function.

The resulting dimensions will be:

- 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for BATCHNORM MODE SPATIAL
- 1xCxHxW for 4D and 1xCxDxHxW for 5D for BATCHNORM MODE PER ACTIVATION mode

For HALF input data type the resulting tensor descriptor will have a FLOAT type. For other data types, it will have the same type as the input data.



#### Note:

- Only 4D and 5D tensors are supported.
- The derivedBnDesc should be first created using cudnnCreateTensorDescriptor().
- xDesc is the descriptor for the layer's x data and has to be set up with proper dimensions prior to calling this function.

# **Parameters**

# derivedBnDesc

Output. Handle to a previously created tensor descriptor.

#### **x**Desc

Input. Handle to a previously created and initialized layer's x data descriptor.

#### mode

Input. Batch normalization layer mode of operation.

#### Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS BAD PARAM

Invalid Batch Normalization mode.

#### 3 2 19 cudnnDeriveNormTensorDescriptor()

```
cudnnStatus t CUDNNWINAPI
cudnnDeriveNormTensorDescriptor(cudnnTensorDescriptor t derivedNormScaleBiasDesc,
                                cudnnTensorDescriptor_t derivedNormMeanVarDesc,
                                const cudnnTensorDescriptor t xDesc,
                             cudnnNormMode t mode,
                                int groupCnt)
```

This function derives tensor descriptors for the normalization mean, invariance, normBias, and normScale subtensors from the layer's x data descriptor and norm mode. normalization, mean, and invariance share the same descriptor while bias and scale share the same descriptor.

Use the tensor descriptor produced by this function as the normScaleBiasDesc or normMeanVarDesc parameter for the cudnnNormalizationForwardInference() and cudnnNormalizationForwardTraining() functions, and as the dNormScaleBiasDesc and normMeanVarDesc parameter in the <u>cudnnNormalizationBackward()</u> function.

The resulting dimensions will be:

- 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for CUDNN NORM PER ACTIVATION
- 1xCxHxW for 4D and 1xCxDxHxW for 5D for CUDNN NORM PER CHANNEL mode

For HALF input data type the resulting tensor descriptor will have a FLOAT type. For other data types, it will have the same type as the input data.

- Only 4D and 5D tensors are supported.
- ▶ The derivedNormScaleBiasDesc and derivedNormMeanVarDesc should be created first using <a href="mailto:cudnnCreateTensorDescriptor">cudnnCreateTensorDescriptor()</a>.
- xDesc is the descriptor for the layer's x data and has to be set up with proper dimensions prior to calling this function.

#### **Parameters**

#### derivedNormScaleBiasDesc

Output. Handle to a previously created tensor descriptor.

#### derivedNormMeanVarDesc

Output. Handle to a previously created tensor descriptor.

#### xDesc

Input. Handle to a previously created and initialized layer's x data descriptor.

#### mode

Input. The normalization layer mode of operation.

#### Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS BAD PARAM

Invalid Batch Normalization mode.

#### 3.2.20. cudnnDestroy()

```
cudnnStatus_t cudnnDestroy(cudnnHandle t handle)
```

This function releases the resources used by the cuDNN handle. This function is usually the last call with a particular handle to the cuDNN handle. Because cudnnCreate() allocates some internal resources, the release of those resources by calling cudnnDestroy() will implicitly call cudaDeviceSynchronize; therefore, the recommended best practice is to call cudnnCreate/cudnnDestroy outside of performance-critical code paths.

### **Parameters**

### handle

Input. Pointer to the cuDNN handle to be destroyed.

#### Returns

# CUDNN STATUS SUCCESS

The cuDNN context destruction was successful.

#### CUDNN STATUS BAD PARAM

Invalid (NULL) pointer supplied.

#### 3.2.21. cudnnDestroyActivationDescriptor()

```
cudnnStatus_t cudnnDestroyActivationDescriptor(
        cudnnActivationDescriptor t activationDesc)
```

This function destroys a previously created activation descriptor object.

# Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.22. cudnnDestroyAlgorithmDescriptor()

This function has been deprecated in cuDNN 8.0.

This function destroys a previously created algorithm descriptor object.

#### Returns

# CUDNN\_STATUS\_SUCCESS

The object was destroyed successfully.

# 3.2.23. cudnnDestroyAlgorithmPerformance()

This function destroys a previously created algorithm descriptor object.

#### Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.24. cudnnDestroyDropoutDescriptor()

```
cudnnStatus_t cudnnDestroyDropoutDescriptor(
    cudnnDropoutDescriptor t dropoutDesc)
```

This function destroys a previously created dropout descriptor object.

#### Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.25. cudnnDestroyFilterDescriptor()

```
cudnnStatus_t cudnnDestroyFilterDescriptor(
    cudnnFilterDescriptor t filterDesc)
```

This function destroys a previously created tensor 4D descriptor object.

#### Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

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# 3.2.26. cudnnDestroyLRNDescriptor()

```
cudnnStatus_t cudnnDestroyLRNDescriptor(
    cudnnLRNDescriptor t lrnDesc)
```

This function destroys a previously created LRN descriptor object.

# Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.27. cudnnDestroyOpTensorDescriptor()

```
cudnnStatus_t cudnnDestroyOpTensorDescriptor(
    cudnnOpTensorDescriptor_t opTensorDesc)
```

This function deletes a tensor pointwise math descriptor object.

#### **Parameters**

# opTensorDesc

*Input.* Pointer to the structure holding the description of the tensor pointwise math to be deleted.

#### Returns

#### CUDNN STATUS SUCCESS

The function returned successfully.

# 3.2.28. cudnnDestroyPoolingDescriptor()

```
cudnnStatus_t cudnnDestroyPoolingDescriptor(
    cudnnPoolingDescriptor_t poolingDesc)
```

This function destroys a previously created pooling descriptor object.

# Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.29. cudnnDestroyReduceTensorDescriptor()

```
cudnnStatus_t cudnnDestroyReduceTensorDescriptor(
    cudnnReduceTensorDescriptor t tensorDesc)
```

This function destroys a previously created reduce tensor descriptor object. When the input pointer is NULL, this function performs no destroy operation.

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# **Parameters**

#### tensorDesc

*Input*. Pointer to the reduce tensor descriptor object to be destroyed.

#### Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.30. cudnnDestroySpatialTransformerDescriptor()

```
cudnnStatus_t cudnnDestroySpatialTransformerDescriptor(
    cudnnSpatialTransformerDescriptor t stDesc)
```

This function destroys a previously created spatial transformer descriptor object.

# Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.31. cudnnDestroyTensorDescriptor()

cudnnStatus t cudnnDestroyTensorDescriptor(cudnnTensorDescriptor t tensorDesc)

This function destroys a previously created tensor descriptor object. When the input pointer is NULL, this function performs no destroy operation.

#### **Parameters**

#### tensorDesc

*Input*. Pointer to the tensor descriptor object to be destroyed.

#### Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 3.2.32. cudnnDestroyTensorTransformDescriptor()

```
cudnnStatus_t cudnnDestroyTensorTransformDescriptor(
  cudnnTensorTransformDescriptor_t transformDesc);
```

Destroys a previously created tensor transform descriptor.

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#### **Parameters**

#### transformDesc

*Input*. The tensor transform descriptor to be destroyed.

#### Returns

# CUDNN STATUS SUCCESS

The descriptor was destroyed successfully.

#### 3.2.33. cudnnDivisiveNormalizationForward()

```
cudnnStatus t cudnnDivisiveNormalizationForward(
                                  handle,
   cudnnHandle t
                                  normDesc, mode,
   cudnnLRNDescriptor t
   cudnnDivNormMode_t
                                  *alpha,
   const void
   const cudnnTensorDescriptor t xDesc,
                                  *x,
   const void
   const void
                                  *means,
   void
                                   *temp,
                                  *temp2,
   void
   const void
                                  *beta,
   const cudnnTensorDescriptor t
                                  yDesc,
                                   *y)
```

This function performs the forward spatial DivisiveNormalization layer computation. It divides every value in a layer by the standard deviation of its spatial neighbors as described in What is the Best Multi-Stage Architecture for Object Recognition, Jarrett 2009, Local Contrast Normalization Layer section. Note that DivisiveNormalization only implements the x/max(c, sigma x) portion of the computation, where sigma x is the variance over the spatial neighborhood of x. The full LCN (Local Contrastive Normalization) computation can be implemented as a two-step process:

```
x m = x-mean(x);
y = x_m/max(c, sigma(x_m));
```

The x-mean (x) which is often referred to as "subtractive normalization" portion of the computation can be implemented using cuDNN average pooling layer followed by a call to addTensor.



Note: Supported tensor formats are NCHW for 4D and NCDHW for 5D with any non-overlapping non-negative strides. Only 4D and 5D tensors are supported.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

#### normDesc

Input. Handle to a previously initialized LRN parameter descriptor. This descriptor is used for both LRN and DivisiveNormalization layers.

#### divNormMode

Input. DivisiveNormalization layer mode of operation. Currently only CUDNN DIVNORM PRECOMPUTED MEANS is implemented. Normalization is performed using the means input tensor that is expected to be precomputed by the user.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### xDesc. vDesc

Input. Tensor descriptor objects for the input and output tensors. Note that xDesc is shared between x, means, temp, and temp2 tensors.

x

*Input*. Input tensor data pointer in device memory.

#### means

Input. Input means tensor data pointer in device memory. Note that this tensor can be NULL (in that case its values are assumed to be zero during the computation). This tensor also doesn't have to contain means, these can be any values, a frequently used variation is a result of convolution with a normalized positive kernel (such as Gaussian).

# temp, temp2

Workspace. Temporary tensors in device memory. These are used for computing intermediate values during the forward pass. These tensors do not have to be preserved as inputs from forward to the backward pass. Both use xDesc as their descriptor.

У

Output. Pointer in device memory to a tensor for the result of the forward DivisiveNormalization computation.

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the tensor pointers x, y, temp, temp2 is NULL.
- Number of input tensor or output tensor dimensions is outside of [4,5] range.
- A mismatch in dimensions between any two of the input or output tensors.
- For in-place computation when pointers x == y, a mismatch in strides between the input data and output data tensors.

- ► Alpha or beta pointer is NULL.
- LRN descriptor parameters are outside of their valid ranges.
- Any of the tensor strides are negative.

# CUDNN STATUS UNSUPPORTED

The function does not support the provided configuration, for example, any of the input and output tensor strides mismatch (for the same dimension) is a non-supported configuration.

#### 3.2.34. cudnnDropoutForward()

```
cudnnStatus_t cudnnDropoutForward(
    cudnnHandle t
   const cudnnDropoutDescriptor t
                                        dropoutDesc,
   const cudnnTensorDescriptor t
                                        xdesc,
   const void
   const cudnnTensorDescriptor t
                                        ydesc,
   void
                                        *У,
   void
                                        *reserveSpace,
   size t
                                        reserveSpaceSizeInBytes)
```

This function performs forward dropout operation over x returning results in y. If dropout was used as a parameter to <a href="mailto:cudnnSetDropoutDescriptor">cudnnSetDropoutDescriptor</a>(), the approximately dropout fraction of x values will be replaced by a 0, and the rest will be scaled by 1/(1-dropout). This function should not be running concurrently with another cudnnDropoutForward() function using the same states.



#### Note:

- Better performance is obtained for fully packed tensors.
- This function should not be called during inference.

# **Parameters**

#### handle

*Input*. Handle to a previously created cuDNN context.

#### dropoutDesc

*Input.* Previously created dropout descriptor object.

#### **x**Desc

*Input.* Handle to a previously initialized tensor descriptor.

x

*Input*. Pointer to data of the tensor described by the xDesc descriptor.

*Input.* Handle to a previously initialized tensor descriptor.

У

*Output.* Pointer to data of the tensor described by the yDesc descriptor.

#### reserveSpace

Output. Pointer to user-allocated GPU memory used by this function. It is expected that the contents of reserveSpace does not change between cudnnDropoutForward() and cudnnDropoutBackward() calls.

# reserveSpaceSizeInBytes

Input. Specifies the size in bytes of the provided memory for the reserve space.

#### Returns

# CUDNN STATUS SUCCESS

The call was successful.

#### CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ The number of elements of input tensor and output tensors differ.
- The datatype of the input tensor and output tensors differs.
- The strides of the input tensor and output tensors differ and in-place operation is used (meaning, x and y pointers are equal).
- The provided reserveSpaceSizeInBytes is less than the value returned by cudnnDropoutGetReserveSpaceSize().
- <u>cudnnSetDropoutDescriptor()</u> has not been called on dropoutDesc with the non-NULL states argument.

#### CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 3.2.35. cudnnDropoutGetReserveSpaceSize()

```
cudnnStatus t cudnnDropoutGetReserveSpaceSize(
   cudnnTensorDescriptor t
   size t
                               *sizeInBvtes)
```

This function is used to query the amount of reserve needed to run dropout with the input dimensions given by xDesc. The same reserve space is expected to be passed to cudnnDropoutForward() and cudnnDropoutBackward(), and its contents is expected to remain unchanged between cudnnDropoutForward() and cudnnDropoutBackward() calls.

# **Parameters**

#### **x**Desc

Input. Handle to a previously initialized tensor descriptor, describing input to a dropout operation.

#### sizeInBytes

Output. Amount of GPU memory needed as reserve space to be able to run dropout with an input tensor descriptor specified by xDesc.

#### Returns

# CUDNN STATUS SUCCESS

The query was successful.

#### 3.2.36. cudnnDropoutGetStatesSize()

```
cudnnStatus_t cudnnDropoutGetStatesSize(
    cudnnHandle t
                       handle,
                      *sizeInBytes)
   size t
```

This function is used to query the amount of space required to store the states of the random number generators used by cudnnDropoutForward() function.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

# sizeInBytes

Output. Amount of GPU memory needed to store random generator states.

# Returns

# CUDNN STATUS SUCCESS

The query was successful.

# cudnnGetActivationDescriptor()

```
cudnnStatus t cudnnGetActivationDescriptor(
        const cudnnActivationDescriptor t activationDesc,
        cudnnActivationMode t
                                           *mode,
       cudnnNanPropagation t
                                           *reluNanOpt,
                                          *coef)
       double
```

This function queries a previously initialized generic activation descriptor object.

#### **Parameters**

# activationDesc

*Input.* Handle to a previously created activation descriptor.

#### mode

Output. Enumerant to specify the activation mode.

#### reluNanOpt

Output. Enumerant to specify the Nan propagation mode.

#### coef

Output. Floating point number to specify the clipping threshold when the activation mode is set to CUDNN ACTIVATION CLIPPED RELU or to specify the alpha coefficient when the activation mode is set to CUDNN ACTIVATION ELU.

#### Returns

# CUDNN STATUS SUCCESS

The object was queried successfully.

# cudnnGetAlgorithmDescriptor()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnGetAlgorithmDescriptor(
        const cudnnAlgorithmDescriptor t
                                             algoDesc,
        cudnnAlgorithm t
                                             *algorithm)
```

This function queries a previously initialized generic algorithm descriptor object.

# **Parameters**

# algorithmDesc

Input. Handle to a previously created algorithm descriptor.

# algorithm

Input. Struct to specify the algorithm.

#### Returns

#### CUDNN STATUS SUCCESS

The object was queried successfully.

#### 3.2.39. cudnnGetAlgorithmPerformance()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnGetAlgorithmPerformance(
        const cudnnAlgorithmPerformance t
                                             algoPerf,
        cudnnAlgorithmDescriptor t*
                                             algoDesc,
        cudnnStatus t*
                                             status,
        float*
                                             time,
        size t*
                                             memory)
```

This function gueries a previously initialized generic algorithm performance object.

#### **Parameters**

# algoPerf

Input/Output. Handle to a previously created algorithm performance object.

#### algoDesc

*Output.* The algorithm descriptor which the performance results describe.

#### status

Output. The cuDNN status returned from running the algoDesc algorithm.

#### timecoef

Output. The GPU time spent running the algoDesc algorithm.

#### memory

Output. The GPU memory needed to run the algoDesc algorithm.

# Returns

# CUDNN STATUS SUCCESS

The object was queried successfully.

#### cudnnGetAlgorithmSpaceSize() 3.2.40.

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnGetAlgorithmSpaceSize(
   cudnnHandle t
                               handle,
   cudnnAlgorithmDescriptor t algoDesc,
                              algoSpaceSizeInBytes)
```

This function queries for the amount of host memory needed to call <a href="cudnnSaveAlgorithm()">cudnnSaveAlgorithm()</a>, much like the "get workspace size" function guery for the amount of device memory needed.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

# algoDesc

*Input*. A previously created algorithm descriptor.

#### algoSpaceSizeInBytes

Output. Amount of host memory needed as a workspace to be able to save the metadata from the specified algoDesc.

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# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the arguments is NULL.

#### 3.2.41. cudnnGetCallback()

```
cudnnStatus t cudnnGetCallback(
      unsigned mask,
                       **udata,
      void
      cudnnCallback t fptr)
```

This function gueries the internal states of cuDNN error reporting functionality.

# **Parameters**

#### mask

Output. Pointer to the address where the current internal error reporting message bit mask will be outputted.

#### udata

Output. Pointer to the address where the current internally stored udata address will be

#### fptr

Output. Pointer to the address where the current internally stored callback function pointer will be stored. When the built-in default callback function is used, NULL will be outputted.

#### Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

### CUDNN STATUS BAD PARAM

If any of the input parameters are NULL.

# 3.2.42. cudnnGetCudartVersion()

```
size t cudnnGetCudartVersion()
```

The same version of a given cuDNN library can be compiled against different NVIDIA® CUDA® Toolkit<sup>™</sup> versions. This routine returns the CUDA Toolkit version that the currently used cuDNN library has been compiled against.

# 3.2.43. cudnnGetDropoutDescriptor()

```
cudnnStatus_t cudnnGetDropoutDescriptor(
   cudnnDropoutDescriptor t dropoutDesc,
   cudnnHandle t
                              handle,
                              *dropout,
   float
                              **states,
   unsigned long long
                             *seed)
```

This function queries the fields of a previously initialized dropout descriptor.

#### **Parameters**

# dropoutDesc

*Input.* Previously initialized dropout descriptor.

#### handle

*Input.* Handle to a previously created cuDNN context.

### dropout

Output. The probability with which the value from input is set to 0 during the dropout layer.

#### states

Output. Pointer to user-allocated GPU memory that holds random number generator states.

#### seed

Output. Seed used to initialize random number generator states.

### Returns

# CUDNN STATUS SUCCESS

The call was successful.

# CUDNN STATUS BAD PARAM

One or more of the arguments was an invalid pointer.

#### 3.2.44 cudnnGetErrorString()

```
const char * cudnnGetErrorString(cudnnStatus t status)
```

This function converts the cuDNN status code to a NULL terminated (ASCIIZ) static string. For example, when the input argument is CUDNN STATUS SUCCESS, the returned string is CUDNN STATUS SUCCESS. When an invalid status value is passed to the function, the returned string is CUDNN UNKNOWN STATUS.

#### **Parameters**

#### status

Input. cuDNN enumerant status code.

# Returns

Pointer to a static, NULL terminated string with the status name.

# 3.2.45. cudnnGetFilter4dDescriptor()

```
cudnnStatus t cudnnGetFilter4dDescriptor(
    const cudnnFilterDescriptor_t
                                         filterDesc,
                                  \overline{*}dataType,
    cudnnDataType t
                                  *format,
    cudnnTensorFormat t
                                  *k,
    int
    int
                                  *c,
                                  *h,
    int
    int
                                  *w)
```

This function queries the parameters of the previously initialized filter descriptor object.

# **Parameters**

#### filterDesc

*Input.* Handle to a previously created filter descriptor.

#### datatype

Output. Data type.

#### format

Output. Type of format.

k

Output. Number of output feature maps.

С

Output. Number of input feature maps.

h

Output. Height of each filter.

Output. Width of each filter.

# Returns

# CUDNN STATUS SUCCESS

The object was set successfully.

# 3.2.46. cudnnGetFilterNdDescriptor()

```
cudnnStatus t cudnnGetFilterNdDescriptor(
   const cudnnFilterDescriptor t wDesc,
                                    nbDimsRequested,
                                   *dataType,
   cudnnDataType t
   cudnnTensorFormat t
                                   *format,
```

```
int
                                  *nbDims,
                                   filterDimA[])
```

This function queries a previously initialized filter descriptor object.

#### **Parameters**

#### wDesc

Input. Handle to a previously initialized filter descriptor.

#### nbDimsRequested

Input. Dimension of the expected filter descriptor. It is also the minimum size of the arrays filterDimA in order to be able to hold the results

#### datatype

Output. Data type.

#### format

Output. Type of format.

#### nbDims

Output. Actual dimension of the filter.

#### filterDimA

Output. Array of dimension of at least nbDimsRequested that will be filled with the filter parameters from the provided filter descriptor.

# Returns

### CUDNN STATUS SUCCESS

The object was set successfully.

# CUDNN STATUS BAD PARAM

The parameter nbDimsRequested is negative.

#### 3.2.47. cudnnGetFilterSizeInBytes()

```
cudnnStatus t
cudnnGetFilterSizeInBytes(const cudnnFilterDescriptor_t filterDesc, size_t *size);
```

This function returns the size of the filter tensor in memory with respect to the given descriptor. It can be used to know the amount of GPU memory to be allocated to hold that filter tensor.

#### **Parameters**

#### filterDesc

*Input.* handle to a previously initialized filter descriptor.

#### size

Output. size in bytes needed to hold the tensor in GPU memory.

#### Returns

```
CUDNN STATUS SUCCESS
```

filterDesc is valid.

# CUDNN STATUS BAD PARAM

filerDesc is invald.

#### 3.2.48. cudnnGetLRNDescriptor()

```
cudnnStatus t cudnnGetLRNDescriptor(
   cudnnLRNDescriptor t
                          normDesc,
   unsigned
                           *lrnN,
                           *lrnAlpha,
   double
   double
                           *lrnBeta,
                          *lrnK)
   double
```

This function retrieves values stored in the previously initialized LRN descriptor object.

# **Parameters**

#### normDesc

Output. Handle to a previously created LRN descriptor.

#### 1rnN, 1rnAlpha, 1rnBeta, 1rnK

Output. Pointers to receive values of parameters stored in the descriptor object. See <u>cudnnSetLRNDescriptor()</u> for more details. Any of these pointers can be NULL (no value is returned for the corresponding parameter).

# Returns

# CUDNN STATUS SUCCESS

Function completed successfully.

# 3.2.49. cudnnGetOpTensorDescriptor()

```
cudnnStatus t cudnnGetOpTensorDescriptor(
   const cudnnOpTensorDescriptor t opTensorDesc,
   cudnnOpTensorOp t
                                   *opTensorOp,
                                   *opTensorCompType,
   cudnnDataType_t
                                  *opTensorNanOpt)
   cudnnNanPropagation t
```

This function returns the configuration of the passed tensor pointwise math descriptor.

# **Parameters**

# opTensorDesc

*Input.* Tensor pointwise math descriptor passed to get the configuration from.

# opTensorOp

Output. Pointer to the tensor pointwise math operation type, associated with this tensor pointwise math descriptor.

#### opTensorCompType

Output. Pointer to the cuDNN data-type associated with this tensor pointwise math descriptor.

#### opTensorNanOpt

Output. Pointer to the NAN propagation option associated with this tensor pointwise math descriptor.

### Returns

# CUDNN\_STATUS\_SUCCESS

The function returned successfully.

# CUDNN STATUS BAD PARAM

Input tensor pointwise math descriptor passed is invalid.

#### 3.2.50. cudnnGetPooling2dDescriptor()

```
cudnnStatus t cudnnGetPooling2dDescriptor(
                                        poolingDesc,
   const cudnnPoolingDescriptor t
    cudnnPoolingMode t
                                        *mode,
   cudnnNanPropagation t
                                        *maxpoolingNanOpt,
   int
                                        *windowHeight,
   int
                                        *windowWidth,
                                        *verticalPadding,
   int
    int
                                        *horizontalPadding,
   int
                                        *verticalStride,
                                        *horizontalStride)
```

This function queries a previously created 2D pooling descriptor object.

#### **Parameters**

# poolingDesc

*Input.* Handle to a previously created pooling descriptor.

#### mode

Output. Enumerant to specify the pooling mode.

# maxpoolingNanOpt

Output. Enumerant to specify the Nan propagation mode.

#### windowHeight

Output. Height of the pooling window.

# windowWidth

Output. Width of the pooling window.

#### verticalPadding

Output. Size of vertical padding.

# horizontalPadding

Output. Size of horizontal padding.

#### verticalStride

Output. Pooling vertical stride.

#### horizontalStride

Output. Pooling horizontal stride.

### Returns

# CUDNN STATUS SUCCESS

The object was set successfully.

# cudnnGetPooling2dForwardOutputDim()

```
cudnnStatus t cudnnGetPooling2dForwardOutputDim(
   const cudnnPoolingDescriptor_t
                                         poolingDesc,
   const cudnnTensorDescriptor t
                                         inputDesc,
    int
                                         *outN,
   int
                                        *outC,
   int
                                        *outH,
                                        *outW)
   int
```

This function provides the output dimensions of a tensor after 2d pooling has been applied.

Each dimension h and w of the output images is computed as follows:

```
outputDim = 1 + (inputDim + 2*padding - windowDim)/poolingStride;
```

#### **Parameters**

# poolingDesc

*Input.* Handle to a previously initialized pooling descriptor.

#### inputDesc

*Input.* Handle to the previously initialized input tensor descriptor.

N

Output. Number of images in the output.

С

Output. Number of channels in the output.

Н

Output. Height of images in the output.

Output. Width of images in the output.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

#### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- poolingDesc has not been initialized.
- poolingDesc or inputDesc has an invalid number of dimensions (2 and 4 respectively are required).

#### 3.2.52. cudnnGetPoolingNdDescriptor()

```
cudnnStatus_t cudnnGetPoolingNdDescriptor(
const cudnnPoolingDescriptor t
                                poolingDesc,
                                    nbDimsRequested,
int
cudnnPoolingMode t
                                   *mode,
                                   *maxpoolingNanOpt,
cudnnNanPropagation t
                                   *nbDims,
int
int
                                    windowDimA[],
int
                                    paddingA[],
int
                                    strideA[])
```

This function queries a previously initialized generic pooling descriptor object.

# **Parameters**

#### poolingDesc

*Input.* Handle to a previously created pooling descriptor.

# nbDimsRequested

Input. Dimension of the expected pooling descriptor. It is also the minimum size of the arrays windowDimA, paddingA, and strideA in order to be able to hold the results.

#### mode

Output. Enumerant to specify the pooling mode.

#### maxpoolingNanOpt

*Input*. Enumerant to specify the Nan propagation mode.

#### nbDims

Output. Actual dimension of the pooling descriptor.

#### windowDimA

Output. Array of dimension of at least nbDimsRequested that will be filled with the window parameters from the provided pooling descriptor.

#### paddingA

Output. Array of dimension of at least nbDimsRequested that will be filled with the padding parameters from the provided pooling descriptor.

#### strideA

Output. Array of dimension at least nbDimsRequested that will be filled with the stride parameters from the provided pooling descriptor.

#### Returns

# CUDNN STATUS SUCCESS

The object was queried successfully.

# CUDNN STATUS NOT SUPPORTED

The parameter nbDimsRequested is greater than CUDNN DIM MAX.

# cudnnGetPoolingNdForwardOutputDim()

```
cudnnStatus t cudnnGetPoolingNdForwardOutputDim(
    const cudnnPoolingDescriptor t poolingDesc,
    const cudnnTensorDescriptor t
                                    inputDesc,
    int
                                    nbDims,
                                    outDimA[])
```

This function provides the output dimensions of a tensor after Nd pooling has been applied.

Each dimension of the (nbDims-2) -D images of the output tensor is computed as follows:

```
outputDim = 1 + (inputDim + 2*padding - windowDim)/poolingStride;
```

#### **Parameters**

# poolingDesc

Input. Handle to a previously initialized pooling descriptor.

#### inputDesc

Input. Handle to the previously initialized input tensor descriptor.

#### nbDims

*Input.* Number of dimensions in which pooling is to be applied.

#### outDimA

Output. Array of nbDims output dimensions.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- poolingDesc has not been initialized.
- The value of nbDims is inconsistent with the dimensionality of poolingDesc and inputDesc.

# 3.2.54. cudnnGetProperty()

```
cudnnStatus t cudnnGetProperty(
    library\(\overline{P}\)ropertyType
                                  *value)
```

This function writes a specific part of the cuDNN library version number into the provided host storage.

# **Parameters**

# type

Input. Enumerant type that instructs the function to report the numerical value of the cuDNN major version, minor version, or the patch level.

#### value

*Output.* Host pointer where the version information should be written.

#### Returns

#### CUDNN STATUS INVALID VALUE

Invalid value of the type argument.

# CUDNN STATUS SUCCESS

Version information was stored successfully at the provided address.

# 3.2.55. cudnnGetReduceTensorDescriptor()

```
cudnnStatus t cudnnGetReduceTensorDescriptor(
    const cudnnReduceTensorDescriptor_t reduceTensorDesc,
    cudnnReduceTensorOp_t
                                          *reduceTensorOp,
                                          *reduceTensorCompType,
    cudnnDataType t
   cudnnDataType_t
cudnnNanPropagation_t
cudnnReduceTensorIndices_t
                                         *reduceTensorNanOpt,
                                          *reduceTensorIndices,
    cudnnIndicesType t
                                         *reduceTensorIndicesType)
```

This function queries a previously initialized reduce tensor descriptor object.

# **Parameters**

#### reduceTensorDesc

Input. Pointer to a previously initialized reduce tensor descriptor object.

# reduceTensorOp

Output. Enumerant to specify the reduce tensor operation.

#### reduceTensorCompType

Output. Enumerant to specify the computation datatype of the reduction.

# reduceTensorNanOpt

*Input*. Enumerant to specify the Nan propagation mode.

#### reduceTensorIndices

Output. Enumerant to specify the reduced tensor indices.

# reduceTensorIndicesType

*Output.* Enumerant to specify the reduce tensor indices type.

#### Returns

# CUDNN STATUS SUCCESS

The object was queried successfully.

# CUDNN\_STATUS\_BAD\_PARAM

reduceTensorDesc is NULL.

# 3.2.56. cudnnGetReductionIndicesSize()

```
cudnnStatus t cudnnGetReductionIndicesSize(
  cudnnHandle t
                           handle,
  const cudnnReduceTensorDescriptor_t reduceDesc,
```

This is a helper function to return the minimum size of the index space to be passed to the reduction given the input and output tensors.

# **Parameters**

### handle

*Input*. Handle to a previously created cuDNN library descriptor.

#### reduceDesc

*Input*. Pointer to a previously initialized reduce tensor descriptor object.

#### aDesc

*Input*. Pointer to the input tensor descriptor.

#### cDesc

*Input*. Pointer to the output tensor descriptor.

#### sizeInBytes

*Output.* Minimum size of the index space to be passed to the reduction.

# Returns

# CUDNN STATUS SUCCESS

The index space size is returned successfully.

# 3.2.57. cudnnGetReductionWorkspaceSize()

```
cudnnStatus t cudnnGetReductionWorkspaceSize(
     cudnnHandle t
     const cudnnReduceTensorDescriptor_t reduceDesc,
    const cudnnTensorDescriptor_t aDesc,
const cudnnTensorDescriptor_t cDesc,
size_t *sizeInBytes)
    size t
```

This is a helper function to return the minimum size of the workspace to be passed to the reduction given the input and output tensors.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor.

#### reduceDesc

Input. Pointer to a previously initialized reduce tensor descriptor object.

#### aDesc

*Input*. Pointer to the input tensor descriptor.

*Input*. Pointer to the output tensor descriptor.

#### sizeInBytes

*Output.* Minimum size of the index space to be passed to the reduction.

#### Returns

# CUDNN\_STATUS\_SUCCESS

The workspace size is returned successfully.

# 3.2.58. cudnnGetStream()

```
cudnnStatus t cudnnGetStream(
   cudnnHandle t handle,
   cudaStream t
                 *streamId)
```

This function retrieves the user CUDA stream programmed in the cuDNN handle. When the user's CUDA stream is not set in the cuDNN handle, this function reports the null-stream.

#### **Parameters**

#### handle

*Input.* Pointer to the cuDNN handle.

#### streamID

Output. Pointer where the current CUDA stream from the cuDNN handle should be stored.

# Returns

```
CUDNN STATUS BAD PARAM
```

Invalid (NULL) handle.

# CUDNN\_STATUS SUCCESS

The stream identifier was retrieved successfully.

#### 3.2.59. cudnnGetTensor4dDescriptor()

```
cudnnStatus t cudnnGetTensor4dDescriptor(
    const cudnnTensorDescriptor t tensorDesc,
                             *dataType,
    cudnnDataType t
    int
                             *n,
                             *c,
   int
                             *h,
   int
                             *w,
   int
    int
                              *nStride,
    int
                              *cStride,
    int
                             *hStride,
    int
                             *wStride)
```

This function queries the parameters of the previously initialized tensor4D descriptor object.

# **Parameters**

#### tensorDesc

*Input.* Handle to a previously initialized tensor descriptor.

# datatype

Output. Data type.

Output. Number of images.

С

Output. Number of feature maps per image.

h

Output. Height of each feature map.

Output. Width of each feature map.

#### nStride

Output. Stride between two consecutive images.

#### cStride

Output. Stride between two consecutive feature maps.

#### hStride

Output. Stride between two consecutive rows.

#### wStride

Output. Stride between two consecutive columns.

# Returns

# CUDNN STATUS SUCCESS

The operation succeeded.

#### 3.2.60. cudnnGetTensorNdDescriptor()

```
cudnnStatus t cudnnGetTensorNdDescriptor(
   const cudnnTensorDescriptor t tensorDesc,
                                    nbDimsRequested,
                                   *dataType,
   cudnnDataType t
    int
                                    *nbDims,
    int
                                    dimA[],
    int
                                    strideA[])
```

This function retrieves values stored in a previously initialized tensor descriptor object.

#### **Parameters**

#### tensorDesc

*Input.* Handle to a previously initialized tensor descriptor.

# nbDimsRequested

Input. Number of dimensions to extract from a given tensor descriptor. It is also the minimum size of the arrays dimA and strideA. If this number is greater than the resulting nbDims[0], only nbDims[0] dimensions will be returned.

#### datatype

Output. Data type.

#### nbDims

Output. Actual number of dimensions of the tensor will be returned in nbDims[0].

#### dimA

Output. Array of dimensions of at least nbDimsRequested that will be filled with the dimensions from the provided tensor descriptor.

#### strideA

Input. Array of dimension of at least nbDimsRequested that will be filled with the strides from the provided tensor descriptor.

# Returns

# CUDNN STATUS SUCCESS

The results were returned successfully.

# CUDNN STATUS BAD PARAM

Either tensorDesc or nbDims pointer is NULL.

#### 3.2.61. cudnnGetTensorSizeInBytes()

```
cudnnStatus t cudnnGetTensorSizeInBytes(
   const cudnnTensorDescriptor t
                                   tensorDesc,
   size t
                                   *size)
```

This function returns the size of the tensor in memory in respect to the given descriptor. This function can be used to know the amount of GPU memory to be allocated to hold that tensor.

#### **Parameters**

#### tensorDesc

*Input.* Handle to a previously initialized tensor descriptor.

#### size

Output. Size in bytes needed to hold the tensor in GPU memory.

#### Returns

# CUDNN STATUS SUCCESS

The results were returned successfully.

# 3.2.62. cudnnGetTensorTransformDescriptor()

```
cudnnStatus t cudnnGetTensorTransformDescriptor(
cudnnTensorTransformDescriptor t transformDesc,
uint32 t nbDimsRequested,
cudnnTensorFormat t *destFormat,
int32_t padBefore\overline{A}[], int32_t padAfterA[],
uint32 t foldA[],
```

```
cudnnFoldingDirection t *direction);
```

This function returns the values stored in a previously initialized tensor transform descriptor.

#### **Parameters**

#### transformDesc

*Input*. A previously initialized tensor transform descriptor.

# nbDimsRequested

Input. The number of dimensions to consider. For more information, see the Tensor Descriptor section in the cuDNN Developer Guide.

#### destFormat

Output. The transform format that will be returned.

# padBeforeA[]

Output. An array filled with the amount of padding to add before each dimension. The dimension of this padBeforeA[] parameter is equal to nbDimsRequested.

#### padAfterA[]

Output. An array filled with the amount of padding to add after each dimension. The dimension of this padBeforeA[] parameter is equal to nbDimsRequested.

### foldA[]

Output. An array that was filled with the folding parameters for each spatial dimension. The dimension of this foldA[] array is nbDimsRequested-2.

#### direction

Output. The setting that selects folding or unfolding. For more information, see cudnnFoldingDirection t.

# Returns

# CUDNN STATUS SUCCESS

The results were obtained successfully.

# CUDNN STATUS BAD PARAM

If transformDesc is NULL or if nbDimsRequested is less than 3 or greater than CUDNN DIM MAX.

# 3.2.63. cudnnGetVersion()

```
size t cudnnGetVersion()
```

This function returns the version number of the cuDNN library. It returns the CUDNN VERSION defined present in the cudnn.h header file. Starting with release R2, the routine can be used to identify dynamically the current cuDNN library used by the application. The defined CUDNN VERSION can be used to have the same application linked against different cuDNN versions using conditional compilation statements.

#### 3.2.64. cudnnInitTransformDest()

```
cudnnStatus_t cudnnInitTransformDest(
const cudnnTensorTransformDescriptor t transformDesc,
const cudnnTensorDescriptor t srcDesc,
```

```
cudnnTensorDescriptor t destDesc,
size t *destSizeInBytes);
```

This function initializes and returns a destination tensor descriptor destDesc for tensor transform operations. The initialization is done with the desired parameters described in the transform descriptor cudnnTensorDescriptor t.



**Note:** The returned tensor descriptor will be packed.

# **Parameters**

#### transformDesc

*Input.* Handle to a previously initialized tensor transform descriptor.

*Input.* Handle to a previously initialized tensor descriptor.

#### destDesc

Output. Handle of the tensor descriptor that will be initialized and returned.

#### destSizeInBytes

Output. A pointer to hold the size, in bytes, of the new tensor.

# Returns

### CUDNN STATUS SUCCESS

The tensor descriptor was initialized successfully.

# CUDNN\_STATUS\_BAD PARAM

If either srcDesc or destDesc is NULL, or if the tensor descriptor's nbDims is incorrect. For more information, see the <u>Tensor Descriptor</u> section in the *cuDNN Developer Guide*.

# CUDNN STATUS NOT SUPPORTED

If the provided configuration is not 4D.

# CUDNN STATUS EXECUTION FAILED

Function failed to launch on the GPU.

#### 3 2 65 cudnnLRNCrossChannelForward()

```
cudnnStatus t cudnnLRNCrossChannelForward(
   cudnnHandle t
                                   handle,
   cudnnLRNDescriptor t
                                   normDesc,
   cudnnLRNMode t
                                   lrnMode,
   const void
                                  *alpha,
   const cudnnTensorDescriptor t xDesc,
   const void
                                   *×,
   const void
                                   *beta,
                                   yDesc,
   const cudnnTensorDescriptor t
```

This function performs the forward LRN layer computation.



Note: Supported formats are: positive-strided, NCHW and NHWC for 4D x and y, and only NCDHW DHW-packed for 5D (for both x and y). Only non-overlapping 4D and 5D tensors are supported. NCHW layout is preferred for performance.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

#### normDesc

Input. Handle to a previously initialized LRN parameter descriptor.

#### lrnMode

Input. LRN layer mode of operation. Currently only CUDNN LRN CROSS CHANNEL DIM1 is implemented. Normalization is performed along the tensor's dimA[1].

# alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### xDesc, yDesc

*Input*. Tensor descriptor objects for the input and output tensors.

Input. Input tensor data pointer in device memory.

Output. Output tensor data pointer in device memory.

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the tensor pointers x, y is NULL.
- Number of input tensor dimensions is 2 or less.
- LRN descriptor parameters are outside of their valid ranges.
- One of the tensor parameters is 5D but is not in NCDHW DHW-packed format.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

- Any of the input tensor datatypes is not the same as any of the output tensor datatype.
- x and y tensor dimensions mismatch.

Any tensor parameters strides are negative.

#### 3.2.66. cudnnNormalizationForwardInference()

```
cudnnStatus t
cudnnNormalizationForwardInference(cudnnHandle t handle,
                                     cudnnNormMode t mode,
                                  cudnnNormOps t normOps,
                                    cudnnNormAlgo_t algo,
                                 const void *alpha,
                                 const void *beta,
                                 const cudnnTensorDescriptor t xDesc,
                                 const void *x,
                                  const cudnnTensorDescriptor t normScaleBiasDesc,
                                 const void *normScale,
                                 const void *normBias,
                                 const cudnnTensorDescriptor t normMeanVarDesc,
                                 const void *estimatedMean,
const void *estimatedVariance,
                                 const cudnnTensorDescriptor t zDesc,
                                 const void *z,
                                    cudnnActivationDescriptor t activationDesc,
                                  const cudnnTensorDescriptor t yDesc,
                                  double epsilon,
                                  int groupCnt);
```

This function performs the forward normalization layer computation for the inference phase. Per-channel normalization layer is based on the paper Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift, S. loffe, C. Szegedy, 2015.



#### Note:

- Only 4D and 5D tensors are supported.
- The input transformation performed by this function is defined as:

```
y = beta*y + alpha *[normBias + (normScale * (x-estimatedMean)/sqrt(epsilon +
estimatedVariance)]
```

- ▶ The epsilon value has to be the same during training, backpropagation, and inference.
- For the training phase, use <u>cudnnNormalizationForwardTraining()</u>.
- Higher performance can be obtained when HW-packed tensors are used for all of x and y.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (per-channel or per-activation). For more information, see cudnnNormMode t.

#### normOps

Input. Mode of post-operative. Currently, CUDNN NORM OPS NORM ACTIVATION and CUDNN NORM OPS NORM ADD ACTIVATION are not supported.

#### algo

Input. Algorithm to be performed. For more information, see cudnnNormAlgo t.

# alpha, beta

Inputs. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

# dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see Scaling Parameters in the cuDNN Developer Guide.

#### xDesc, yDesc

*Input.* Handles to the previously initialized tensor descriptors.

#### \*x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc, for the layer's x input data.

#### \*у

Output. Data pointer to GPU memory associated with the tensor descriptor yDesc, for the y output of the normalization layer.

#### zDesc. \*z

Input. Tensor descriptors and pointers in device memory for residual addition to the result of the normalization operation, prior to the activation. zDesc and \*z are optional and are only used when normOps is CUDNN NORM OPS NORM ADD ACTIVATION, otherwise users may pass NULL. When in use, z should have exactly the same dimension as x and the final output y. For more information, see cudnnTensorDescriptor t.

Since normops is only supported for CUDNN NORM OPS NORM, we can set these to NULL for now.

#### normScaleBiasDesc, normScale, normBias

Inputs. Tensor descriptors and pointers in device memory for the normalization scale and bias parameters (in the original paper bias is referred to as beta and scale as gamma).

# normMeanVarDesc, estimatedMean, estimatedVariance

Inputs. Mean and variance tensors and their tensor descriptors. The estimatedMean and estimatedVariance inputs, accumulated during the training phase from the <u>cudnnNormalizationForwardTraining()</u> call, should be passed as inputs here.

# activationDesc

Input. Descriptor for the activation operation. When the normops input is set to either CUDNN NORM OPS NORM ACTIVATION OF CUDNN NORM OPS NORM ADD ACTIVATION then this activation is used, otherwise the user may pass NULL. Since normOps is only supported for CUDNN NORM OPS NORM, we can set these to NULL for now.

#### epsilon

*Input.* Epsilon value used in the normalization formula. Its value should be equal to or greater than zero.

## groutCnt

Input. Only support 1 for now.

## Returns

## CUDNN STATUS SUCCESS

The computation was performed successfully.

## CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

## CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- One of the pointers alpha, beta, x, y, normScale, normBias, estimatedMean, and estimatedInvVariance is NULL.
- The number of xDesc or yDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- normScaleBiasDesc and normMeanVarDesc dimensions are not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for per-channel, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- epsilon value is less than zero.
- ▶ Dimensions or data types mismatch for xDesc and yDesc.

## CUDNN\_STATUS\_NOT\_SUPPORTED

A compute or data type other than FLOAT was chosen, or an unknown algorithm type was chosen.

## CUDNN\_STATUS\_EXECUTION\_FAILED

The function failed to launch on the GPU.

## 3.2.67. cudnnOpsInferVersionCheck()

cudnnStatus t cudnnOpsInferVersionCheck(void)

This function is the first of a series of corresponding functions that check for consistent library versions among DLL files for different modules.

#### Returns

#### CUDNN STATUS SUCCESS

The version of this DLL file is consistent with cuDNN DLLs on which it depends.

#### CUDNN STATUS VERSION MISMATCH

The version of this DLL file does not match that of a cuDNN DLLs on which it depends.

## 3.2.68. cudnnOpTensor()

```
cudnnStatus t cudnnOpTensor(
   cudnnHandle t
                                   handle,
   const cudnnOpTensorDescriptor t opTensorDesc,
   const void
                                   *alpha1,
   const cudnnTensorDescriptor t
                                    aDesc,
  const void
                                   *A,
                                  *alpha2,
  const void
   const cudnnTensorDescriptor t
                                   bDesc,
   const void
   const void
                                   *beta,
   const cudnnTensorDescriptor t
                                   cDesc,
                                   *C)
   void
```

This function implements the equation  $C = op(alpha1[0] * A, alpha2[0] * B) + beta[0] * C, given the tensors A, B, and C and the scaling factors alpha1, alpha2, and beta. The op to use is indicated by the descriptor <u>cudnnOpTensorDescriptor t</u>, meaning, the type of opTensorDesc. Currently-supported ops are listed by the <u>cudnnOpTensorOp_t</u> enum.$ 

The following restrictions on the input and destination tensors apply:

- ► Each dimension of the input tensor A must match the corresponding dimension of the destination tensor C, and each dimension of the input tensor B must match the corresponding dimension of the destination tensor C or must be equal to 1. In the latter case, the same value from the input tensor B for those dimensions will be used to blend into the C tensor.
- ► The data types of the input tensors A and B, and the destination tensor C, must satisfy Table 6.

Table 6. Supported Datatypes

opTensorCompType in opTensorDesc	A	В	c (destination)
FLOAT	FLOAT	FLOAT	FLOAT
FLOAT	INT8	INT8	FLOAT
FLOAT	HALF	HALF	FLOAT
DOUBLE	DOUBLE	DOUBLE	DOUBLE
FLOAT	FLOAT	FLOAT	HALF
FLOAT	HALF	HALF	HALF
FLOAT	INT8	INT8	INT8
FLOAT	FLOAT	FLOAT	INT8

**Note:** All tensor formats up to dimension five (5) are supported. This routine does not support tensor formats beyond these dimensions.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

## opTensorDesc

*Input.* Handle to a previously initialized op tensor descriptor.

## alpha1, alpha2, beta

Input. Pointers to scaling factors (in host memory) used to blend the source value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### aDesc. bDesc. cDesc

*Input.* Handle to a previously initialized tensor descriptor.

#### A, B

Input. Pointer to data of the tensors described by the aDesc and bDesc descriptors, respectively.

С

Input/Output. Pointer to data of the tensor described by the cDesc descriptor.

#### Returns

## CUDNN STATUS SUCCESS

The function executed successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

- The dimensions of the bias tensor and the output tensor dimensions are above 5.
- opTensorCompType is not set as stated above.

## CUDNN STATUS BAD PARAM

The data type of the destination tensor c is unrecognized, or the restrictions on the input and destination tensors, stated above, are not met.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

#### 3.2.69. cudnnPoolingForward()

```
cudnnStatus t cudnnPoolingForward(
   cudnnHandle t
```

handle,

```
const cudnnPoolingDescriptor t poolingDesc,
                               *alpha,
const void
const cudnnTensorDescriptor t xDesc,
                               *x,
const void
const void
                               *beta,
const cudnnTensorDescriptor t
                               yDesc,
```

This function computes pooling of input values (meaning, the maximum or average of several adjacent values) to produce an output with smaller height and/or width.



#### Note:

- ▶ All tensor formats are supported, best performance is expected when using HW-packed tensors. Only 2 and 3 spatial dimensions are allowed.
- The dimensions of the output tensor yDesc can be smaller or bigger than the dimensions advised by the routine <a href="mailto:cudnnGetPooling2dForwardOutputDim(">cudnnGetPooling2dForwardOutputDim()</a> or cudnnGetPoolingNdForwardOutputDim().

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

## poolingDesc

*Input.* Handle to a previously initialized pooling descriptor.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see Scaling Parameters in the cuDNN Developer Guide.

## xDesc

Input. Handle to the previously initialized input tensor descriptor. Must be of type FLOAT, DOUBLE, HALF or INT8. For more information, see <u>cudnnDataType t</u>.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### yDesc

Input. Handle to the previously initialized output tensor descriptor. Must be of type FLOAT, DOUBLE, HALF or INT8. For more information, see cudnnDataType t.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

## Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- The dimensions n, c of the input tensor and output tensors differ.
- ▶ The datatype of the input tensor and output tensors differs.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

#### 3.2.70. cudnnQueryRuntimeError()

```
cudnnStatus t cudnnQueryRuntimeError(
                        handle,
    cudnnHandle_t
    cudnnStatus_t
                              *rstatus,
    cudnnErrQueryMode_t mode,
cudnnRuntimeTag_t *tag)
```

cuDNN library functions perform extensive input argument checking before launching GPU kernels. The last step is to verify that the GPU kernel actually started. When a kernel fails to start, CUDNN STATUS EXECUTION FAILED is returned by the corresponding API call. Typically, after a GPU kernel starts, no runtime checks are performed by the kernel itself - numerical results are simply written to output buffers.

When the CUDNN BATCHNORM SPATIAL PERSISTENT mode is selected in cudnnBatchNormalizationForwardTraining() or cudnnBatchNormalizationBackward(), the algorithm may encounter numerical overflows where CUDNN BATCHNORM SPATIAL performs just fine albeit at a slower speed. The user can invoke cudnnQueryRuntimeError() to make sure numerical overflows did not occur during the kernel execution. Those issues are reported by the kernel that performs computations.

cudnnQueryRuntimeError() can be used in polling and blocking software control flows. There are two polling modes (CUDNN ERRQUERY RAWCODE and CUDNN ERRQUERY NONBLOCKING) and one blocking mode CUDNN ERRQUERY BLOCKING.

CUDNN ERRQUERY RAWCODE reads the error storage location regardless of the kernel completion status. The kernel might not even start and the error storage (allocated per cuDNN handle) might be used by an earlier call.

CUDNN ERRQUERY NONBLOCKING checks if all tasks in the user stream are completed. The cudnnQueryRuntimeError() function will return immediately and report CUDNN STATUS RUNTIME IN PROGRESS in rstatus if some tasks in the user stream are pending. Otherwise, the function will copy the remote kernel error code to rstatus.

In the blocking mode (CUDNN ERRQUERY BLOCKING), the function waits for all tasks to drain in the user stream before reporting the remote kernel error code. The blocking flavor can be further adjusted by calling cudaSetDeviceFlags with the cudaDeviceScheduleSpin, cudaDeviceScheduleYield, Or cudaDeviceScheduleBlockingSync flag.

CUDNN ERRQUERY NONBLOCKING and CUDNN ERRQUERY BLOCKING modes should not be used when the user stream is changed in the cuDNN handle, meaning, cudnnSetStream() is invoked between functions that report runtime kernel errors and the cudnnQueryRuntimeError() function.

The remote error status reported in rstatus can be set to: CUDNN STATUS SUCCESS, CUDNN STATUS RUNTIME IN PROGRESS, OR CUDNN STATUS RUNTIME FP OVERFLOW. The remote kernel error is automatically cleared by cudnnQueryRuntimeError().



Note: The cudnnQueryRuntimeError() function should be used in conjunction with cudnnBatchNormalizationForwardTraining() and cudnnBatchNormalizationBackward() when the <u>cudnnBatchNormMode</u> <u>t</u> argument is CUDNN BATCHNORM SPATIAL PERSISTENT.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

## rstatus

*Output.* Pointer to the user's error code storage.

#### mode

Input. Remote error query mode.

#### tag

Input/Output. Currently, this argument should be NULL.

#### Returns

## CUDNN STATUS SUCCESS

No errors detected (rstatus holds a valid value).

## CUDNN\_STATUS\_BAD PARAM

Invalid input argument.

## CUDNN STATUS INTERNAL ERROR

A stream blocking synchronization or a non-blocking stream query failed.

## CUDNN STATUS MAPPING ERROR

The device cannot access zero-copy memory to report kernel errors.

## 3.2.71. cudnnReduceTensor()

cudnnStatus\_t cudnnReduceTensor(

```
cudnnHandle t
                               reduceTensorDesc,
                                indicesSizeInBytes,
size t
void
                              *workspace,
                               workspaceSizeInBytes,
size t
const void
                               *alpha,
const cudnnTensorDescriptor_t
                                aDesc,
const void
                               *A,
const void
                               *beta,
const cudnnTensorDescriptor t
                               cDesc,
                               *C)
```

This function reduces tensor A by implementing the equation C = alpha \* reduce op ( A ) + beta \* C, given tensors A and C and scaling factors alpha and beta. The reduction op to use is indicated by the descriptor reduceTensorDesc. Currently-supported ops are listed by the cudnnReduceTensorOp t enum.

Each dimension of the output tensor c must match the corresponding dimension of the input tensor A or must be equal to 1. The dimensions equal to 1 indicate the dimensions of A to be reduced.

The implementation will generate indices for the min and max ops only, as indicated by the cudnnReduceTensorIndices t enum of the reduceTensorDesc. Requesting indices for the other reduction ops results in an error. The data type of the indices is indicated by the cudnnIndicesType t enum; currently only the 32-bit (unsigned int) type is supported.

The indices returned by the implementation are not absolute indices but relative to the dimensions being reduced. The indices are also flattened, meaning, not coordinate tuples.

The data types of the tensors A and C must match if of type double. In this case, alpha and beta and the computation enum of reduceTensorDesc are all assumed to be of type double.

The HALF and INT8 data types may be mixed with the FLOAT data types. In these cases, the computation enum of reduceTensorDesc is required to be of type FLOAT.



#### Note:

Up to dimension 8, all tensor formats are supported. Beyond those dimensions, this routine is not supported.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### reduceTensorDesc

Input. Handle to a previously initialized reduce tensor descriptor.

#### indices

Output. Handle to a previously allocated space for writing indices.

#### indicesSizeInBytes

*Input.* Size of the above previously allocated space.

#### workspace

Input. Handle to a previously allocated space for the reduction implementation.

## workspaceSizeInBytes

*Input*. Size of the above previously allocated space.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the source value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

## aDesc, cDesc

*Input.* Handle to a previously initialized tensor descriptor.

Α

*Input.* Pointer to data of the tensor described by the aDesc descriptor.

С

Input/Output. Pointer to data of the tensor described by the cDesc descriptor.

#### Returns

## CUDNN STATUS SUCCESS

The function executed successfully.

## CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

- ▶ The dimensions of the input tensor and the output tensor are above 8.
- reduceTensorCompType is not set as stated above.

## CUDNN\_STATUS\_BAD\_PARAM

The corresponding dimensions of the input and output tensors all match, or the conditions in the above paragraphs are unmet.

## CUDNN INVALID VALUE

The allocations for the indices or workspace are insufficient.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## 3.2.72. cudnnRestoreAlgorithm()

This function has been deprecated in cuDNN 8.0.

cudnnStatus t cudnnRestoreAlgorithm(

```
cudnnHandle t
                            handle,
void*
                            algoSpace,
                            algoSpaceSizeInBytes,
size t
cudnnAlgorithmDescriptor t algoDesc)
```

This function reads algorithm metadata from the host memory space provided by the user in algoSpace, allowing the user to use the results of RNN finds from previous cuDNN sessions.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### algoDesc

*Input.* A previously created algorithm descriptor.

#### algoSpace

*Input.* Pointer to the host memory to be read.

#### algoSpaceSizeInBytes

Input. Amount of host memory needed as a workspace to be able to hold the metadata from the specified algoDesc.

## Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The metadata is from a different cuDNN version.

## CUDNN STATUS BAD PARAM

At least one of the following conditions is met:

- ▶ One of the arguments is NULL.
- ► The metadata is corrupted.

## cudnnRestoreDropoutDescriptor()

```
cudnnStatus t cudnnRestoreDropoutDescriptor(
   cudnnDropoutDescriptor_t dropoutDesc,
   cudnnHandle t
                            handle,
   float
                            dropout,
   void
                            *states,
   size t
                             stateSizeInBytes,
   unsigned long long
                             seed)
```

This function restores a dropout descriptor to a previously saved-off state.

## **Parameters**

## dropoutDesc

*Input/Output*. Previously created dropout descriptor.

#### handle

*Input.* Handle to a previously created cuDNN context.

#### dropout

Input. Probability with which the value from an input tensor is set to 0 when performing dropout.

#### states

Input. Pointer to GPU memory that holds random number generator states initialized by a prior call to <a href="mailto:cudnnSetDropoutDescriptor">cudnnSetDropoutDescriptor</a>().

#### stateSizeInBytes

Input. Size in bytes of buffer holding random number generator states.

#### seed

Input. Seed used in prior call to cudnnSetDropoutDescriptor() that initialized states buffer. Using a different seed from this has no effect. A change of seed, and subsequent update to random number generator states can be achieved by calling cudnnSetDropoutDescriptor().

#### Returns

#### CUDNN STATUS SUCCESS

The call was successful.

## CUDNN STATUS INVALID VALUE

States buffer size (as indicated in stateSizeInBytes) is too small.

## 3.2.74. cudnnSaveAlgorithm()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnSaveAlgorithm(
   cudnnHandle t
                            handle,
   cudnnAlgorithmDescriptor_t algoDesc,
                             algoSpace
   void*
   size t
                             algoSpaceSizeInBytes)
```

This function writes algorithm metadata into the host memory space provided by the user in algoSpace, allowing the user to preserve the results of RNN finds after cuDNN exits.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### algoDesc

*Input*. A previously created algorithm descriptor.

## algoSpace

*Input*. Pointer to the host memory to be written.

#### algoSpaceSizeInBytes

Input. Amount of host memory needed as a workspace to be able to save the metadata from the specified algoDesc.

## Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS BAD PARAM

At least one of the following conditions is met:

- ▶ One of the arguments is NULL.
- algoSpaceSizeInBytes is too small.

#### 3.2.75. cudnnScaleTensor()

```
cudnnStatus_t cudnnScaleTensor(
   cudnnHandle t
                                     handle,
   const cudnnTensorDescriptor t
                                     yDesc,
                                    *y,
   void
   const void
                                    *alpha)
```

This function scales all the elements of a tensor by a given factor.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### yDesc

*Input*. Handle to a previously initialized tensor descriptor.

У

Input/Output. Pointer to data of the tensor described by the yDesc descriptor.

#### alpha

Input. Pointer in the host memory to a single value that all elements of the tensor will be scaled with. For more information, see <u>Scaling Parameters</u> in the cuDNN Developer Guide.

#### Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS BAD PARAM

One of the provided pointers is nil.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## 3.2.76. cudnnSetActivationDescriptor()

```
cudnnStatus_t cudnnSetActivationDescriptor(
    cudnnActivationDescriptor_t
cudnnActivationMode_t
activationDesc,
mode,
    cudnnNanPropagation t
                                           reluNanOpt,
   double
                                           coef)
```

This function initializes a previously created generic activation descriptor object.

#### **Parameters**

#### activationDesc

Input/Output. Handle to a previously created pooling descriptor.

#### mode

Input. Enumerant to specify the activation mode.

#### reluNanOpt

Input. Enumerant to specify the Nan propagation mode.

#### coef

Input. Floating point number. When the activation mode (see <u>cudnnActivationMode t</u>) is set to CUDNN ACTIVATION CLIPPED RELU, this input specifies the clipping threshold; and when the activation mode is set to CUDNN ACTIVATION RELU, this input specifies the upper bound.

## Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

#### CUDNN STATUS BAD PARAM

mode or reluNanOpt has an invalid enumerant value.

# 3.2.77. cudnnSetAlgorithmDescriptor()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnSetAlgorithmDescriptor(
   cudnnAlgorithmDescriptor t
                                    algorithmDesc,
                                    algorithm)
   cudnnAlgorithm t
```

This function initializes a previously created generic algorithm descriptor object.

## **Parameters**

#### algorithmDesc

Input/Output. Handle to a previously created algorithm descriptor.

## algorithm

Input. Struct to specify the algorithm.

## Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## cudnnSetAlgorithmPerformance()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnSetAlgorithmPerformance(
    cudnnAlgorithmPerformance t
                                     algoPerf,
    cudnnAlgorithmDescriptor t
                                     algoDesc,
   cudnnStatus t
                                     status,
   float
                                     time,
   size t
                                     memory)
```

This function initializes a previously created generic algorithm performance object.

## **Parameters**

#### algoPerf

*Input/Output*. Handle to a previously created algorithm performance object.

## algoDesc

*Input*. The algorithm descriptor which the performance results describe.

#### status

Input. The cuDNN status returned from running the algoDesc algorithm.

#### time

Input. The GPU time spent running the algoDesc algorithm.

#### memory

Input. The GPU memory needed to run the algoDesc algorithm.

## Returns

#### CUDNN STATUS SUCCESS

The object was set successfully.

```
CUDNN STATUS BAD PARAM
```

mode or reluNanOpt has an invalid enumerate value.

#### 3 2 79 cudnnSetCallback()

```
cudnnStatus t cudnnSetCallback(
       unsigned
                         *udata,
       cudnnCallback t fptr)
```

This function sets the internal states of cuDNN error reporting functionality.

#### **Parameters**

#### mask

Input. An unsigned integer. The four least significant bits (LSBs) of this unsigned integer are used for switching on and off the different levels of error reporting messages. This applies for both the default callbacks, and for the customized callbacks. The bit position is in correspondence with the enum of cudnnseverity t. The user may utilize the predefined macros CUDNN SEV ERROR EN, CUDNN SEV WARNING EN, and CUDNN SEV INFO EN to form the bit mask. When a bit is set to 1, the corresponding message channel is enabled.

For example, when bit 3 is set to 1, the API logging is enabled. Currently, only the log output of level CUDNN SEV INFO is functional; the others are not yet implemented. When used for turning on and off the logging with the default callback, the user may pass NULL to udata and fptr. In addition, the environment variable CUDNN LOGDEST DBG must be set. For more information, see the Backward compatibility and deprecation policy section in the cuDNN Developer Guide.

- CUDNN SEV INFO EN= 0b1000 (functional).
- CUDNN SEV ERROR EN= 0b0010 (not yet functional).
- CUDNN SEV WARNING EN= 0b0100 (not yet functional).

The output of CUDNN SEV FATAL is always enabled and cannot be disabled.

#### udata

Input. A pointer provided by the user. This pointer will be passed to the user's custom logging callback function. The data it points to will not be read, nor be changed by cuDNN. This pointer may be used in many ways, such as in a mutex or in a communication socket for the user's callback function for logging. If the user is utilizing the default callback

function, or doesn't want to use this input in the customized callback function, they may pass in NULL.

## fptr

Input. A pointer to a user-supplied callback function. When NULL is passed to this pointer, then cuDNN switches back to the built-in default callback function. The user-supplied callback function prototype must be similar to the following (also defined in the header file): void customizedLoggingCallback (cudnnSeverity t sev, void \*udata, const

- The structure cudnnDebug t is defined in the header file. It provides the metadata, such as time, time since start, stream ID, process and thread ID, that the user may choose to print or store in their customized callback.
- The variable msg is the logging message generated by cuDNN. Each line of this message is terminated by \0, and the end of the message is terminated by \0\0. Users may select what is necessary to show in the log, and may reformat the string.

#### Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

cudnnDebug t \*dbg, const char \*msg);

#### 3.2.80. cudnnSetDropoutDescriptor()

```
cudnnStatus t cudnnSetDropoutDescriptor(
   cudnnDropoutDescriptor_t dropoutDesc,
   cudnnHandle t
                              handle,
   float
                              dropout,
   void
                             *states,
   size t
                              stateSizeInBytes,
   unsigned long long
```

This function initializes a previously created dropout descriptor object. If the states argument is equal to NULL, then the random number generator states won't be initialized, and only the dropout value will be set. No other function should be writing to the memory pointed at by the states argument while this function is running. The user is expected not to change the memory pointed at by states for the duration of the computation.

#### **Parameters**

#### dropoutDesc

*Input/Output*. Previously created dropout descriptor object.

#### handle

*Input.* Handle to a previously created cuDNN context.

## dropout

*Input*. The probability with which the value from input is set to zero during the dropout layer.

#### states

Output. Pointer to user-allocated GPU memory that will hold random number generator states.

## stateSizeInBytes

*Input.* Specifies the size in bytes of the provided memory for the states.

#### seed

*Input.* Seed used to initialize random number generator states.

#### Returns

## CUDNN STATUS SUCCESS

The call was successful.

## CUDNN STATUS INVALID VALUE

sizeInBytes is less than the value returned by <a href="mailto:cudnnDropoutGetStatesSize">cudnnDropoutGetStatesSize()</a>.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## cudnnSetFilter4dDescriptor()

```
cudnnStatus t cudnnSetFilter4dDescriptor(
   cudnnFilterDescriptor t filterDesc,
                              dataType,
   cudnnDataType t
   cudnnTensorFormat t
                             format,
                              k,
   int
                              c,
   int
                               h,
```

This function initializes a previously created filter descriptor object into a 4D filter. The layout of the filters must be contiquous in memory.

Tensor format CUDNN TENSOR NHWC has limited support in cudnnConvolutionForward(), cudnnConvolutionBackwardData(), and cudnnConvolutionBackwardFilter().

#### **Parameters**

#### filterDesc

*Input/Output*. Handle to a previously created filter descriptor.

#### datatype

Input. Data type.

#### format.

Input. Type of the filter layout format. If this input is set to CUDNN TENSOR NCHW, which is one of the enumerant values allowed by cudnnTensorFormat t descriptor, then the layout of the filter is in the form of KCRS. where:

- ▶ K represents the number of output feature maps
- c is the number of input feature maps
- R is the number of rows per filter
- s is the number of columns per filter

If this input is set to CUDNN TENSOR NHWC, then the layout of the filter is in the form of KRSC. For more information, see cudnnTensorFormat t.

k

Input. Number of output feature maps.

С

Input. Number of input feature maps.

h

Input. Height of each filter.

Input. Width of each filter.

#### Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN STATUS BAD PARAM

At least one of the parameters k, c, h, w is negative or dataType or format has an invalid enumerant value.

#### 3.2.82. cudnnSetFilterNdDescriptor()

```
cudnnStatus_t cudnnSetFilterNdDescriptor(
  cudnnFilterDescriptor_t filterDesc,
  filterDimA[])
```

This function initializes a previously created filter descriptor object. The layout of the filters must be contiguous in memory.

The tensor format CUDNN TENSOR NHWC has limited support in <u>cudnnConvolutionForward()</u>, cudnnConvolutionBackwardData(), and cudnnConvolutionBackwardFilter().

## **Parameters**

#### filterDesc

*Input/Output*. Handle to a previously created filter descriptor.

#### datatype

Input. Data type.

#### format

Input. Type of the filter layout format. If this input is set to CUDNN TENSOR NCHW, which is one of the enumerant values allowed by cudnnTensorFormat t descriptor, then the layout of the filter is as follows:

- For N=4, a 4D filter descriptor, the filter layout is in the form of KCRS:
  - ► K represents the number of output feature maps
  - c is the number of input feature maps
  - R is the number of rows per filter
  - s is the number of columns per filter
- ► For N=3, a 3D filter descriptor, the number s (number of columns per filter) is omitted.
- For N=5 and greater, the layout of the higher dimensions immediately follows RS.

On the other hand, if this input is set to CUDNN TENSOR NHWC, then the layout of the filter is as follows:

- ► For N=4, a 4D filter descriptor, the filter layout is in the form of KRSC.
- ► For N=3, a 3D filter descriptor, the number s (number of columns per filter) is omitted and the layout of c immediately follows R.
- ► For N=5 and greater, the layout of the higher dimensions are inserted between s and c. For more information, see cudnnTensorFormat t.

#### nbDims

Input. Dimension of the filter.

#### filterDimA

Input. Array of dimension nbDims containing the size of the filter for each dimension.

## Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN STATUS BAD PARAM

At least one of the elements of the array filterDimA is negative or dataType or format has an invalid enumerant value.

## CUDNN STATUS NOT SUPPORTED

The parameter nbDims exceeds CUDNN DIM MAX.

## 3.2.83. cudnnSetLRNDescriptor()

```
cudnnStatus t cudnnSetLRNDescriptor(
   cudnnLRNDescriptor_t normDesc,
    unsigned
                           lrnN,
   double
                           lrnAlpha.
   double
                           lrnBeta,
   double
                           1rnK)
```

This function initializes a previously created LRN descriptor object.



#### Note:

- Macros Cudnn LRN MIN N, CUDNN LRN MAX N, CUDNN LRN MIN K, CUDNN LRN MIN BETA defined in cudnn.h specify valid ranges for parameters.
- Values of double parameters will be cast down to the tensor datatype during computation.

#### **Parameters**

#### normDesc

Output. Handle to a previously created LRN descriptor.

#### 1rnN

Input. Normalization window width in elements. The LRN layer uses a window [centerlookBehind, center+lookAhead], Where lookBehind = floor( (lrnN-1)/2 ), lookAhead = lrnN-lookBehind-1. So for n=10, the window is [k-4...k...k+5] with a total of 10 samples. For the DivisiveNormalization layer, the window has the same extents as above in all spatial dimensions (dimA[2], dimA[3], dimA[4]). By default, 1rnN is set to 5 in cudnnCreateLRNDescriptor().

#### lrnAlpha

*Input.* Value of the alpha variance scaling parameter in the normalization formula. Inside the library code, this value is divided by the window width for LRN and by (window width) ^#spatialDimensions for DivisiveNormalization. By default, this value is set to 1e-4 in cudnnCreateLRNDescriptor().

#### 1rnBeta

Input. Value of the beta power parameter in the normalization formula. By default, this value is set to 0.75 in cudnnCreateLRNDescriptor().

#### lrnK

Input. Value of the k parameter in the normalization formula. By default, this value is set to 2.0.

#### Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

#### CUDNN STATUS BAD PARAM

One of the input parameters was out of valid range as described above.

#### 3.2.84. cudnnSetOpTensorDescriptor()

```
cudnnStatus t cudnnSetOpTensorDescriptor(
     cudnnOpTensorDescriptor_t opTensorDesc,
     cudnnOpTensorOp_topTensorOp,cudnnDataType_topTensorOp,cudnnNanPropagation_topTensorCompTypopTensorNanOpt)
                                             opTensorCompType,
```

This function initializes a tensor pointwise math descriptor.

#### **Parameters**

#### opTensorDesc

Output. Pointer to the structure holding the description of the tensor pointwise math descriptor.

#### opTensorOp

Input. Tensor pointwise math operation for this tensor pointwise math descriptor.

#### opTensorCompType

*Input*. Computation datatype for this tensor pointwise math descriptor.

#### opTensorNanOpt

Input. NAN propagation policy.

## Returns

#### CUDNN STATUS SUCCESS

The function returned successfully.

## CUDNN STATUS BAD PARAM

At least one of the input parameters passed is invalid.

## 3.2.85. cudnnSetPooling2dDescriptor()

```
cudnnStatus t cudnnSetPooling2dDescriptor(
    cudnnPoolingDescriptor_t poolingDesc,
    cudnnPoolingMode t
   cudnnPoolingMode_t mode, cudnnNanPropagation_t maxpoolingNanOpt,
                                  mode,
    int
                                  windowHeight,
   int
                                  windowWidth,
    int
                                  verticalPadding,
                                  horizontal Padding,
    int
    int
                                  verticalStride,
                                  horizontalStride)
```

This function initializes a previously created generic pooling descriptor object into a 2D description.

## **Parameters**

## poolingDesc

*Input/Output*. Handle to a previously created pooling descriptor.

#### mode

Input. Enumerant to specify the pooling mode.

## maxpoolingNanOpt

Input. Enumerant to specify the Nan propagation mode.

## windowHeight

Input. Height of the pooling window.

#### windowWidth

Input. Width of the pooling window.

## verticalPadding

Input. Size of vertical padding.

#### horizontalPadding

Input. Size of horizontal padding

#### verticalStride

Input. Pooling vertical stride.

## horizontalStride

Input. Pooling horizontal stride.

## Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN STATUS BAD PARAM

At least one of the parameters windowHeight, windowWidth, verticalStride, horizontalStride is negative or mode or maxpoolingNanOpt has an invalid enumerate value.

## 3.2.86. cudnnSetPoolingNdDescriptor()

```
cudnnStatus t cudnnSetPoolingNdDescriptor(
   cudnnPoolingDescriptor t
                                poolingDesc,
   const cudnnPoolingMode t
                                mode,
   const cudnnNanPropagation t maxpoolingNanOpt,
   int
                                 nbDims,
   const int
                                 windowDimA[],
   const int
                                 paddingA[],
   const int
                                 strideA[])
```

This function initializes a previously created generic pooling descriptor object.

## **Parameters**

#### poolingDesc

Input/Output. Handle to a previously created pooling descriptor.

#### mode

*Input*. Enumerant to specify the pooling mode.

## maxpoolingNanOpt

Input. Enumerant to specify the Nan propagation mode.

## nbDims

*Input.* Dimension of the pooling operation. Must be greater than zero.

## windowDimA

Input. Array of dimension nbDims containing the window size for each dimension. The value of array elements must be greater than zero.

## paddingA

Input. Array of dimension nbDims containing the padding size for each dimension. Negative padding is allowed.

#### strideA

Input. Array of dimension nbDims containing the striding size for each dimension. The value of array elements must be greater than zero (meaning, negative striding size is not allowed).

## Returns

#### CUDNN STATUS SUCCESS

The object was initialized successfully.

## CUDNN STATUS NOT SUPPORTED

If (nbDims > CUDNN DIM MAX-2).

## CUDNN\_STATUS\_BAD\_PARAM

Either nbDims, or at least one of the elements of the arrays windowDimA or strideA is negative, or mode or maxpoolingNanOpt has an invalid enumerate value.

# 3.2.87. cudnnSetReduceTensorDescriptor()

```
cudnnStatus t cudnnSetReduceTensorDescriptor(
          cudnnReduceTensorDescriptor_t reduceTensorDesc,

      cudnnReduceTensorDescriptor_t
      reduceTensorOps

      cudnnDataType_t
      reduceTensorCompType,

      cudnnNanPropagation_t
      reduceTensorNanOpt,

      cudnnReduceTensorIndices_t
      reduceTensorIndices,

      cudnnIndicesType_t
      reduceTensorIndicesType)
```

This function initializes a previously created reduce tensor descriptor object.

## **Parameters**

#### reduceTensorDesc

*Input/Output*. Handle to a previously created reduce tensor descriptor.

## reduceTensorOp

*Input*. Enumerant to specify the reduce tensor operation.

#### reduceTensorCompType

Input. Enumerant to specify the computation datatype of the reduction.

#### reduceTensorNanOpt

Input. Enumerant to specify the Nan propagation mode.

#### reduceTensorIndices

*Input*. Enumerant to specify the reduced tensor indices.

## reduceTensorIndicesType

*Input*. Enumerant to specify the reduce tensor indices type.

## Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

#### CUDNN STATUS BAD PARAM

reduceTensorDesc is NULL (reduceTensorOp, reduceTensorCompType, reduceTensorNanOpt, reduceTensorIndices OF reduceTensorIndicesType has an invalid enumerant value).

#### 3.2.88. cudnnSetSpatialTransformerNdDescriptor()

```
cudnnStatus t cudnnSetSpatialTransformerNdDescriptor(
    cudnnSpatialTransformerDescriptor t
   cudnnSamplerType_t
                                             samplerType,
   cudnnDataType t
                                             dataType,
    const int
                                             nbDims,
   const int
                                             dimA[])
```

This function initializes a previously created generic spatial transformer descriptor object.

## **Parameters**

#### stDesc

Input/Output. Previously created spatial transformer descriptor object.

#### samplerType

*Input*. Enumerant to specify the sampler type.

#### dataType

Input. Data type.

#### nbDims

*Input*. Dimension of the transformed tensor.

#### dimA

Input. Array of dimension nbDims containing the size of the transformed tensor for every dimension

## Returns

## CUDNN STATUS SUCCESS

The call was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ Either stDesc or dimA is NULL.
- Either dataType or samplerType has an invalid enumerant value

#### 3.2.89. cudnnSetStream()

```
cudnnStatus t cudnnSetStream(
     cudnnHandle_t handle,
cudaStream_t streamId)
```

This function sets the user's CUDA stream in the cuDNN handle. The new stream will be used to launch cuDNN GPU kernels or to synchronize to this stream when cuDNN kernels are launched in the internal streams. If the cuDNN library stream is not set, all kernels use the default (NULL) stream. Setting the user stream in the cuDNN handle guarantees the issueorder execution of cuDNN calls and other GPU kernels launched in the same stream.

#### **Parameters**

#### handle

Input. Pointer to the cuDNN handle.

#### streamID

Input. New CUDA stream to be written to the cuDNN handle.

## Returns

## CUDNN STATUS BAD PARAM

Invalid (NULL) handle.

## CUDNN STATUS MAPPING ERROR

Mismatch between the user stream and the cuDNN handle context.

#### CUDNN STATUS SUCCESS

The new stream was set successfully.

## 3.2.90. cudnnSetTensor()

```
cudnnStatus t cudnnSetTensor(
                                     handle,
   cudnnHandle t
    const cudnnTensorDescriptor t
                                    yDesc,
    void
                                    *valuePtr)
   const void
```

This function sets all the elements of a tensor to a given value.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### yDesc

*Input.* Handle to a previously initialized tensor descriptor.

У

Input/Output. Pointer to data of the tensor described by the yDesc descriptor.

#### valuePtr

Input. Pointer in host memory to a single value. All elements of the y tensor will be set to value[0]. The data type of the element in value[0] has to match the data type of tensor y.

## Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

#### CUDNN STATUS BAD PARAM

One of the provided pointers is nil.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## cudnnSetTensor4dDescriptor()

```
cudnnStatus_t cudnnSetTensor4dDescriptor(
    cudnnTensorDescriptor_t tensorDesc,
    cudnnTensorFormat_t
                            format,
   cudnnDataType_t
                            dataType,
   int
   int
                             c,
    int
                             h,
   int
```

This function initializes a previously created generic tensor descriptor object into a 4D tensor. The strides of the four dimensions are inferred from the format parameter and set in such a way that the data is contiquous in memory with no padding between dimensions.



Note: The total size of a tensor including the potential padding between dimensions is limited to 2 Giga-elements of type datatype.

## **Parameters**

#### tensorDesc

Input/Output. Handle to a previously created tensor descriptor.

#### format

*Input*. Type of format.

#### datatype

Input. Data type.

n

Input. Number of images.

*Input.* Number of feature maps per image.

h

Input. Height of each feature map.

*Input*. Width of each feature map.

#### Returns

#### CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN STATUS BAD PARAM

At least one of the parameters n, c, h, w was negative or format has an invalid enumerant value or dataType has an invalid enumerant value.

## CUDNN STATUS NOT SUPPORTED

The total size of the tensor descriptor exceeds the maximum limit of 2 Giga-elements.

## cudnnSetTensor4dDescriptorEx()

```
cudnnStatus t cudnnSetTensor4dDescriptorEx(
   cudnnTensorDescriptor_t
                               tensorDesc,
    cudnnDataType_t
                                dataType,
    int
                                n,
   int
```

int	h,	
int	W,	
int	nStride,	
int	cStride,	
int	hStride,	
int	wStride)	

This function initializes a previously created generic tensor descriptor object into a 4D tensor, similarly to cudnnSetTensor4dDescriptor() but with the strides explicitly passed as parameters. This can be used to lay out the 4D tensor in any order or simply to define gaps between dimensions.



#### Note:

- At present, some cuDNN routines have limited support for strides. Those routines will return CUDNN STATUS NOT SUPPORTED if a 4D tensor object with an unsupported stride is used. cudnnTransformTensor() can be used to convert the data to a supported layout.
- The total size of a tensor including the potential padding between dimensions is limited to 2 Giga-elements of type datatype.

## **Parameters**

#### tensorDesc

*Input/Output*. Handle to a previously created tensor descriptor.

#### datatype

Input. Data type.

n

Input. Number of images.

С

*Input.* Number of feature maps per image.

h

Input. Height of each feature map.

Input. Width of each feature map.

#### nStride

Input. Stride between two consecutive images.

## cStride

Input. Stride between two consecutive feature maps.

#### hStride

Input. Stride between two consecutive rows.

#### wStride

Input. Stride between two consecutive columns.

#### Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN\_STATUS\_BAD\_PARAM

At least one of the parameters n, c, h, w or nStride, cStride, hStride, wStride is negative or dataType has an invalid enumerant value.

## CUDNN STATUS NOT SUPPORTED

The total size of the tensor descriptor exceeds the maximum limit of 2 Giga-elements.

## 3.2.93. cudnnSetTensorNdDescriptor()

```
cudnnStatus_t cudnnSetTensorNdDescriptor(
   cudnnTensorDescriptor_t tensorDesc,
   cudnnDataType_t
                           dataType,
   int
                           nbDims,
   const int
                            dimA[],
   const int
                           strideA[])
```

This function initializes a previously created generic tensor descriptor object.



Note: The total size of a tensor including the potential padding between dimensions is limited to 2 Giga-elements of type datatype. Tensors are restricted to having at least 4 dimensions, and at most CUDNN DIM MAX dimensions (defined in cudnn.h). When working with lower dimensional data, it is recommended that the user create a 4D tensor, and set the size along unused dimensions to 1.

## **Parameters**

#### tensorDesc

*Input/Output*. Handle to a previously created tensor descriptor.

#### datatype

Input. Data type.

#### nbDims

*Input.* Dimension of the tensor.



Note: Do not use 2 dimensions. Due to historical reasons, the minimum number of dimensions in the filter descriptor is three. For more information, see cudnnGetRNNLinLayerBiasParams().

#### dimA

Input. Array of dimension nbDims that contain the size of the tensor for every dimension. The size along unused dimensions should be set to 1. By convention, the ordering of

dimensions in the array follows the format - [N, C, D, H, W], with W occupying the smallest index in the array.

#### strideA

Input. Array of dimension nbDims that contain the stride of the tensor for every dimension. By convention, the ordering of the strides in the array follows the format - [Nstride, Cstride, Dstride, Hstride, Wstride], with Wstride occupying the smallest index in the array.

## Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN STATUS BAD PARAM

At least one of the elements of the array dimA was negative or zero, or dataType has an invalid enumerant value.

## CUDNN STATUS NOT SUPPORTED

The parameter nbDims is outside the range [4, CUDNN\_DIM\_MAX], or the total size of the tensor descriptor exceeds the maximum limit of 2 Giga-elements.

## 3.2.94. cudnnSetTensorNdDescriptorEx()

```
cudnnStatus_t cudnnSetTensorNdDescriptorEx(
    cudnnTensorDescriptor_t tensorDesc,
    cudnnTensorFormat_t format,
    cudnnDataType_t dataType,
    int nbDims,
    const int dimA[])
```

This function initializes an n-D tensor descriptor.

## **Parameters**

#### tensorDesc

Output. Pointer to the tensor descriptor struct to be initialized.

#### format

Input. Tensor format.

#### dataType

Input. Tensor data type.

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#### nbDims

Input. Dimension of the tensor.



Note: Do not use 2 dimensions. Due to historical reasons, the minimum number of dimensions in the filter descriptor is three. For more information, see cudnnGetRNNLinLayerBiasParams().

#### dimA

*Input*. Array containing the size of each dimension.

## Returns

## CUDNN STATUS SUCCESS

The function was successful.

#### CUDNN STATUS BAD PARAM

Tensor descriptor was not allocated properly; or input parameters are not set correctly.

## CUDNN\_STATUS\_NOT SUPPORTED

Dimension size requested is larger than maximum dimension size supported.

## 3.2.95. cudnnSetTensorTransformDescriptor()

```
cudnnStatus t cudnnSetTensorTransformDescriptor(
cudnnTensorTransformDescriptor_t transformDesc,
const uint32 t nbDims,
const cudnnTensorFormat t destFormat,
const int32_t padBeforeA[],
const int32 t padAfterA[],
const uint32 t foldA[],
const cudnnFoldingDirection t direction);
```

This function initializes a tensor transform descriptor that was previously created using the <u>cudnnCreateTensorTransformDescriptor()</u> function.

## **Parameters**

#### transformDesc

Output. The tensor transform descriptor to be initialized.

#### nbDims

Input. The dimensionality of the transform operands. Must be greater than 2. For more information, see the Tensor Descriptor section from the cuDNN Developer Guide.

#### destFormat

*Input*. The desired destination format.

#### padBeforeA[]

Input. An array that contains the amount of padding that should be added before each dimension. Set to NULL for no padding.

## padAfterA[]

Input. An array that contains the amount of padding that should be added after each dimension. Set to NULL for no padding.

#### foldA[]

Input. An array that contains the folding parameters for each spatial dimension (dimensions 2 and up). Set to NULL for no folding.

#### direction

Input. Selects folding or unfolding. This input has no effect when folding parameters are all <= 1. For more information, see <a href="mailto:cudnnFoldingDirection">cudnnFoldingDirection</a> t.

## Returns

## CUDNN STATUS SUCCESS

The function was launched successfully.

#### CUDNN STATUS BAD PARAM

The parameter transformDesc is NULL, or if direction is invalid, or nbDims is <= 2.

#### CUDNN STATUS NOT SUPPORTED

If the dimension size requested is larger than maximum dimension size supported (meaning, one of the nbDims is larger than CUDNN DIM MAX), or if destFromat is something other than NCHW or NHWC.

# 3.2.96. cudnnSoftmaxForward()

```
cudnnStatus t cudnnSoftmaxForward(
                                  handle,
algorithm,
mode,
   cudnnHandle_t
   cudnnSoftmaxAlgorithm t
   cudnnSoftmaxMode_t
                                  *alpha,
   const void
   const cudnnTensorDescriptor t xDesc,
   const void
                                   *x,
   const void
                                   *beta,
   const cudnnTensorDescriptor t
                                   yDesc,
```

This routine computes the softmax function.



Note: All tensor formats are supported for all modes and algorithms with 4 and 5D tensors. Performance is expected to be highest with NCHW fully-packed tensors. For more than 5 dimensions tensors must be packed in their spatial dimensions

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### algorithm

*Input*. Enumerant to specify the softmax algorithm.

#### mode

*Input*. Enumerant to specify the softmax mode.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see the Scaling Parameters section in the cuDNN Developer Guide.

#### xDesc

*Input*. Handle to the previously initialized input tensor descriptor.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

*Input.* Handle to the previously initialized output tensor descriptor.

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

#### Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- The dimensions n, c, h, w of the input tensor and output tensors differ.
- ▶ The datatype of the input tensor and output tensors differ.
- The parameters algorithm or mode have an invalid enumerant value.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 3.2.97. cudnnSpatialTfGridGeneratorForward()

```
cudnnStatus t cudnnSpatialTfGridGeneratorForward(
    cudnnHandle t
                                                 handle,
    const cudnnSpatialTransformerDescriptor t
                                                 stDesc,
                                                *theta,
                                                *grid)
```

This function generates a grid of coordinates in the input tensor corresponding to each pixel from the output tensor.



Note: Only 2d transformation is supported.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

Input. Previously created spatial transformer descriptor object.

#### theta

Input. Affine transformation matrix. It should be of size n\*2\*3 for a 2d transformation, where n is the number of images specified in stDesc.

## grid

Output. A grid of coordinates. It is of size n\*h\*w\*2 for a 2d transformation, where n, h, w is specified in stDesc. In the 4th dimension, the first coordinate is x, and the second coordinate is y.

## Returns

#### CUDNN STATUS SUCCESS

The call was successful.

#### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is NULL.
- ▶ One of the parameters grid or theta is NULL.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

► The dimension of the transformed tensor specified in stDesc > 4.

#### CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## 3.2.98. cudnnSpatialTfSamplerForward()

This function performs a sampler operation and generates the output tensor using the grid given by the grid generator.



Note: Only 2d transformation is supported.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

#### stDesc

Input. Previously created spatial transformer descriptor object.

#### alpha, beta

*Input*. Pointers to scaling factors (in host memory) used to blend the source value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*srcValue + beta[0]*priorDstValue
```

For more information, see the <u>Scaling Parameters</u> section in the *cuDNN Developer Guide*.

#### xDesc

*Input*. Handle to the previously initialized input tensor descriptor.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### grid

*Input*. A grid of coordinates generated by <u>cudnnSpatialTfGridGeneratorForward()</u>.

#### yDesc

*Input.* Handle to the previously initialized output tensor descriptor.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

#### Returns

## CUDNN STATUS SUCCESS

The call was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is NULL.
- One of the parameters x, y or grid is NULL.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

► The dimension of transformed tensor > 4.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## cudnnTransformFilter()

```
cudnnStatus_t cudnnTransformTensorEx(
  cudnnHandle_t handle,
 const cudnnTensorTransformDescriptor t transDesc,
 const void *alpha,
 const cudnnFilterDescriptor t srcDesc,
const void *srcData,
const void *beta,
 const cudnnFilterDescriptor t destDesc,
void *destData);
```

This function converts the filter between different formats, data types, or dimensions based on the described transformation. It can be used to convert a filter with an unsupported layout format to a filter with a supported layout format.

This function copies the scaled data from the input filter srcDesc to the output tensor destDesc with a different layout. If the filter descriptors of srcDesc and destDesc have different dimensions, they must be consistent with folding and padding amount and order specified in transDesc.

The srcDesc and destDesc tensors must not overlap in any way (imeaning, tensors cannot be transformed in place).



Note: When performing a folding transform or a zero-padding transform, the scaling factors (alpha, beta) should be set to (1, 0). However, unfolding transforms support any (alpha, beta) values. This function is thread safe.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### transDesc

*Input.* A descriptor containing the details of the requested filter transformation. For more information, see <u>cudnnTensorTransformDescriptor</u> t.

## alpha, beta

Input. Pointers, in the host memory, to the scaling factors used to scale the data in the input tensor srcDesc. beta is used to scale the destination tensor, while alpha is used to scale the source tensor. For more information, see the Scaling Parameters section in the cuDNN
Developer Guide

The beta scaling value is not honored in the folding and zero-padding cases. Unfolding supports any (alpha, beta).

#### srcDesc, destDesc

Input. Handles to the previously initiated filter descriptors. srcDesc and destDesc must not overlap. For more information, see  $\underline{cudnnTensorDescriptor\_t}$ .

#### srcData, destData

*Input.* Pointers, in the host memory, to the data of the tensor described by srcDesc and destDesc respectively.

## Returns

#### CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS BAD PARAM

A parameter is uninitialized or initialized incorrectly, or the number of dimensions is different between srcDesc and destDesc.

## CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration. Also, in the folding and padding paths, any value other than A=1 and B=0 will result in a CUDNN\_STATUS\_NOT\_SUPPORTED.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## 3.2.100. cudnnTransformTensor()

```
const void
                        *alpha,
const cudnnTensorDescriptor t xDesc,
const void
const void
const cudnnTensorDescriptor_t yDesc,
```

This function copies the scaled data from one tensor to another tensor with a different layout. Those descriptors need to have the same dimensions but not necessarily the same strides. The input and output tensors must not overlap in any way (meaning, tensors cannot be transformed in place). This function can be used to convert a tensor with an unsupported format to a supported one.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

# alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the source value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*srcValue + beta[0]*priorDstValue
```

For more information, see the Scaling Parameters section in the cuDNN Developer Guide.

#### xDesc

Input. Handle to a previously initialized tensor descriptor. For more information, see cudnnTensorDescriptor t.

*Input.* Pointer to data of the tensor described by the xDesc descriptor.

# **v**Desc

Input. Handle to a previously initialized tensor descriptor. For more information, see <u>cudnnTensorDescriptor</u> t.

У

*Output.* Pointer to data of the tensor described by the yDesc descriptor.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

The dimensions n, c, h, w or the dataType of the two tensor descriptors are different.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 3.2.101. cudnnTransformTensorEx()

```
cudnnStatus t cudnnTransformTensorEx(
cudnnHandle t handle,
const cudnnTensorTransformDescriptor t transDesc,
const void *alpha,
const cudnnTensorDescriptor t srcDesc,
const void *srcData,
const void *beta,
const cudnnTensorDescriptor t destDesc,
void *destData);
```

This function converts the tensor layouts between different formats. It can be used to convert a tensor with an unsupported layout format to a tensor with a supported layout format.

This function copies the scaled data from the input tensor srcDesc to the output tensor destDesc with a different layout. The tensor descriptors of srcDesc and destDesc should have the same dimensions but need not have the same strides.

The srcDesc and destDesc tensors must not overlap in any way (meaning, tensors cannot be transformed in place).



Note: When performing a folding transform or a zero-padding transform, the scaling factors (alpha, beta) should be set to (1, 0). However, unfolding transforms support any (alpha, beta) values. This function is thread safe.

## **Parameters**

# handle

Input. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

# transDesc

Input. A descriptor containing the details of the requested tensor transformation. For more information, see cudnnTensorTransformDescriptor t.

# alpha, beta

Input. Pointers, in the host memory, to the scaling factors used to scale the data in the input tensor srcDesc. beta is used to scale the destination tensor, while alpha is used to scale the source tensor. For more information, see the <u>Scaling Parameters</u> section in the *cuDNN* Developer Guide.

The beta scaling value is not honored in the folding and zero-padding cases. Unfolding supports any (alpha, beta).

#### srcDesc, destDesc

*Input*. Handles to the previously initiated tensor descriptors. srcDesc and destDesc must not overlap. For more information, see <u>cudnnTensorDescriptor</u> t.

# srcData, destData

*Input.* Pointers, in the host memory, to the data of the tensor described by srcDesc and destDesc respectively.

# Returns

# CUDNN STATUS SUCCESS

The function was launched successfully.

# CUDNN\_STATUS\_BAD\_PARAM

A parameter is uninitialized or initialized incorrectly, or the number of dimensions is different between srcDesc and destDesc.

# CUDNN\_STATUS\_NOT\_SUPPORTED

Function does not support the provided configuration. Also, in the folding and padding paths, any value other than A=1 and B=0 will result in a CUDNN\_STATUS\_NOT\_SUPPORTED.

# CUDNN STATUS EXECUTION FAILED

Function failed to launch on the GPU.

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# Chapter 4. **cudnn\_ops\_train.so**Library

# 4.1. API Functions

# 4.1.1. cudnnActivationBackward()

```
cudnnStatus t cudnnActivationBackward(
   cudnnHandle t
                                    handle,
   cudnnActivationDescriptor t
                                   activationDesc,
                                   *alpha,
   const void
   const cudnnTensorDescriptor t
                                   yDesc,
                                   *y,
   const void
   const cudnnTensorDescriptor t
                                    dyDesc,
                                   *dy,
   const void
   const cudnnTensorDescriptor t
                                   xDesc,
                                   *x,
   const void
   const void
                                   *beta,
   const cudnnTensorDescriptor t
                                   dxDesc,
                                   *dx)
```

This routine computes the gradient of a neuron activation function.



# Note:

- In-place operation is allowed for this routine; meaning dy and dx pointers may be equal. However, this requires the corresponding tensor descriptors to be identical (particularly, the strides of the input and output must match for an in-place operation to be allowed).
- All tensor formats are supported for 4 and 5 dimensions, however, the best performance is obtained when the strides of yDesc and xDesc are equal and HW-packed. For more than 5 dimensions the tensors must have their spatial dimensions packed.

### **Parameters**

# handle

*Input*. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

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#### activationDesc

*Input*. Activation descriptor. See <u>cudnnActivationDescriptor\_t</u>.

# alpha, beta

*Input*. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### yDesc

*Input*. Handle to the previously initialized input tensor descriptor. For more information, see cudnnTensorDescriptor t.

У

Input. Data pointer to GPU memory associated with the tensor descriptor yDesc.

# dyDesc

*Input*. Handle to the previously initialized input differential tensor descriptor.

dy

Input. Data pointer to GPU memory associated with the tensor descriptor dyDesc.

#### xDesc

*Input.* Handle to the previously initialized output tensor descriptor.

x

Input. Data pointer to GPU memory associated with the output tensor descriptor xDesc.

#### dxDesc

*Input.* Handle to the previously initialized output differential tensor descriptor.

dx

Output. Data pointer to GPU memory associated with the output tensor descriptor dxDesc.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

The strides nStride, cStride, hStride, wStride of the input differential tensor and output differential tensor differ and in-place operation is used.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

- ► The dimensions n, c, h, w of the input tensor and output tensor differ.
- The datatype of the input tensor and output tensor differs.
- ► The strides nStride, cStride, hStride, wStride of the input tensor and the input differential tensor differ.
- ► The strides nStride, cStride, hStride, wStride of the output tensor and the output differential tensor differ.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 4.1.2. cudnnBatchNormalizationBackward()

```
cudnnStatus t cudnnBatchNormalizationBackward(
     cudnnHandle t
     cudnnBatchNormMode t
                                     mode,
                                    *alphaDataDiff,
     const void
     const void
                                    *betaDataDiff,
     const void
                                     *alphaParamDiff,
                                    *betaParamDiff,
     const void
     const cudnnTensorDescriptor t
                                     xDesc,
                                    *x,
     const void
     const cudnnTensorDescriptor t
                                     dyDesc,
                                    *dy,
     const void
     const cudnnTensorDescriptor t
                                     dxDesc.
                                    *dx,
     const cudnnTensorDescriptor t
                                     bnScaleBiasDiffDesc,
                                    *bnScale,
     const void
                                     *resultBnScaleDiff,
     void
     void
                                    *resultBnBiasDiff,
     double
                                     epsilon,
                                    *savedMean,
     const void
                                  *savedInvVariance)
     const void
```

This function performs the backward batch normalization layer computation. This layer is based on the paper <u>Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift</u>, S. loffe, C. Szegedy, 2015.



#### Note:

- Only 4D and 5D tensors are supported.
- The epsilon value has to be the same during training, backpropagation, and inference.
- ▶ Higher performance can be obtained when HW-packed tensors are used for all of x, dy, dx.

For more information, see <u>cudnnDeriveBNTensorDescriptor()</u> for the secondary tensor descriptor generation for the parameters used in this function.

### **Parameters**

#### handle

*Input*. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

*Input*. Mode of operation (spatial or per-activation). For more information, see <u>cudnnBatchNormMode</u> t.

# \*alphaDataDiff, \*betaDataDiff

Inputs. Pointers to scaling factors (in host memory) used to blend the gradient output dx with a prior value in the destination tensor as follows:

dstValue = alphaDataDiff[0]\*resultValue + betaDataDiff[0]\*priorDstValue

For more information, see Scaling Parameters in the cuDNN Developer Guide.

### \*alphaParamDiff, \*betaParamDiff

Inputs. Pointers to scaling factors (in host memory) used to blend the gradient outputs resultBnScaleDiff and resultBnBiasDiff with prior values in the destination tensor as follows:

dstValue = alphaParamDiff[0]\*resultValue + betaParamDiff[0]\*priorDstValue

For more information, see Scaling Parameters.

# xDesc, dxDesc, dyDesc

*Inputs.* Handles to the previously initialized tensor descriptors.

#### \*x

*Input.* Data pointer to GPU memory associated with the tensor descriptor xDesc, for the layer's x data.

# \*dy

Inputs. Data pointer to GPU memory associated with the tensor descriptor dyDesc, for the backpropagated differential dy input.

#### \*dx

Inputs. Data pointer to GPU memory associated with the tensor descriptor dxDesc, for the resulting differential output with respect to x.

# bnScaleBiasDiffDesc

Input. Shared tensor descriptor for the following five tensors: bnScale, resultBnScaleDiff, resultBnBiasDiff, savedMean, savedInvVariance. The dimensions for this tensor descriptor are dependent on normalization mode. For more information, see <a href="cudnnDeriveBNTensorDescriptor">cudnnDeriveBNTensorDescriptor</a>).



**Note:** The data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

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#### \*bnScale

*Input.* Pointer in the device memory for the batch normalization scale parameter (in the original paper the quantity scale is referred to as gamma).



**Note:** The bnBias parameter is not needed for this layer's computation.

#### resultBnScaleDiff.resultBnBiasDiff

*Outputs*. Pointers in device memory for the resulting scale and bias differentials computed by this routine. Note that these scale and bias gradients are weight gradients specific to this batch normalization operation, and by definition are not backpropagated.

# epsilon

Input. Epsilon value used in batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN\_BN\_MIN\_EPSILON in cudnn.h. The same epsilon value should be used in forward and backward functions.

#### \*savedMean, \*savedInvVariance

Inputs. Optional cache parameters containing saved intermediate results that were computed during the forward pass. For this to work correctly, the layer's x and bnScale data have to remain unchanged until this backward function is called.



**Note:** Both these parameters can be NULL but only at the same time. It is recommended to use this cache since the memory overhead is relatively small.

# Supported configurations

This function supports the following combinations of data types for various descriptors.

Table 7. Supported configurations

Data Type Configurations	s xDesc	bnScaleBias <b>M</b> 0	alphaDataDiff, betaDataDiff,a betaParamDiff		dxDesc
PSEUDO_HALF_C	ONFIN_DATA_HA	LEUDNN_DATA_FL	oaudnn_data_fl	OCUDNN_DATA_HA	L <b>E</b> UDNN_DATA_HAI
FLOAT_CONFIG	CUDNN_DATA_FL	OAUDNN_DATA_FL	OAUDNN_DATA_FL	OCUDNN_DATA_FL	OCUDNN_DATA_FLO
DOUBLE_CONFIG	CUDNN_DATA_DO	UBUBNN_DATA_DO	UBUDNN_DATA_DO	UBUDNN_DATA_DO	UBUENN_DATA_DOU

# Returns

### CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- Any of the pointers alpha, beta, x, dy, dx, bnScale, resultBnScaleDiff, resultBnBiasDiff is NULL.
- The number of xDesc or yDesc or dxDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- bnScaleBiasDiffDesc dimensions are not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Exactly one of savedMean, savedInvVariance pointers is NULL.
- epsilon value is less than CUDNN BN MIN EPSILON.
- Dimensions or data types mismatch for any pair of xDesc, dyDesc, dxDesc.

#### 413 cudnnBatchNormalizationBackwardEx()

```
cudnnStatus t cudnnBatchNormalizationBackwardEx (
   cudnnHandle t
                                      handle,
   cudnnBatchNormMode t
                                       mode,
                                      bnOps,
   cudnnBatchNormOps t
   const void
                                       *alphaDataDiff,
                                       *betaDataDiff,
   const void
   const void
                                       *alphaParamDiff,
                                       *betaParamDiff,
   const void
                                      xDesc,
   const cudnnTensorDescriptor t
   const void
                                       *xData,
                                      yDesc,
   const cudnnTensorDescriptor t
   const. void
                                        *yData,
   const cudnnTensorDescriptor t
                                      dyDesc,
   const void
                                       *dyData,
   const cudnnTensorDescriptor t
                                      dzDesc,
                                       *dzData,
   const cudnnTensorDescriptor t
                                      dxDesc,
                                       *dxData,
   const cudnnTensorDescriptor t
                                      dBnScaleBiasDesc,
   const void
                                       *bnScaleData,
   const void
                                       *bnBiasData,
   void
                                       *dBnScaleData,
   void
                                       *dBnBiasData,
   double
                                      epsilon,
   const void
                                       *savedMean,
   const void
                                       *savedInvVariance,
   const cudnnActivationDescriptor t activationDesc,
                                       *workspace,
   void
   size_t
                                       workSpaceSizeInBytes
   void
                                       *reserveSpace
   size t
                                       reserveSpaceSizeInBytes);
```

This function is an extension of the cudnnBatchNormalizationBackward() for performing the backward batch normalization layer computation with a fast NHWC semi-persistent kernel. This API will trigger the new semi-persistent NHWC kernel when the following conditions are true:

- All tensors, namely, x, y, dz, dy, dx must be NHWC-fully packed, and must be of the type CUDNN DATA HALF.
- ▶ The tensor C dimension should be a multiple of 4.

- ▶ The input parameter mode must be set to CUDNN BATCHNORM SPATIAL PERSISTENT.
- workspace is not NULL.
- workSpaceSizeInBytes is equal or larger than the amount required by cudnnGetBatchNormalizationBackwardExWorkspaceSize().
- reserveSpaceSizeInBytes is equal or larger than the amount required by cudnnGetBatchNormalizationTrainingExReserveSpaceSize().
- ▶ The content in reserveSpace stored by cudnnBatchNormalizationForwardTrainingEx() must be preserved.

If workspace is NULL and workSpaceSizeInBytes of zero is passed in, this API will function exactly like the non-extended function cudnnBatchNormalizationBackward.

This workspace is not required to be clean. Moreover, the workspace does not have to remain unchanged between the forward and backward pass, as it is not used for passing any information.

This extended function can accept a \*workspace pointer to the GPU workspace, and workSpaceSizeInBytes, the size of the workspace, from the user.

The bnops input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

Only 4D and 5D tensors are supported. The epsilon value has to be the same during the training, the backpropagation, and the inference.

When the tensor layout is NCHW, higher performance can be obtained when HW-packed tensors are used for x, dy, dx.

# Parameters.

# handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

# mode

Input. Mode of operation (spatial or per-activation). For more information, see cudnnBatchNormMode t.

#### bn0ps

Input. Mode of operation. Currently, CUDNN BATCHNORM OPS BN ACTIVATION and CUDNN BATCHNORM OPS BN ADD ACTIVATION are only supported in the NHWC layout. For more information, see <a href="mailto:cudnnBatchNormOps\_t">cudnnBatchNormOps\_t</a>. This input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

# \*alphaDataDiff, \*betaDataDiff

Inputs. Pointers to scaling factors (in host memory) used to blend the gradient output dx with a prior value in the destination tensor as follows:

dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see Scaling Parameters in the cuDNN Developer Guide.

## \*alphaParamDiff, \*betaParamDiff

Inputs. Pointers to scaling factors (in host memory) used to blend the gradient outputs dBnScaleData and dBnBiasData with prior values in the destination tensor as follows: dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

# xDesc, \*x, yDesc, \*yData, dyDesc, \*dyData

Inputs. Tensor descriptors and pointers in the device memory for the layer's x data, backpropagated gradient input dy, the original forward output y data. yDesc and yData are not needed if bnops is set to CUDNN BATCHNORM OPS BN, users may pass NULL. For more information, see cudnnTensorDescriptor t.

# dzDesc, \*dzData, dxDesc, \*dxData

Outputs. Tensor descriptors and pointers in the device memory for the computed gradient output dz, and dx. dzDesc and \*dzData are not needed when bnOps is CUDNN BATCHNORM OPS BN OF CUDNN BATCHNORM OPS BN ACTIVATION, users may pass NULL. For more information, see cudnnTensorDescriptor t.

#### dBnScaleBiasDesc

Input. Shared tensor descriptor for the following six tensors: bnScaleData, bnBiasData, dBnScaleData, dBnBiasData, savedMean, and savedInvVariance. For more information, see cudnnDeriveBNTensorDescriptor().

The dimensions for this tensor descriptor are dependent on normalization mode.



Note: The data type of this tensor descriptor must be float for FP16 and FP32 input tensors and double for FP64 input tensors.

For more information, see <a href="mailto:cudnnTensorDescriptor\_t">cudnnTensorDescriptor\_t</a>.

#### \*bnScaleData

Input. Pointer in the device memory for the batch normalization scale parameter (in the <u>original paper</u> the quantity scale is referred to as gamma).

#### \*bnBiasData

Input. Pointers in the device memory for the batch normalization bias parameter (in the original paper bias is referred to as beta). This parameter is used only when activation should be performed.

#### \*dBnScaleData, dBnBiasData

Inputs. Pointers in the device memory for the gradients of bnScaleData and bnBiasData, respectively.

# epsilon

Input. Epsilon value used in batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN BN MIN EPSILON in cudnn.h. The same epsilon value should be used in forward and backward functions.

#### \*savedMean, \*savedInvVariance

Inputs. Optional cache parameters containing saved intermediate results computed during the forward pass. For this to work correctly, the layer's x and bnScaleData, bnBiasData data has to remain unchanged until this backward function is called. Note that both these parameters can be NULL but only at the same time. It is recommended to use this cache since the memory overhead is relatively small.

#### activationDesc

Input. Descriptor for the activation operation. When the bnops input is set to either CUDNN BATCHNORM OPS BN ACTIVATION OF CUDNN BATCHNORM OPS BN ADD ACTIVATION then this activation is used, otherwise user may pass NULL.

# workspace

Input. Pointer to the GPU workspace. If workspace is NULL and workSpaceSizeInBytes of zero is passed in, then this API will function exactly like the non-extended function cudnnBatchNormalizationBackward().

# workSpaceSizeInBytes

Input. The size of the workspace. It must be large enough to trigger the fast NHWC semipersistent kernel by this function.

# \*reserveSpace

*Input.* Pointer to the GPU workspace for the reserveSpace.

# reserveSpaceSizeInBytes

Input. The size of the reserveSpace. It must be equal or larger than the amount required by cudnnGetBatchNormalizationTrainingExReserveSpaceSize().

# Supported configurations

This function supports the following combinations of data types for various descriptors.

Table 8. Supported configurations

Data Type Configurations	xDesc, yDesc	dBnScaleBiasDes	alphaDataDiff, betaDataDiff,alph betaParamDiff	dyDesc, dzDesc, dxDesc
PSEUDO_HALF_CONF	ICUDNN_DATA_HALF	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_HALF
FLOAT_CONFIG	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT
DOUBLE_CONFIG	CUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL

#### Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- Any of the pointers alphaDataDiff, betaDataDiff, alphaParamDiff, betaParamDiff, x, dy, dx, bnScale, resultBnScaleDiff, resultBnBiasDiff is NULL.
- The number of xDesc or yDesc or dxDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- ▶ dBnScaleBiasDesc dimensions not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Exactly one of savedMean, savedInvVariance pointers is NULL.
- epsilon value is less than CUDNN\_BN\_MIN\_EPSILON.
- Dimensions or data types mismatch for any pair of xDesc, dyDesc, dxDesc.

# 4.1.4. cudnnBatchNormalizationForwardTraining()

```
cudnnStatus t cudnnBatchNormalizationForwardTraining(
    cudnnHandle t
                                     handle,
    cudnnBatchNormMode t
                                     mode.
    const void
                                     *alpha,
                                    *beta,
    const void
    const cudnnTensorDescriptor t
                                     xDesc,
                                    *x,
    const cudnnTensorDescriptor t
                                     yDesc,
    const cudnnTensorDescriptor t
                                    bnScaleBiasMeanVarDesc,
                                    *bnScale,
    const void
    const void
                                    *bnBias,
                                     exponentialAverageFactor,
    double
    void
                                     *resultRunningMean,
    void
                                     *resultRunningVariance,
                                     epsilon,
    double
                                     *resultSaveMean,
    void
                                    *resultSaveInvVariance)
```

This function performs the forward batch normalization layer computation for the training phase. This layer is based on the paper <u>Batch Normalization: Accelerating Deep Network</u> <u>Training by Reducing Internal Covariate Shift, S. Ioffe, C. Szegedy, 2015</u>.



# Note:

- Only 4D and 5D tensors are supported.
- ▶ The epsilon value has to be the same during training, backpropagation, and inference.
- ► For the inference phase, use cudnnBatchNormalizationForwardInference.
- ▶ Higher performance can be obtained when HW-packed tensors are used for both x and y.

See <u>cudnnDeriveBNTensorDescriptor()</u> for the secondary tensor descriptor generation for the parameters used in this function.

### **Parameters**

#### handle

Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Mode of operation (spatial or per-activation). For more information, see cudnnBatchNormMode t.

# alpha, beta

Inputs. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

### xDesc, yDesc

Tensor descriptors and pointers in device memory for the layer's x and y data. For more information, see cudnnTensorDescriptor t.

#### \*x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc, for the layer's x input data.

# \*y

Input. Data pointer to GPU memory associated with the tensor descriptor yDesc, for the youtput of the batch normalization layer.

# bnScaleBiasMeanVarDesc

Shared tensor descriptor desc for the secondary tensor that was derived by cudnnDeriveBNTensorDescriptor(). The dimensions for this tensor descriptor are dependent on the normalization mode.

# bnScale, bnBias

Inputs. Pointers in device memory for the batch normalization scale and bias parameters (in the original paper bias is referred to as beta and scale as gamma). Note that bnBias parameter can replace the previous layer's bias parameter for improved efficiency.

# exponentialAverageFactor

*Input.* Factor used in the moving average computation as follows:

```
runningMean = runningMean*(1-factor) + newMean*factor
```

Use a factor=1/(1+n) at N-th call to the function to get Cumulative Moving Average (CMA) behavior such that:

```
CMA[n] = (x[1]+...+x[n])/n
```

This is proved below:

```
CMA[n+1] = (n*CMA[n]+x[n+1])/(n+1)
= ((n+1) *CMA[n] - CMA[n]) / (n+1) + x[n+1] / (n+1)
```

```
= CMA[n]*(1-1/(n+1))+x[n+1]*1/(n+1)
= CMA[n]*(1-factor) + x(n+1)*factor
```

## resultRunningMean, resultRunningVariance

Inputs/Outputs. Running mean and variance tensors (these have the same descriptor as the bias and scale). Both of these pointers can be NULL but only at the same time. The value stored in resultRunningVariance (or passed as an input in inference mode) is the sample variance and is the moving average of variance[x] where the variance is computed either over batch or spatial+batch dimensions depending on the mode. If these pointers are not NULL, the tensors should be initialized to some reasonable values or to 0.

#### epsilon

Input. Epsilon value used in the batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN\_BN\_MIN\_EPSILON in cudnn.h. The same epsilon value should be used in forward and backward functions.

# resultSaveMean, resultSaveInvVariance

Outputs. Optional cache to save intermediate results computed during the forward pass. These buffers can be used to speed up the backward pass when supplied to the <a href="cudnnBatchNormalizationBackward">cudnnBatchNormalizationBackward</a>() function. The intermediate results stored in <a href="resultSaveMean">resultSaveMean</a> and <a href="resultSaveInvVariance">resultSaveInvVariance</a> may vary. For the cache to work correctly, the input layer data must remain unchanged until the backward function is called. Note that both parameters can be <a href="NULL">NULL</a> but only at the same time. In such a case, intermediate statistics will not be saved, and <a href="cudnnBatchNormalizationBackward">cudnnBatchNormalizationBackward</a>() will have to re-compute them. It is recommended to use this cache as the memory overhead is relatively small because these tensors have a much lower product of dimensions than the data tensors.

# Supported configurations

This function supports the following combinations of data types for various descriptors.

Table 9	'. Supported	d configurations
		a coming an actionic

Data Type Configurations	xDesc	bnScaleBiasMean	alpha, beta	yDesc
PSEUDO_HALF_CONF	ICUDNN_DATA_HALF	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_HALF
FLOAT_CONFIG	CUDNN_DATA_FLOAS	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT
DOUBLE_CONFIG	CUDNN_DATA_DOUB	ECUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBL	ECUDNN_DATA_DOUBLE

# Returns

### CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ One of the pointers alpha, beta, x, y, bnScale, bnBias is NULL.
- The number of xDesc or yDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- ▶ bnScaleBiasMeanVarDesc dimensions are not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Exactly one of resultSaveMean, resultSaveInvVariance pointers are NULL.
- Exactly one of resultRunningMean, resultRunningInvVariance pointers are NULL.
- epsilon value is less than CUDNN BN MIN EPSILON.
- Dimensions or data types mismatch for xDesc, yDesc.

#### 415 cudnnBatchNormalizationForwardTrainingEx()

```
cudnnStatus t cudnnBatchNormalizationForwardTrainingEx(
  cudnnHandle t
                                     handle,
  cudnnBatchNormMode t
                                     mode.
  cudnnBatchNormOps t
                                      bnOps,
  const void
                                      *alpha,
                                      *beta,
  const void
  const cudnnTensorDescriptor t
                                     xDesc,
  const void
                                      *xData,
  const cudnnTensorDescriptor t
                                     zDesc,
  const void
                                      *zData.
  const cudnnTensorDescriptor t
                                     yDesc,
                                      *yData,
  const cudnnTensorDescriptor t
                                     bnScaleBiasMeanVarDesc,
  const void
                                      *bnScaleData,
  const void
                                      *bnBiasData,
  double
                                     exponentialAverageFactor,
  void
                                      *resultRunningMeanData,
  void
                                      *resultRunningVarianceData,
  double
                                     epsilon,
  void
                                      *saveMean,
                                      *saveInvVariance,
  void
  const cudnnActivationDescriptor t activationDesc,
                                      *workspace,
                                      workSpaceSizeInBytes
  size t
  void
                                      *reserveSpace
                                     reserveSpaceSizeInBytes);
  size t
```

This function is an extension of the cudnnBatchNormalizationForwardTraining() for performing the forward batch normalization layer computation.

This API will trigger the new semi-persistent NHWC kernel when the following conditions are true:

- $\triangleright$  All tensors, namely, x, y, dz, dy, dx must be NHWC-fully packed and must be of the type CUDNN DATA HALF.
- ▶ The tensor c dimension should be a multiple of 4.

- ▶ The input parameter mode must be set to CUDNN BATCHNORM SPATIAL PERSISTENT.
- workspace is not NULL.
- workSpaceSizeInBytes is equal or larger than the amount required by cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize().
- reserveSpaceSizeInBytes is equal or larger than the amount required by cudnnGetBatchNormalizationTrainingExReserveSpaceSize().
- ▶ The content in reserveSpace stored by cudnnBatchNormalizationForwardTrainingEx() must be preserved.

If workspace is NULL and workSpaceSizeInBytes of zero is passed in, this API will function exactly like the non-extended function cudnnBatchNormalizationForwardTraining().

This workspace is not required to be clean. Moreover, the workspace does not have to remain unchanged between the forward and backward pass, as it is not used for passing any information.

This extended function can accept a \*workspace pointer to the GPU workspace, and workSpaceSizeInBytes, the size of the workspace, from the user.

The bnops input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

Only 4D and 5D tensors are supported. The epsilon value has to be the same during the training, the backpropagation, and the inference.

When the tensor layout is NCHW, higher performance can be obtained when HW-packed tensors are used for x, dy, dx.

# Parameters.

# handle

Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

# mode

Mode of operation (spatial or per-activation). For more information, see cudnnBatchNormMode t.

#### bn0ps

Input. Mode of operation for the fast NHWC kernel. See <u>cudnnBatchNormOps\_t</u>. This input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

# \*alpha, \*beta

Inputs. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### xDesc, \*xData, zDesc, \*zData, yDesc, \*yData

Tensor descriptors and pointers in device memory for the layer's input x and output y, and for the optional z tensor input for residual addition to the result of the batch normalization operation, prior to the activation. The optional zDes and \*zData descriptors are only used when bnOps is CUDNN BATCHNORM OPS BN ADD ACTIVATION, otherwise users may pass NULL. When in use, z should have exactly the same dimension as x and the final output y. For more information, see cudnnTensorDescriptor t.

#### bnScaleBiasMeanVarDesc

Shared tensor descriptor desc for the secondary tensor that was derived by cudnnDeriveBNTensorDescriptor(). The dimensions for this tensor descriptor are dependent on the normalization mode.

# \*bnScaleData, \*bnBiasData

Inputs. Pointers in device memory for the batch normalization scale and bias parameters (in the original paper, bias is referred to as beta and scale as gamma). Note that bnBiasData parameter can replace the previous layer's bias parameter for improved efficiency.

# exponentialAverageFactor

Input. Factor used in the moving average computation as follows:

```
runningMean = runningMean*(1-factor) + newMean*factor
```

Use a factor=1/(1+n) at N-th call to the function to get Cumulative Moving Average (CMA) behavior such that:

```
CMA[n] = (x[1]+...+x[n])/n
```

This is proved below:

## Writing

```
CMA[n+1] = (n*CMA[n]+x[n+1])/(n+1)
= ((n+1)*CMA[n]-CMA[n])/(n+1) + x[n+1]/(n+1)
= CMA[n] * (1-1/(n+1)) + x[n+1] * 1/(n+1)
= CMA[n]*(1-factor) + x(n+1)*factor
```

# \*resultRunningMeanData, \*resultRunningVarianceData

Inputs/Outputs. Pointers to the running mean and running variance data. Both these pointers can be NULL but only at the same time. The value stored in resultRunningVarianceData (or passed as an input in inference mode) is the sample variance and is the moving average of variance[x] where the variance is computed either over batch or spatial+batch dimensions depending on the mode. If these pointers are not NULL, the tensors should be initialized to some reasonable values or to 0.

#### epsilon

Input. Epsilon value used in the batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN BN MIN EPSILON in cudnn.h. The same epsilon value should be used in forward and backward functions.

# \*saveMean, \*saveInvVariance

Outputs. Optional cache parameters containing saved intermediate results computed during the forward pass. For this to work correctly, the layer's x and bnScaleData, bnBiasData data has to remain unchanged until this backward function is called. Note that both these parameters can be NULL but only at the same time. It is recommended to use this cache since the memory overhead is relatively small.

#### activationDesc

Input. The tensor descriptor for the activation operation. When the bnOps input is set to either CUDNN\_BATCHNORM\_OPS\_BN\_ACTIVATION or CUDNN\_BATCHNORM\_OPS\_BN\_ADD\_ACTIVATION then this activation is used, otherwise user may pass NULL.

### \*workspace, workSpaceSizeInBytes

Inputs. \*workspace is a pointer to the GPU workspace, and workSpaceSizeInBytes is the size of the workspace. When \*workspace is not NULL and \*workSpaceSizeInBytes is large enough, and the tensor layout is NHWC and the data type configuration is supported, then this function will trigger a new semi-persistent NHWC kernel for batch normalization. The workspace is not required to be clean. Also, the workspace does not need to remain unchanged between the forward and backward passes.

### \*reserveSpace

*Input.* Pointer to the GPU workspace for the reserveSpace.

# reserveSpaceSizeInBytes

*Input.* The size of the reserveSpace. Must be equal or larger than the amount required by cudnnGetBatchNormalizationTrainingExReserveSpaceSize().

# Supported configurations

This function supports the following combinations of data types for various descriptors.

Table 10. Supported configurations

Data Type Configurations	xDesc	bnScaleBiasM	alpha, beta	zDesc	yDesc
PSEUDO_HALF_C	O <b>NFIN</b> N_DATA_HA	LEUDNN_DATA_FL	oaudnn_data_fl	OAUDNN_DATA_HA	L <b>E</b> UDNN_DATA_HALF
FLOAT_CONFIG	CUDNN_DATA_FL	o <b>gu</b> dnn_data_fl	OAUDNN_DATA_FL	o <b>Alo</b> t supported	CUDNN_DATA_FLOA
DOUBLE_CONFIG	CUDNN_DATA_DO	UBUENN_DATA_DO	UBUENN_DATA_DO	u <b>B</b> oot supported	CUDNN_DATA_DOUE

# Returns

### CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

One of the pointers alpha, beta, x, y, bnScaleData, bnBiasData is NULL.

- The number of xDesc or yDesc tensor descriptor dimensions is not within the [4,5] range (only 4D and 5D tensors are supported).
- bnScaleBiasMeanVarDesc dimensions are not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Exactly one of saveMean, saveInvVariance pointers are NULL.
- Exactly one of resultRunningMeanData, resultRunningInvVarianceData pointers are NULL.
- epsilon value is less than CUDNN BN MIN EPSILON.
- Dimensions or data types mismatch for xDesc, yDesc.

# 4.1.6. cudnnDivisiveNormalizationBackward()

```
cudnnStatus t cudnnDivisiveNormalizationBackward(
  cudnnHandle t
                                   handle,
  cudnnLRNDescriptor_t
cudnnDivNormMode_t
const void
                                    normDesc,
  cudnnDivNormMode_t
const void
const cudnnTensorDescriptor_t
xDesc,
*x,
  const void
                                    *means,
  const void
                                    *dy,
  void
                                    *temp,
                                    *temp2,
  void
  const void
                                   *beta,
  *dx,
                                  *dMeans)
```

This function performs the backward DivisiveNormalization layer computation.



**Note:** Supported tensor formats are NCHW for 4D and NCDHW for 5D with any non-overlapping non-negative strides. Only 4D and 5D tensors are supported.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

# normDesc

*Input*. Handle to a previously initialized LRN parameter descriptor (this descriptor is used for both LRN and DivisiveNormalization layers).

## mode

Input. DivisiveNormalization layer mode of operation. Currently only CUDNN\_DIVNORM\_PRECOMPUTED\_MEANS is implemented. Normalization is performed using the means input tensor that is expected to be precomputed by the user.

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#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

### xDesc, x, means

Input. Tensor descriptor and pointers in device memory for the layer's x and means data. Note that the means tensor is expected to be precomputed by the user. It can also contain any valid values (not required to be actual means, and can be for instance a result of a convolution with a Gaussian kernel).

#### dy

Input. Tensor pointer in device memory for the layer's dy cumulative loss differential data (error backpropagation).

# temp, temp2

Workspace. Temporary tensors in device memory. These are used for computing intermediate values during the backward pass. These tensors do not have to be preserved from forward to backward pass. Both use xDesc as a descriptor.

#### dxDesc

Input. Tensor descriptor for dx and dMeans.

# dx. dMeans

Output. Tensor pointers (in device memory) for the layers resulting cumulative gradients dx and dMeans (dLoss/dx and dLoss/dMeans). Both share the same descriptor.

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ One of the tensor pointers x, dx, temp, tmep2, dy is NULL.
- Number of any of the input or output tensor dimensions is not within the [4,5] range.
- ► Either alpha or beta pointer is NULL.
- A mismatch in dimensions between xDesc and dxDesc.
- LRN descriptor parameters are outside of their valid ranges.
- Any of the tensor strides is negative.

# CUDNN STATUS UNSUPPORTED

The function does not support the provided configuration, for example, any of the input and output tensor strides mismatch (for the same dimension) is a non-supported configuration.

#### 4.1.7. cudnnDropoutBackward()

```
cudnnStatus t cudnnDropoutBackward(
   cudnnHandle_t
                                    handle,
   const cudnnDropoutDescriptor t dropoutDesc,
   const cudnnTensorDescriptor t dydesc,
                                  *dy,
   const void
   const cudnnTensorDescriptor t
                                  dxdesc,
                                   *dx.
   void
   void
                                   *reserveSpace,
                                   reserveSpaceSizeInBytes)
   size t
```

This function performs backward dropout operation over dy returning results in dx. If during forward dropout operation value from x was propagated to y then during backward operation value from dy will be propagated to dx, otherwise, dx value will be set to 0.



**Note:** Better performance is obtained for fully packed tensors.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

# dropoutDesc

*Input*. Previously created dropout descriptor object.

#### dyDesc

*Input.* Handle to a previously initialized tensor descriptor.

# dy

*Input*. Pointer to data of the tensor described by the dyDesc descriptor.

#### dxDesc

*Input.* Handle to a previously initialized tensor descriptor.

# dx

*Output.* Pointer to data of the tensor described by the dxDesc descriptor.

#### reserveSpace

Input. Pointer to user-allocated GPU memory used by this function. It is expected that reserveSpace was populated during a call to cudnnDropoutForward and has not been changed.

# reserveSpaceSizeInBytes

Input. Specifies the size in bytes of the provided memory for the reserve space

# Returns

# CUDNN STATUS SUCCESS

The call was successful.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- The number of elements of input tensor and output tensors differ.
- ▶ The datatype of the input tensor and output tensors differs.
- The strides of the input tensor and output tensors differ and in-place operation is used (i.e., x and y pointers are equal).
- ▶ The provided reserveSpaceSizeInBytes is less then the value returned by cudnnDropoutGetReserveSpaceSize.
- cudnnSetDropoutDescriptor has not been called on dropoutDesc with the non-NULL states argument.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

#### 418 cudnnGetBatchNormalizationBackwardExWorkspac

```
cudnnStatus t cudnnGetBatchNormalizationBackwardExWorkspaceSize(
         cudnnHandle t
                                                                                                      handle,
         cudnnBatchNormMode t
                                                                                                    mode,
       cudnnBatchNormMode_t mode,
cudnnBatchNormOps_t bnOps,
const cudnnTensorDescriptor_t yDesc,
const cudnnTensorDescriptor_t dyDesc,
const cudnnTensorDescriptor_t dzDesc,
const cudnnTensorDescriptor_t dxDesc,
const cudnnTensorDescriptor_t dbnScaleBiasDesc,
const cudnnActivationDescriptor_t activationDesc,
size_t *sizeInBytes);
```

This function returns the amount of GPU memory workspace the user should allocate to be able to call cudnnGetBatchNormalizationBackwardExWorkspaceSize() function for the specified bnops input setting. The workspace allocated will then be passed to the function cudnnGetBatchNormalizationBackwardExWorkspaceSize().

### **Parameters**

# handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (spatial or per-activation). For more information, see cudnnBatchNormMode t.

# bn0ps

Input. Mode of operation for the fast NHWC kernel. For more information, see <u>cudnnBatchNormOps</u> t. This input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

# xDesc, yDesc, dyDesc, dzDesc, dxDesc

Tensor descriptors and pointers in the device memory for the layer's x data, back propagated differential dy (inputs), the optional y input data, the optional dz output, and the dx output, which is the resulting differential with respect to x. For more information, see <u>cudnnTensorDes</u>criptor t.

#### dBnScaleBiasDesc

Input. Shared tensor descriptor for the following six tensors: bnScaleData, bnBiasData, dBnScaleData, dBnBiasData, savedMean, and savedInvVariance. This is the shared tensor descriptor desc for the secondary tensor that was derived by <u>cudnnDeriveBNTensorDescriptor()</u>. The dimensions for this tensor descriptor are dependent on normalization mode. Note that the data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

#### activationDesc

Input. Descriptor for the activation operation. When the bnops input is set to either CUDNN BATCHNORM OPS BN ACTIVATION OF CUDNN BATCHNORM OPS BN ADD ACTIVATION, then this activation is used, otherwise user may pass NULL.

# \*sizeInBytes

Output. Amount of GPU memory required for the workspace, as determined by this function, to be able to execute the cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize() function with the specified bnOps input setting.

#### Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

 Number of xDesc, yDesc or dxDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).

- dBnScaleBiasDesc dimensions not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial. and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Dimensions or data types mismatch for any pair of xDesc, dyDesc, dxDesc.

# 4.1.9. cudnnGetBatchNormalizationForwardTrainingExW

```
cudnnStatus t cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize(
   cudnnHandle t
                                                   handle,
   cudnnBatchNormMode t
                                                 bnOps,
   cudnnBatchNormOps t
                                                 xDesc,
zDesc,
   const cudnnTensorDescriptor t
   const cudnnTensorDescriptor t
  const cudnnTensorDescriptor_t
const cudnnTensorDescriptor_t
const cudnnActivationDescriptor_t
                                                 yDesc,
                                                bnScaleBiasMeanVarDesc,
                                                activationDesc,
                                                 *sizeInBytes);
```

This function returns the amount of GPU memory workspace the user should allocate to be able to call cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize() function for the specified bnops input setting. The workspace allocated should then be passed by the  $user\ to\ the\ function\ \verb|cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize()|.$ 

# **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (spatial or per-activation). For more information, see cudnnBatchNormMode t.

Input. Mode of operation for the fast NHWC kernel. For more information, see cudnnBatchNormOps t. This input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

#### xDesc. zDesc. yDesc

Tensor descriptors and pointers in the device memory for the layer's x data, the optional z input data, and the y output. zDesc is only needed when bnops is CUDNN\_BATCHNORM\_OPS\_BN\_ADD ACTIVATION, otherwise the user may pass NULL. For more information, see cudnnTensorDescriptor t.

# bnScaleBiasMeanVarDesc

Input. Shared tensor descriptor for the following six tensors: bnScaleData, bnBiasData, dBnScaleData, dBnBiasData, savedMean, and savedInvVariance. This is the shared tensor descriptor desc for the secondary tensor that was derived by cudnnDeriveBNTensorDescriptor(). The dimensions for this tensor descriptor are

dependent on normalization mode. Note that the data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

#### activationDesc

Input. Descriptor for the activation operation. When the bnops input is set to either CUDNN\_BATCHNORM\_OPS\_BN\_ACTIVATION or CUDNN\_BATCHNORM\_OPS\_BN\_ADD\_ACTIVATION then this activation is used, otherwise the user may pass NULL.

# \*sizeInBytes

Output. Amount of GPU memory required for the workspace, as determined by this function, to be able to execute the cudnnGetBatchNormalizationForwardTrainingExWorkspaceSize() function with the specified bnOps input setting.

# Returns

# CUDNN\_STATUS\_SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- Number of xDesc, yDesc or dxDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- ▶ dBnScaleBiasDesc dimensions not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for spatial, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Dimensions or data types mismatch for xDesc, yDesc.

# 4.1.10. cudnnGetBatchNormalizationTrainingExReserveS

This function returns the amount of reserve GPU memory workspace the user should allocate for the batch normalization operation, for the specified <code>bnOps</code> input setting. In contrast to the <code>workspace</code>, the reserved space should be preserved between the forward and backward calls, and the data should not be altered.

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# **Parameters**

# handle

*Input.* Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

*Input*. Mode of operation (spatial or per-activation). For more information, see <u>cudnnBatchNormMode</u> t.

#### bnOps

Input. Mode of operation for the fast NHWC kernel. For more information, see <a href="mailto:cudnnBatchNormOps\_t">cudnnBatchNormOps\_t</a>. This input can be used to set this function to perform either only the batch normalization, or batch normalization followed by activation, or batch normalization followed by element-wise addition and then activation.

#### xDesc

Tensor descriptors for the layer's x data. For more information, see  $\underline{\text{cudnnTensorDescriptor}}_t$ .

#### activationDesc

Input. Descriptor for the activation operation. When the bnOps input is set to either CUDNN\_BATCHNORM\_OPS\_BN\_ACTIVATION or CUDNN\_BATCHNORM\_OPS\_BN\_ADD\_ACTIVATION then this activation is used, otherwise user may pass NULL.

# \*sizeInBytes

Output. Amount of GPU memory reserved.

### Returns

# CUDNN\_STATUS\_SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

The xDesc tensor descriptor dimension is not within the [4,5] range (only 4D and 5D tensors are supported).

# 4.1.11. cudnnGetNormalizationBackwardWorkspaceSize()

```
const cudnnTensorDescriptor t yDesc,
                                          const cudnnTensorDescriptor t dyDesc,
                                       const cudnnTensorDescriptor t dzDesc,
                                          const cudnnTensorDescriptor t dxDesc,
                                          const cudnnTensorDescriptor t
dNormScaleBiasDesc,
                                       const cudnnActivationDescriptor t
activationDesc,
                                          const cudnnTensorDescriptor t
normMeanVarDesc,
                                          size t *sizeInBytes,
                                          int groupCnt);
```

This function returns the amount of GPU memory workspace the user should allocate to be able to call cudnnNormalizationBackward() function for the specified normops and algo input setting. The workspace allocated will then be passed to the function cudnnNormalizationBackward().

# **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (per-channel or per-activation). For more information, see cudnnNormMode t.

# normOps

Input. Mode of post-operative. Currently CUDNN NORM OPS NORM ACTIVATION and CUDNN NORM OPS NORM ADD ACTIVATION are only supported in the NHWC layout. For more information, see cudnnNormOps t. This input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

# algo

Input. Algorithm to be performed. For more information, see cudnnNormAlgo t.

# xDesc, yDesc, dyDesc, dzDesc, dxDesc

Tensor descriptors and pointers in the device memory for the layer's x data, back propagated differential dy (inputs), the optional y input data, the optional dz output, and the dx output, which is the resulting differential with respect to x. For more information, see cudnnTensorDescriptor t.

#### dNormScaleBiasDesc

Input. Shared tensor descriptor for the following four tensors: normScaleData, normBiasData, dNormScaleData, dNormBiasData. The dimensions for this tensor descriptor are dependent on normalization mode. Note that the data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

#### activationDesc

Input. Descriptor for the activation operation. When the normOps input is set to either CUDNN NORM OPS NORM ACTIVATION OF CUDNN NORM OPS NORM ADD ACTIVATION, then this activation is used, otherwise the user may pass NULL.

#### normMeanVarDesc

Input. Shared tensor descriptor for the following tensors: savedMean and savedInvVariance. The dimensions for this tensor descriptor are dependent on normalization mode. Note that the data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

# \*sizeInBytes

Output. Amount of GPU memory required for the workspace, as determined by this function, to be able to execute the <a href="mailto:cudnnGetNormalizationForwardTrainingWorkspaceSize">cudnnGetNormalizationForwardTrainingWorkspaceSize</a> function with the specified normOps input setting.

# groutCnt

Input. Only support 1 for now.

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- Number of xDesc, yDesc or dxDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- dNormScaleBiasDesc dimensions not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for perchannel, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- ▶ Dimensions or data types mismatch for any pair of xDesc, dyDesc, dxDesc.

#### 4.1.12. cudnnGetNormalizationForwardTrainingWorkspac

```
cudnnGetNormalizationForwardTrainingWorkspaceSize(cudnnHandle t handle,
                                                   cudnnNormMode t mode,
                                                   cudnnNormOps t normOps,
                                                   cudnnNormAlgo_t algo,
                                                const cudnnTensorDescriptor t xDesc,
                                                   const cudnnTensorDescriptor_t
 zDesc.
                                                   const cudnnTensorDescriptor t
 yDesc,
                                                const cudnnTensorDescriptor t
 normScaleBiasDesc,
```

```
const cudnnActivationDescriptor t
activationDesc,
                                                  const cudnnTensorDescriptor t
normMeanVarDesc,
                                                  size_t *sizeInBytes,
```

This function returns the amount of GPU memory workspace the user should allocate to be able to call cudnnNormalizationForwardTraining() function for the specified normOps and algo input setting. The workspace allocated should then be passed by the user to the function <u>cudnnNormalizationForwardTraining()</u>.

### **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (per-channel or per-activation). For more information, see cudnnNormMode t.

# normOps

Input. Mode of post-operative. Currently CUDNN NORM OPS NORM ACTIVATION and CUDNN NORM OPS NORM ADD ACTIVATION are only supported in the NHWC layout. For more information, see cudnnNormOps t. This input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

#### algo

Input. Algorithm to be performed. For more information, see cudnnNormAlgo t.

#### xDesc, zDesc, yDesc

Tensor descriptors and pointers in the device memory for the layer's x data, the optional z input data, and the y output. zDesc is only needed when normops is CUDNN NORM OPS NORM ADD ACTIVATION, otherwise the user may pass NULL. For more information, see cudnnTensorDescriptor t.

# normScaleBiasDesc

Input. Shared tensor descriptor for the following tensors: normScaleData and normBiasData. The dimensions for this tensor descriptor are dependent on normalization mode. Note that the data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

#### activationDesc

Input. Descriptor for the activation operation. When the normOps input is set to either CUDNN NORM OPS NORM ACTIVATION OF CUDNN NORM OPS NORM ADD ACTIVATION, then this activation is used, otherwise the user may pass NULL.

#### normMeanVarDesc

Input. Shared tensor descriptor for the following tensors: savedMean and savedInvVariance. The dimensions for this tensor descriptor are dependent on normalization mode. Note that the data type of this tensor descriptor must be float for FP16 and FP32 input tensors, and double for FP64 input tensors.

#### \*sizeInBytes

Output. Amount of GPU memory required for the workspace, as determined by this function, to be able to execute the <u>cudnnGetNormalizationForwardTrainingWorkspaceSize()</u> function with the specified normOps input setting.

# groutCnt

Input. Only support 1 for now.

### Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- Number of xDesc, yDesc or zDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- ▶ normScaleBiasDesc dimensions not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for perchannel, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Dimensions or data types mismatch for xDesc, yDesc.

# 4.1.13. cudnnGetNormalizationTrainingReserveSpaceSiz

This function returns the amount of reserve GPU memory workspace the user should allocate for the normalization operation, for the specified normOps input setting. In contrast to the workspace, the reserved space should be preserved between the forward and backward calls, and the data should not be altered.

### **Parameters**

### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (per-channel or per-activation). For more information, see <u>cudnnNormMode</u> t.

# normOps

Input. Mode of post-operative. Currently CUDNN NORM OPS NORM ACTIVATION and CUDNN NORM OPS NORM ADD ACTIVATION are only supported in the NHWC layout. For more information, see <a href="mailto:cudnnNormOps\_t">cudnnNormOps\_t</a>. This input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

#### algo

Input. Algorithm to be performed. For more information, see cudnnNormAlgo t.

#### xDesc

Tensor descriptors for the layer's x data. For more information, see cudnnTensorDescriptor t.

# activationDesc

Input. Descriptor for the activation operation. When the normOps input is set to either CUDNN NORM OPS NORM ACTIVATION OF CUDNN NORM OPS NORM ADD ACTIVATION then this activation is used, otherwise the user may pass NULL.

# \*sizeInBytes

Output. Amount of GPU memory reserved.

# groutCnt

Input. Only support 1 for now.

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

The xDesc tensor descriptor dimension is not within the [4,5] range (only 4D and 5D tensors are supported).

#### 4 1 14 cudnnLRNCrossChannelBackward()

```
cudnnStatus t cudnnLRNCrossChannelBackward(
   cudnnHandle_t
                                   handle,
   cudnnLRNDescriptor t
                                   normDesc.
   cudnnLRNMode t
                                   lrnMode,
                                  *alpha,
   const void
   const cudnnTensorDescriptor t
                                   yDesc,
                                   *y,
   const void
   const cudnnTensorDescriptor t
                                   dyDesc,
                                   *dy,
   const void
   const cudnnTensorDescriptor t
                                   xDesc,
                                   *x,
   const void
                                  *beta,
   const void
   const cudnnTensorDescriptor_t dxDesc,
                                   *dx)
```

This function performs the backward LRN layer computation.



Note: Supported formats are: positive-strided, NCHW and NHWC for 4D x and y, and only NCDHW DHW-packed for 5D (for both x and y). Only non-overlapping 4D and 5D tensors are supported. NCHW layout is preferred for performance.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

#### normDesc

*Input.* Handle to a previously initialized LRN parameter descriptor.

#### lrnMode

Input. LRN layer mode of operation. Currently, only CUDNN LRN CROSS CHANNEL DIM1 is implemented. Normalization is performed along the tensor's dimA[1].

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see Scaling Parameters in the cuDNN Developer Guide.

# yDesc, y

Input. Tensor descriptor and pointer in device memory for the layer's y data.

# dyDesc, dy

Input. Tensor descriptor and pointer in device memory for the layer's input cumulative loss differential data dy (including error backpropagation).

#### xDesc. x

Input. Tensor descriptor and pointer in device memory for the layer's x data. Note that these values are not modified during backpropagation.

# dxDesc, dx

Output. Tensor descriptor and pointer in device memory for the layer's resulting cumulative loss differential data dx (including error backpropagation).

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ One of the tensor pointers x, y is NULL.
- Number of input tensor dimensions is 2 or less.
- LRN descriptor parameters are outside of their valid ranges.
- One of the tensor parameters is 5D but is not in NCDHW DHW-packed format.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

- Any of the input tensor datatypes is not the same as any of the output tensor datatype.
- Any pairwise tensor dimensions mismatch for x, y, dx, dy.
- Any tensor parameters strides are negative.

#### 4 1 15 cudnnNormalizationBackward()

```
cudnnStatus t
cudnnNormalizationBackward(cudnnHandle t handle,
                           cudnnNormMode t mode,
                           cudnnNormOps t normOps,
                          cudnnNormAlgo_t algo,
                          const void *alphaDataDiff,
                        const void *betaDataDiff,
                           const void *alphaParamDiff,
                           const void *betaParamDiff,
                           const cudnnTensorDescriptor t xDesc,
                           const void *xData,
                           const cudnnTensorDescriptor t yDesc,
                           const void *yData,
                          const cudnnTensorDescriptor t dyDesc,
                          const void *dyData,
                        const cudnnTensorDescriptor t dzDesc,
                           void *dzData,
                           const cudnnTensorDescriptor t dxDesc,
                           void *dxData,
                           const cudnnTensorDescriptor t dNormScaleBiasDesc,
                           const void *normScaleData,
```

```
const void *normBiasData,
  void *dNormScaleData,
  void *dNormBiasData,
  double epsilon,
  const cudnnTensorDescriptor t normMeanVarDesc,
  const void *savedMean,
  const void *savedInvVariance,
  cudnnActivationDescriptor t activationDesc,
  void *workSpace,
  size t workSpaceSizeInBytes,
  void *reserveSpace,
  size t reserveSpaceSizeInBytes,
int groupCnt)
```

This function performs backward normalization layer computation that is specified by mode. Per-channel normalization layer is based on the paper Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift, S. Ioffe, C. Szegedy, 2015.

Note: Only 4D and 5D tensors are supported.

The epsilon value has to be the same during training, backpropagation, and inference. This workspace is not required to be clean. Moreover, the workspace does not have to remain unchanged between the forward and backward pass, as it is not used for passing any information.

This function can accept a \*workspace pointer to the GPU workspace, and workSpaceSizeInBytes, the size of the workspace, from the user.

The normops input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

When the tensor layout is NCHW, higher performance can be obtained when HW-packed tensors are used for x, dy, dx.

Higher performance for CUDNN NORM PER CHANNEL mode can be obtained when the following conditions are true:

- ▶ All tensors, namely, x, y, dz, dy, and dx must be NHWC-fully packed, and must be of the type CUDNN DATA HALF.
- ▶ The tensor C dimension should be a multiple of 4.
- The input parameter mode must be set to CUDNN NORM PER CHANNEL.
- The input parameter algo must be set to CUDNN NORM ALGO PERSIST.
- ▶ Workspace is not NULL.
- workSpaceSizeInBytes is equal or larger than the amount required by cudnnGetNormalizationBackwardWorkspaceSize().
- reserveSpaceSizeInBytes is equal or larger than the amount required by cudnnGetNormalizationTrainingReserveSpaceSize().
- ▶ The content in reserveSpace stored by cudnnNormalizationForwardTraining() must be preserved.

# **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

#### mode

Input. Mode of operation (per-channel or per-activation). For more information, see cudnnNormMode t.

# normOps

Input. Mode of post-operative. Currently CUDNN NORM OPS NORM ACTIVATION and CUDNN NORM OPS NORM ADD ACTIVATION are only supported in the NHWC layout. For more information, see cudnnNormOps t. This input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

#### algo

Input. Algorithm to be performed. For more information, see cudnnNormAlgo t.

# \*alphaDataDiff, \*betaDataDiff

Inputs. Pointers to scaling factors (in host memory) used to blend the gradient output dx with a prior value in the destination tensor as follows:

#### dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see Scaling Parameters in the cuDNN Developer Guide.

### \*alphaParamDiff, \*betaParamDiff

Inputs. Pointers to scaling factors (in host memory) used to blend the gradient outputs dNormScaleData and dNormBiasData with prior values in the destination tensor as follows:

# dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

### xDesc, \*xData, yDesc, \*yData, dyDesc, \*dyData

Inputs. Tensor descriptors and pointers in the device memory for the layer's x data. backpropagated gradient input dy, the original forward output y data. yDesc and yData are not needed if normops is set to CUDNN NORM OPS NORM, users may pass NULL. For more information, see cudnnTensorDescriptor t.

# dzDesc, \*dzData, dxDesc, \*dxData

Outputs. Tensor descriptors and pointers in the device memory for the computed gradient output dz and dx. dzDesc and \*dzData is not needed when normOps is CUDNN NORM OPS NORM OF CUDNN NORM OPS NORM ACTIVATION, USERS May pass NULL. For more information, see cudnnTensorDescriptor t.

### dNormScaleBiasDesc

Input. Shared tensor descriptor for the following six tensors: normScaleData, normBiasData, dNormScaleData, and dNormBiasData. The dimensions for this tensor descriptor are dependent on normalization mode.



**Note:** The data type of this tensor descriptor must be float for FP16 and FP32 input tensors and double for FP64 input tensors.

For more information, see <u>cudnnTensorDescriptor</u> t.

### \*normScaleData

*Input.* Pointer in the device memory for the normalization scale parameter (in the <u>original paper</u> the quantity scale is referred to as gamma).

### \*normBiasData

*Input*. Pointers in the device memory for the normalization bias parameter (in the <u>original paper</u> bias is referred to as beta). This parameter is used only when activation should be performed.

### \*dNormScaleData, dNormBiasData

*Inputs.* Pointers in the device memory for the gradients of normScaleData and normBiasData, respectively.

### epsilon

*Input*. Epsilon value used in normalization formula. Its value should be equal to or greater than zero. The same epsilon value should be used in forward and backward functions.

#### normMeanVarDesc

Input. Shared tensor descriptor for the following tensors: savedMean and savedInvVariance. The dimensions for this tensor descriptor are dependent on normalization mode.



**Note:** The data type of this tensor descriptor must be float for FP16 and FP32 input tensors and double for FP64 input tensors.

For more information, see <u>cudnnTensorDescriptor</u> <u>t</u>.

### \*savedMean, \*savedInvVariance

Inputs. Optional cache parameters containing saved intermediate results computed during the forward pass. For this to work correctly, the layer's x and normScaleData, normBiasData data has to remain unchanged until this backward function is called. Note that both these parameters can be NULL but only at the same time. It is recommended to use this cache since the memory overhead is relatively small.

#### activationDesc

Input. Descriptor for the activation operation. When the normOps input is set to either CUDNN NORM OPS NORM ACTIVATION OF CUDNN NORM OPS NORM ADD ACTIVATION then this activation is used, otherwise the user may pass NULL.

# workspace

Input. Pointer to the GPU workspace.

### workSpaceSizeInBytes

Input. The size of the workspace. It must be large enough to trigger the fast NHWC semipersistent kernel by this function.

### \*reserveSpace

*Input.* Pointer to the GPU workspace for the reserveSpace.

# reserveSpaceSizeInBytes

Input. The size of the reserveSpace. It must be equal or larger than the amount required by cudnnGetNormalizationTrainingReserveSpaceSize().

### groutCnt

Input. Only support 1 for now.

### Returns

### CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- Any of the pointers alphaDataDiff, betaDataDiff, alphaParamDiff, betaParamDiff, xData, dyData, dxData, normScaleData, dNormScaleData, and dNormBiasData is NULL.
- The number of xDesc or yDesc or dxDesc tensor descriptor dimensions is not within the range of [4,5] (only 4D and 5D tensors are supported).
- dNormScaleBiasDesc dimensions not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for perchannel, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Exactly one of savedMean, savedInvVariance pointers is NULL.
- epsilon value is less than zero.
- Dimensions or data types mismatch for any pair of xDesc, dyDesc, dxDesc, dNormScaleBiasDesc. and normMeanVarDesc.

# 4.1.16. cudnnNormalizationForwardTraining()

```
cudnnStatus t
cudnnNormalizationForwardTraining(cudnnHandle t handle,
                                  cudnnNormMode t mode,
                                  cudnnNormOps_t normOps,
                                  cudnnNormAlgo_t algo,
                               const void *alpha,
                               const void *beta,
                               const cudnnTensorDescriptor t xDesc,
                               const void *xData,
                               const cudnnTensorDescriptor t normScaleBiasDesc,
                               const void *normScale,
                               const void *normBias,
                               double exponential Average Factor,
                               const cudnnTensorDescriptor_t normMeanVarDesc,
                               void *resultRunningMean,
                               void *resultRunningVariance,
                                  double epsilon,
                               void *resultSaveMean,
                               void *resultSaveInvVariance,
                                  cudnnActivationDescriptor t activationDesc,
                               const cudnnTensorDescriptor t zDesc,
                               const void *zData,
                               const cudnnTensorDescriptor t yDesc,
                               void *yData,
                               void *workspace,
                               size t workSpaceSizeInBytes,
                               void *reserveSpace,
                               size t reserveSpaceSizeInBytes,
                               int groupCnt);
```

This function performs the forward normalization layer computation for the training phase. Depending on mode, different normalization operations will be performed. Per-channel layer is based on the paper Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift, S. Ioffe, C. Szegedy, 2015.



### Note:

- Only 4D and 5D tensors are supported.
- The epsilon value has to be the same during training, back propagation, and inference.
- For the inference phase, use cudnnNormalizationForwardInference().
- Higher performance can be obtained when HW-packed tensors are used for both x and y.

This API will trigger the new semi-persistent NHWC kernel when the following conditions are

- All tensors, namely, xData, yData must be NHWC-fully packed and must be of the type CUDNN DATA HALF.
- The tensor C dimension should be a multiple of 4.
- The input parameter mode must be set to CUDNN NORM PER CHANNEL.
- The input parameter algo must be set to CUDNN NORM ALGO PERSIST.
- workspace is not NULL.

- workSpaceSizeInBytes is equal or larger than the amount required by cudnnGetNormalizationForwardTrainingWorkspaceSize().
- reserveSpaceSizeInBytes is equal or larger than the amount required by cudnnGetNormalizationTrainingReserveSpaceSize().
- ▶ The content in reserveSpace stored by <u>cudnnNormalizationForwardTraining()</u> must be preserved.

This workspace is not required to be clean. Moreover, the workspace does not have to remain unchanged between the forward and backward pass, as it is not used for passing any information. This extended function can accept a \*workspace pointer to the GPU workspace, and workSpaceSizeInBytes, the size of the workspace, from the user.

The normops input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

Only 4D and 5D tensors are supported. The epsilon value has to be the same during the training, the backpropagation, and the inference.

When the tensor layout is NCHW, higher performance can be obtained when HW-packed tensors are used for xData, yData.

# **Parameters**

### handle

Input. Handle to a previously created cuDNN library descriptor. For more information, see cudnnHandle t.

### mode

Input. Mode of operation (per-channel or per-activation). For more information, see cudnnNormMode t.

### normOps

Input. Mode of post-operative. Currently CUDNN NORM OPS NORM ACTIVATION and CUDNN NORM OPS NORM ADD ACTIVATION are only supported in the NHWC layout. For more information, see cudnnNormOps t. This input can be used to set this function to perform either only the normalization, or normalization followed by activation, or normalization followed by element-wise addition and then activation.

# algo

Input. Algorithm to be performed. For more information, see cudnnNormAlgo t.

### \*alpha, \*beta

Inputs. Pointers to scaling factors (in host memory) used to blend the layer output value with prior value in the destination tensor as follows:

# dstValue = alpha[0]\*resultValue + beta[0]\*priorDstValue

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

### xDesc, yDesc

*Input.* Handles to the previously initialized tensor descriptors.

### \*xData

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc, for the layer's x input data.

# \*yData

Output. Data pointer to GPU memory associated with the tensor descriptor yDesc, for the y output of the normalization layer.

### zDesc. \*zData

Input. Tensor descriptors and pointers in device memory for residual addition to the result of the normalization operation, prior to the activation. zDesc and \*zData are optional and are only used when normOps is CUDNN NORM OPS NORM ADD ACTIVATION, otherwise the user may pass NULL. When in use, z should have exactly the same dimension as xData and the final output yData. For more information, see cudnnTensorDescriptor t.

### normScaleBiasDesc, normScale, normBias

Inputs. Tensor descriptors and pointers in device memory for the normalization scale and bias parameters (in the original paper bias is referred to as beta and scale as gamma). The dimensions for the tensor descriptor are dependent on the normalization mode.

# exponentialAverageFactor

*Input.* Factor used in the moving average computation as follows:

```
runningMean = runningMean*(1-factor) + newMean*factor
```

Use a factor=1/(1+n) at N-th call to the function to get Cumulative Moving Average (CMA) behavior such that:

```
CMA[n] = (x[1]+...+x[n])/n
```

This is proved below:

```
Writing
CMA[n+1] = (n*CMA[n]+x[n+1])/(n+1)
= ((n+1)*CMA[n]-CMA[n])/(n+1) + x[n+1]/(n+1)
= CMA[n]*(1-1/(n+1))+x[n+1]*1/(n+1)
= CMA[n]*(1-factor) + x(n+1)*factor
```

### normMeanVarDesc

Inputs. Tensor descriptor used for following tensors: resultRunningMean, resultRunningVariance, resultSaveMean, resultSaveInvVariance.

### \*resultRunningMean, \*resultRunningVariance

*Inputs/Outputs*. Pointers to the running mean and running variance data. Both these pointers can be NULL but only at the same time. The value stored in resultRunningVariance (or passed as an input in inference mode) is the sample variance and is the moving average of variance [x] where the variance is computed either over batch or spatial+batch dimensions depending on the mode. If these pointers are not NULL, the tensors should be initialized to some reasonable values or to 0.

### epsilon

Input. Epsilon value used in the normalization formula. Its value should be equal to or greater than zero.

# \*resultSaveMean, \*resultSaveInvVariance

Outputs. Optional cache parameters containing saved intermediate results computed during the forward pass. For this to work correctly, the layer's x and normScale, normBias data has to remain unchanged until this backward function is called. Note that both these parameters can be NULL but only at the same time. It is recommended to use this cache since the memory overhead is relatively small.

### activationDesc

Input. The tensor descriptor for the activation operation. When the normOps input is set to either CUDNN NORM OPS NORM ACTIVATION OR CUDNN NORM OPS NORM ADD ACTIVATION then this activation is used, otherwise the user may pass NULL.

### \*workspace, workSpaceSizeInBytes

Inputs. \*workspace is a pointer to the GPU workspace, and workSpaceSizeInBytes is the size of the workspace. When \*workspace is not NULL and \*workSpaceSizeInBytes is large enough, and the tensor layout is NHWC and the data type configuration is supported, then this function will trigger a semi-persistent NHWC kernel for normalization. The workspace is not required to be clean. Also, the workspace does not need to remain unchanged between the forward and backward passes.

### \*reserveSpace

*Input.* Pointer to the GPU workspace for the reserveSpace.

### reserveSpaceSizeInBytes

Input. The size of the reserveSpace. Must be equal or larger than the amount required by <u>cudnnGetNormalizationTrainingReserveSpaceSize()</u>.

### groutCnt

Input. Only support 1 for now.

# Returns

# CUDNN STATUS SUCCESS

The computation was performed successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

One of the pointers alpha, beta, xData, yData, normScale, and normBias is NULL.

- The number of xDesc or yDesc tensor descriptor dimensions is not within the [4,5] range (only 4D and 5D tensors are supported).
- normScaleBiasDesc dimensions are not 1xCx1x1 for 4D and 1xCx1x1x1 for 5D for perchannel mode, and are not 1xCxHxW for 4D and 1xCxDxHxW for 5D for per-activation mode.
- Exactly one of resultSaveMean, resultSaveInvVariance pointers are NULL.
- Exactly one of resultRunningMean, resultRunningInvVariance pointers are NULL.
- epsilon value is less than zero.
- Dimensions or data types mismatch for xDesc, yDesc.

#### 4.1.17. cudnnOpsTrainVersionCheck()

```
cudnnStatus t cudnnOpsTrainVersionCheck(void)
```

This function checks whether the version of the OpsTrain subset of the library is consistent with the other sub-libraries.

### Returns

### CUDNN STATUS SUCCESS

The version is consistent with other sub-libraries.

# CUDNN STATUS VERSION MISMATCH

The version of OpsTrain is not consistent with other sub-libraries. Users should check the installation and make sure all sub-component versions are consistent.

#### 4.1.18. cudnnPoolingBackward()

```
cudnnStatus t cudnnPoolingBackward(
   cudnnHandle t
                                        handle,
   const cudnnPoolingDescriptor t
                                        poolingDesc,
                                       *alpha,
   const void
   const cudnnTensorDescriptor t
                                        yDesc,
   const void
                                       *y,
   const cudnnTensorDescriptor t
                                        dyDesc,
                                       *dy,
   const void
   const cudnnTensorDescriptor t
                                       xDesc.
   const void
                                       *xData,
                                       *beta,
   const void
   const cudnnTensorDescriptor t
                                       dxDesc,
```

This function computes the gradient of a pooling operation.

As of cuDNN version 6.0, a deterministic algorithm is implemented for max backwards pooling. This algorithm can be chosen via the pooling mode enum of poolingDesc. The deterministic algorithm has been measured to be up to 50% slower than the legacy max backwards pooling algorithm, or up to 20% faster, depending upon the use case.



Note: All tensor formats are supported, best performance is expected when using HW-packed tensors. Only 2 and 3 spatial dimensions are allowed

# **Parameters**

### handle

*Input*. Handle to a previously created cuDNN context.

# poolingDesc

Input. Handle to the previously initialized pooling descriptor.

# alpha, beta

*Input*. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

### yDesc

*Input.* Handle to the previously initialized input tensor descriptor.

У

Input. Data pointer to GPU memory associated with the tensor descriptor yDesc.

### dyDesc

*Input.* Handle to the previously initialized input differential tensor descriptor.

dу

Input. Data pointer to GPU memory associated with the tensor descriptor dyData.

### xDesc

*Input.* Handle to the previously initialized output tensor descriptor.

x

Input. Data pointer to GPU memory associated with the output tensor descriptor xDesc.

# dxDesc

*Input.* Handle to the previously initialized output differential tensor descriptor.

dх

Output. Data pointer to GPU memory associated with the output tensor descriptor dxDesc.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

The dimensions n, c, h, w of the yDesc and dyDesc tensors differ.

- The strides nStride, cStride, hStride, wStride of the yDesc and dyDesc tensors differ.
- The dimensions n, c, h, w of the dxDesc and dxDesc tensors differ.
- The strides nStride, cStride, hStride, wStride of the xDesc and dxDesc tensors differ.
- The datatype of the four tensors differ.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

► The wStride of input tensor or output tensor is not 1.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# cudnnSoftmaxBackward()

```
cudnnStatus t cudnnSoftmaxBackward(
   cudnnHandle t
                                    handle,
   cudnnSoftmaxAlgorithm t
                                    algorithm,
   cudnnSoftmaxMode t
                                    mode,
   const void
                                   *alpha,
   const cudnnTensorDescriptor t
                                   yDesc,
   const void
                                   *yData,
   const cudnnTensorDescriptor t
                                    dyDesc,
                                   *dy,
   const void
   const void
                                   *beta,
   const cudnnTensorDescriptor_t
                                   dxDesc,
```

This routine computes the gradient of the softmax function.



### Note:

- ▶ In-place operation is allowed for this routine; meaning, dy and dx pointers may be equal. However, this requires dyDesc and dxDesc descriptors to be identical (particularly, the strides of the input and output must match for in-place operation to be allowed).
- All tensor formats are supported for all modes and algorithms with 4 and 5D tensors. Performance is expected to be highest with NCHW fully-packed tensors. For more than 5 dimensions tensors must be packed in their spatial dimensions.

# **Parameters**

### handle

*Input.* Handle to a previously created cuDNN context.

#### algorithm

*Input*. Enumerant to specify the softmax algorithm.

#### mode

*Input*. Enumerant to specify the softmax mode.

# alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see the <u>Scaling Parameters</u> section in the *cuDNN Developer Guide*.

### yDesc

*Input.* Handle to the previously initialized input tensor descriptor.

У

Input. Data pointer to GPU memory associated with the tensor descriptor yDesc.

### dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

dy

Input. Data pointer to GPU memory associated with the tensor descriptor dyData.

### dxDesc

*Input.* Handle to the previously initialized output differential tensor descriptor.

dx

Output. Data pointer to GPU memory associated with the output tensor descriptor dxDesc.

### Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- The dimensions n, c, h, w of the yDesc, dyDesc and dxDesc tensors differ.
- The strides nStride, cStride, hStride, wStride of the yDesc and dyDesc tensors differ.
- ▶ The datatype of the three tensors differs.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 4.1.20. cudnnSpatialTfGridGeneratorBackward()

This function computes the gradient of a grid generation operation.



Note: Only 2d transformation is supported.

### **Parameters**

### handle

*Input*. Handle to a previously created cuDNN context.

### stDesc

Input. Previously created spatial transformer descriptor object.

# dgrid

Input. Data pointer to GPU memory contains the input differential data.

### dtheta

Output. Data pointer to GPU memory contains the output differential data.

### Returns

# CUDNN STATUS SUCCESS

The call was successful.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- handle is NULL.
- One of the parameters dgrid or dtheta is NULL.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

► The dimension of the transformed tensor specified in stDesc > 4.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 4.1.21. cudnnSpatialTfSamplerBackward()

```
cudnnStatus t cudnnSpatialTfSamplerBackward(
   cudnnHandle t
                                                handle,
   const cudnnSpatialTransformerDescriptor t stDesc,
                                               *alpha,
   const void
   const cudnnTensorDescriptor t
                                               xDesc,
   const void
   const void
                                               *beta,
   const cudnnTensorDescriptor t
                                               dxDesc,
                                               *dx,
   void
   const void
                                               *alphaDgrid,
    const cudnnTensorDescriptor t
                                                dyDesc,
   const void
                                               *dy,
   const void
                                               *grid,
                                               *betaDgrid,
   const void
```

This function computes the gradient of a sampling operation.



Note: Only 2d transformation is supported.

# **Parameters**

### handle

*Input.* Handle to a previously created cuDNN context.

### stDesc

Input. Previously created spatial transformer descriptor object.

### alpha, beta

*Input*. Pointers to scaling factors (in host memory) used to blend the source value with prior value in the destination tensor as follows:

```
dstValue = alpha[0]*srcValue + beta[0]*priorDstValue
```

For more information, see the <u>Scaling Parameters</u> section in the *cuDNN Developer Guide*.

### xDesc

*Input.* Handle to the previously initialized input tensor descriptor.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### dxDesc

*Input.* Handle to the previously initialized output differential tensor descriptor.

#### dx

Output. Data pointer to GPU memory associated with the output tensor descriptor dxDesc.

### alphaDgrid, betaDgrid

Input. Pointers to scaling factors (in host memory) used to blend the gradient outputs dgrid with prior value in the destination pointer as follows:

```
dstValue = alpha[0]*srcValue + beta[0]*priorDstValue
```

For more information, see the <u>Scaling Parameters</u> section in the *cuDNN Developer Guide*.

### dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

### dy

Input. Data pointer to GPU memory associated with the tensor descriptor dyDesc.

### grid

*Input*. A grid of coordinates generated by <u>cudnnSpatialTfGridGeneratorForward()</u>.

### dgrid

Output. Data pointer to GPU memory contains the output differential data.

# Returns

# CUDNN\_STATUS\_SUCCESS

The call was successful.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is NULL.
- $\triangleright$  One of the parameters x, dx, y, dy, grid, dgrid is NULL.
- ► The dimension of dy differs from those specified in stDesc.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. See the following for some examples of non-supported configurations:

► The dimension of transformed tensor > 4.

# CUDNN\_STATUS\_EXECUTION\_FAILED

The function failed to launch on the GPU.

# Chapter 5. **cudnn\_cnn\_infer.so**Library

# 5.1. Data Type References

# 5.1.1. Pointer To Opaque Struct Types

# 5.1.1.1. cudnnConvolutionDescriptor\_t

cudnnConvolutionDescriptor\_t is a pointer to an opaque structure holding the description of a convolution operation. <a href="mailto:cudnnCreateConvolutionDescriptor">cudnnCreateConvolutionDescriptor</a>[) is used to create one instance, and <a href="mailto:cudnnSetConvolutionNdDescriptor">cudnnSetConvolutionNdDescriptor</a>[) or <a href="mailto:cudnnSetConvolution2dDescriptor">cudnnSetConvolution2dDescriptor</a>[) must be used to initialize this instance.

# 5.1.2. Struct Types

# 5.1.2.1. cudnnConvolutionBwdDataAlgoPerf\_t

cudnnConvolutionBwdDataAlgoPerf\_t is a structure containing performance results returned by <a href="mailto:cudnnFindConvolutionBackwardDataAlgorithm">cudnnGetConvolutionBackwardDataAlgorithm</a> v7().

# **Data Members**

# cudnnConvolutionBwdDataAlgo\_t algo

The algorithm runs to obtain the associated performance metrics.

### cudnnStatus t status

If any error occurs during the workspace allocation or timing of <a href="mailto:cudnnConvolutionBackwardData[">cudnnConvolutionBackwardData[">cudnnConvolutionBackwardData[">cudnnConvolutionBackwardData[">cudnnConvolutionBackwardData[">cudnnConvolutionBackwardData[">cudnnConvolutionBackwardData[")</a>.

- CUDNN STATUS ALLOC FAILED if any error occurred during workspace allocation or if the provided workspace is insufficient.
- CUDNN STATUS INTERNAL ERROR if any error occurred during timing calculations or workspace deallocation.
- Otherwise, this will be the return status of cudnnConvolutionBackwardData().

#### float time

The execution time of <a href="mailto:cudnnConvolutionBackwardData">cudnnConvolutionBackwardData</a>() (in milliseconds).

### size t memory

The workspace size (in bytes).

### cudnnDeterminism t determinism

The determinism of the algorithm.

# cudnnMathType t mathType

The math type provided to the algorithm.

# int reserved[3]

Reserved space for future properties.

#### 5.1.2.2. cudnnConvolutionFwdAlgoPerf t

cudnnConvolutionFwdAlgoPerf t is a structure containing performance results returned by <a href="mailto:cudnnFindConvolutionForwardAlgorithm">cudnnFindConvolutionForwardAlgorithm</a>) or heuristic results returned by cudnnGetConvolutionForwardAlgorithm v7().

# Data Members

### cudnnConvolutionFwdAlgo t algo

The algorithm runs to obtain the associated performance metrics.

### cudnnStatus t status

If any error occurs during the workspace allocation or timing of <u>cudnnConvolutionForward()</u>, this status will represent that error. Otherwise, this status will be the return status of cudnnConvolutionForward().

- CUDNN STATUS ALLOC FAILED if any error occurred during workspace allocation or if the provided workspace is insufficient.
- ▶ CUDNN STATUS INTERNAL ERROR if any error occurred during timing calculations or workspace deallocation.
- Otherwise, this will be the return status of cudnnConvolutionForward().

### float time

The execution time of cudnnConvolutionForward() (in milliseconds).

### size t memory

The workspace size (in bytes).

### cudnnDeterminism t determinism

The determinism of the algorithm.

### cudnnMathType t mathType

The math type provided to the algorithm.

### int reserved[3]

Reserved space for future properties.

#### 5.1.3. **Enumeration Types**

#### 5.1.3.1. cudnnBackendAttributeName t

cudnnBackendAttributeName t is an enumerated type that indicates the backend descriptor attributes that can be set or get via cudnnBackendSetAttribute() and <u>cudnnBackendGetAttribute[]</u> functions. The backend descriptor to which an attribute belongs is identified by the prefix of the attribute name.

```
typedef enum {
    CUDNN ATTR POINTWISE MODE
    CUDNN ATTR POINTWISE MATH PREC
    CUDNN ATTR POINTWISE NAN PROPAGATION = 2,
    CUDNN_ATTR_POINTWISE_RELU_LOWER_CLIP = 3,
    CUDNN ATTR POINTWISE RELU UPPER CLIP = 4,
    CUDNN_ATTR_CONVOLUTION_COMP_TYPE = 100,
CUDNN_ATTR_CONVOLUTION_CONV_MODE = 101,
CUDNN_ATTR_CONVOLUTION_DILATIONS = 102,
    CUDNN_ATTR_CONVOLUTION_FILTER_STRIDES = 103,
CUDNN_ATTR_CONVOLUTION_POST_PADDINGS = 104,
    CUDNN ATTR CONVOLUTION PRE PADDINGS = 105,
    CUDNN ATTR CONVOLUTION SPATIAL DIMS
    CUDNN ATTR ENGINEHEUR MODE
                                                 = 200.
    CUDNN_ATTR_ENGINEHEUR_OPERATION GRAPH = 201,
    CUDNN_ATTR_ENGINEHEUR_RESULTS = 202,
    CUDNN ATTR ENGINECFG ENGINE
                                                  = 300,
    CUDNN ATTR ENGINECFG INTERMEDIATE INFO = 301, CUDNN ATTR ENGINECFG KNOB CHOICES = 302,
    CUDNN ATTR EXECUTION PLAN HANDLE
                                                                   = 400,
    CUDNN ATTR EXECUTION PLAN ENGINE CONFIG
                                                                   = 401,
    CUDNN_ATTR_EXECUTION_PLAN_WORKSPACE_SIZE
                                                                   = 402.
    CUDNN ATTR EXECUTION PLAN COMPUTED INTERMEDIATE UIDS = 403,
    CUDNN ATTR EXECUTION PLAN RUN ONLY INTERMEDIATE UIDS = 404,
    CUDNN ATTR INTERMEDIATE INFO UNIQUE ID
                                                                = 500.
                                                                = 501,
    CUDNN_ATTR_INTERMEDIATE_INFO_SIZE
    CUDNN_ATTR_INTERMEDIATE_INFO_DEPENDENT_DATA_UIDS = 502, CUDNN_ATTR_INTERMEDIATE_INFO_DEPENDENT_ATTRIBUTES = 503,
    CUDNN ATTR KNOB CHOICE KNOB TYPE = 600,
    CUDNN_ATTR_KNOB_CHOICE_KNOB_VALUE = 601,
    CUDNN ATTR OPERATION CONVOLUTION FORWARD ALPHA = 700,
```

```
CUDNN_ATTR_OPERATION_CONVOLUTION_FORWARD_BETA = 701, CUDNN_ATTR_OPERATION_CONVOLUTION_FORWARD_CONV_DESC = 702,
       CUDNN ATTR OPERATION CONVOLUTION FORWARD W = 703,
CUDNN ATTR OPERATION CONVOLUTION FORWARD X = 704,
CUDNN ATTR OPERATION CONVOLUTION FORWARD Y = 705,
      CUDNN ATTR OPERATION CONVOLUTION BWD DATA ALPHA = 706,
CUDNN ATTR OPERATION CONVOLUTION BWD DATA BETA = 707,
CUDNN ATTR OPERATION CONVOLUTION BWD DATA CONV DESC = 708,
CUDNN ATTR OPERATION CONVOLUTION BWD DATA W = 709,
CUDNN ATTR OPERATION CONVOLUTION BWD DATA DX = 710,
       CUDNN_ATTR_OPERATION_CONVOLUTION_BWD_DATA_DY
                                                                                                                = 711,
       CUDNN ATTR OPERATION CONVOLUTION BWD FILTER ALPHA = 712, CUDNN ATTR OPERATION CONVOLUTION BWD FILTER BETA = 713,
      CUDNN ATTR OPERATION CONVOLUTION BWD FILTER BETA = 713,
CUDNN ATTR OPERATION CONVOLUTION BWD FILTER CONV DESC = 714,
CUDNN ATTR OPERATION CONVOLUTION BWD FILTER DW = 715,
CUDNN ATTR OPERATION CONVOLUTION BWD FILTER DW = 716,
CUDNN ATTR OPERATION CONVOLUTION BWD FILTER DY = 717,
CUDNN ATTR OPERATION POINTWISE PW DESCRIPTOR = 750,
CUDNN ATTR OPERATION POINTWISE XDESC = 751,
CUDNN ATTR OPERATION POINTWISE BDESC = 752,
CUDNN ATTR OPERATION POINTWISE YDESC = 753,
CUDNN ATTR OPERATION POINTWISE ALPHA1 = 754,
                                                                                                         = 753,
= 754,
= 755,
= 770,
= 771,
= 772,
       CUDNN ATTR OPERATION POINTWISE ALPHA1
       CUDNN ATTR OPERATION POINTWISE ALPHAT
CUDNN ATTR OPERATION POINTWISE ALPHA2
CUDNN ATTR OPERATION GENSTATS MODE
CUDNN ATTR OPERATION GENSTATS XDESC
CUDNN ATTR OPERATION GENSTATS SUMDESC
CUDNN ATTR OPERATION GENSTATS SQSUMDESC
                                                                                                                = 772,
                                                                                                                = 773,
                                                                                                                 = 774,
       CUDNN_ATTR_OPERATIONGRAPH_HANDLE = 800,
CUDNN_ATTR_OPERATIONGRAPH_OPS = 801,
       CUDNN ATTR OPERATIONGRAPH ENGINE GLOBAL COUNT = 802,
       CUDNN ATTR TENSOR BYTE ALIGNMENT = 900,

CUDNN ATTR TENSOR DATA TYPE = 901,

CUDNN ATTR TENSOR DIMENSIONS = 902,

CUDNN ATTR TENSOR STRIDES = 903,

CUDNN ATTR TENSOR VECTOR COUNT = 904,
       CUDNN_ATTR_TENSOR_VECTORIZED_DIMENSION = 905,
       CUDNN ATTR TENSOR UNIQUE ID = 906,
CUDNN ATTR TENSOR IS VIRTUAL = 907,
       CUDNN ATTR TENSOR IS VIRTUAL
       CUDNN_ATTR_VARIANT_PACK_UNIQUE_IDS = 1000,
       CUDNN ATTR VARIANT PACK DATA POINTERS = 1001,
CUDNN ATTR VARIANT PACK INTERMEDIATES = 1002,
CUDNN ATTR VARIANT PACK WORKSPACE = 1003,
       CUDNN ATTR LAYOUT INFO TENSOR UID = 1100,
       CUDNN ATTR LAYOUT INFO TYPES = 1101,
       CUDNN ATTR KNOB INFO TYPE
       CUDNN ATTR KNOB INFO MAXIMUM VALUE = 1201,
       CUDNN ATTR KNOB INFO MINIMUM VALUE = 1202,
       CUDNN_ATTR_KNOB_INFO_STRIDE = 1203,
       CUDNN ATTR ENGINE OPERATION GRAPH = 1300,
       CUDNN_ATTR_ENGINE_GLOBAL_INDEX = 1301,
       CUDNN ATTR ENGINE KNOB INFO
                                                                          = 1302,
       CUDNN_ATTR_ENGINE_NUMERICAL_NOTE = 1303,
       CUDNN_ATTR_ENGINE_LAYOUT_INFO = 1304
} cudnnBackendAttributeName t;
```

# 5.1.3.2. cudnnBackendAttributeType\_t

cudnnBackendAttributeType\_t is an enumerated type that indicates type of backend descriptor attributes that can be set and get via <a href="mailto:cudnnBackendSetAttribute">cudnnBackendGetAttribute()</a> functions.

```
typedef enum {
    CUDNN_TYPE_HANDLE = 0,
CUDNN_TYPE_DATA_TYPE,
    CUDNN TYPE BOOLEAN,
    CUDNN TYPE INT64,
    CUDNN_TYPE_FLOAT,
    CUDNN_TYPE_DOUBLE,
    CUDNN_TYPE_VOID_PTR,
CUDNN_TYPE_CONVOLUTION_MODE,
    CUDNN TYPE HEUR MODE,
    CUDNN TYPE KNOB TYPE,
    CUDNN_TYPE_NAN_PROPOGATION,
    CUDNN_TYPE_NUMERICAL_NOTE, CUDNN_TYPE_LAYOUT_TYPE,
    CUDNN TYPE ATTRIB NAME,
    CUDNN TYPE POINTWISE MODE,
    CUDNN_TYPE_BACKEND_DESCRIPTOR,
    CUDNN_TYPE_GENSTATS_MODE
} cudnnBackendAttributeType t;
```

# 5.1.3.3. cudnnBackendDescriptorType\_t

cudnnBackendDescriptor\_t is an enumerated type that indicates type of backend descriptors. Users create a backend descriptor of a particular type by passing a value from this enumerate to <a href="mailto:cudnnBackendCreateDescriptor">cudnnBackendCreateDescriptor</a> function.

```
typedef enum {
    CUDNN BACKEND POINTWISE DESCRIPTOR = 0,
    CUDNN BACKEND CONVOLUTION DESCRIPTOR,
    CUDNN BACKEND ENGINE DESCRIPTOR,
    CUDNN BACKEND ENGINECFG DESCRIPTOR,
    CUDNN_BACKEND_ENGINEHEUR_DESCRIPTOR,
    CUDNN BACKEND EXECUTION PLAN DESCRIPTOR,
    CUDNN BACKEND INTERMEDIATE INFO DESCRIPTOR,
    CUDNN BACKEND KNOB CHOICE DESCRIPTOR,
    CUDNN BACKEND KNOB INFO DESCRIPTOR,
    CUDNN_BACKEND_LAYOUT_INFO_DESCRIPTOR,
    CUDNN_BACKEND_OPERATION_CONVOLUTION_FORWARD_DESCRIPTOR, CUDNN_BACKEND_OPERATION_CONVOLUTION_BACKWARD_FILTER_DESCRIPTOR,
    CUDNN BACKEND OPERATION CONVOLUTION BACKWARD DATA DESCRIPTOR,
    CUDNN BACKEND OPERATION POINTWISE DESCRIPTOR,
    CUDNN_BACKEND_OPERATION_GEN_STATS_DESCRIPTOR,
    CUDNN_BACKEND_OPERATIONGRAPH_DESCRIPTOR, CUDNN_BACKEND_VARIANT_PACK_DESCRIPTOR,
    CUDNN BACKEND TENSOR DESCRIPTOR,
} cudnnBackendDescriptorType t;
```

# 5.1.3.4. cudnnBackendHeurMode t

cudnnBackendHeurMode\_t is an enumerated type that indicates the operation mode of a CUDNN BACKEND ENGINE HEUR DESCRIPTOR.

```
typedef enum {
   CUDNN_HEUR_MODE_INSTANT = 0
}
```

# 5.1.3.5. cudnnBackendKnobType\_t

cudnnBackendKnobType\_t is an enumerated type that indicates the type of performance knobs. Performance knobs are runtime settings to an engine that will affect its performance. Users can query for an array of performance knobs and their valid value range from a CUDNN\_BACKEND\_ENGINE\_DESCRIPTOR using <a href="cudnnBackendGetAttribute">cudnnBackendGetAttribute()</a> function. Users can set the choice for each knob using the <a href="cudnnBackendSetAttribute()">cudnnBackendSetAttribute()</a> function with a <a href="cudnnBackendSetAttribute()">cudnnBackendSetAttribute()</a> function with a

# 5.1.3.6. cudnnBackendLayoutType\_t

cudnnBackendLayoutType\_t is an enumerated type that indicates queryable layout requirements of an engine. Users can query for layout requirements from a CUDNN BACKEND ENGINE DESC descriptor using <a href="mailto:cudnnBackendGetAttribute">cudnnBackendGetAttribute</a> function.

```
typedef enum {
   CUDNN LAYOUT TYPE PREFERRED NCHW = 0,
   CUDNN LAYOUT TYPE PREFERRED NHWC = 1,
   CUDNN LAYOUT TYPE PREFERRED PAD4CK = 2,
   CUDNN LAYOUT TYPE PREFERRED PAD8CK = 3,
   CUDNN LAYOUT TYPE COUNT = 4,
} cudnnBackendLayoutType t;
```

# 5.1.3.7. cudnnBackendNumericalNote\_t

cudnnBackendNumericalNot\_t is an enumerated type that indicates queryable numerical properties of an engine. Users can query for an array of numerical notes from an CUDNN BACKEND ENGINE DESC using <a href="mailto:cudnnBackendGetAttribute()">cudnnBackendGetAttribute()</a> function.

```
typedef enum {
    CUDNN_NUMERICAL_NOTE_TENSOR_CORE = 0,
    CUDNN_NUMERICAL_NOTE_DOWN_CONVERT_INPUTS,
    CUDNN_NUMERICAL_NOTE_REDUCED_PRECISION_REDUCTION,
    CUDNN_NUMERICAL_NOTE_FFT,
    CUDNN_NUMERICAL_NOTE_NONDETERMINISTIC,
    CUDNN_NUMERICAL_NOTE_WINOGRAD,
    CUDNN_NUMERICAL_NOTE_TYPE_COUNT
```

# 5.1.3.8. cudnnConvolutionBwdDataAlgo t

cudnnConvolutionBwdDataAlgo\_t is an enumerated type that exposes the different algorithms available to execute the backward data convolution operation.

### Values

# CUDNN\_CONVOLUTION\_BWD\_DATA\_ALGO\_0

This algorithm expresses the convolution as a sum of matrix products without actually explicitly forming the matrix that holds the input tensor data. The sum is done using the atomic add operation, thus the results are non-deterministic.

# CUDNN\_CONVOLUTION\_BWD\_DATA\_ALGO\_1

This algorithm expresses the convolution as a matrix product without actually explicitly forming the matrix that holds the input tensor data. The results are deterministic.

# CUDNN\_CONVOLUTION\_BWD\_DATA\_ALGO\_FFT

This algorithm uses a Fast-Fourier Transform approach to compute the convolution. A significant memory workspace is needed to store intermediate results. The results are deterministic.

# CUDNN\_CONVOLUTION\_BWD\_DATA\_ALGO\_FFT\_TILING

This algorithm uses the Fast-Fourier Transform approach but splits the inputs into tiles. A significant memory workspace is needed to store intermediate results but less than CUDNN\_CONVOLUTION\_BWD\_DATA\_ALGO\_FFT for large size images. The results are deterministic.

# CUDNN CONVOLUTION BWD DATA ALGO WINOGRAD

This algorithm uses the Winograd Transform approach to compute the convolution. A reasonably sized workspace is needed to store intermediate results. The results are deterministic.

# CUDNN CONVOLUTION BWD DATA ALGO WINOGRAD NONFUSED

This algorithm uses the Winograd Transform approach to compute the convolution. A significant workspace may be needed to store intermediate results. The results are deterministic.

# 5.1.3.9. cudnnConvolutionBwdFilterAlgo t

cudnnConvolutionBwdFilterAlgo\_t is an enumerated type that exposes the different algorithms available to execute the backward filter convolution operation.

### Values

# CUDNN CONVOLUTION BWD FILTER ALGO 0

This algorithm expresses the convolution as a sum of matrix products without actually explicitly forming the matrix that holds the input tensor data. The sum is done using the atomic add operation, thus the results are non-deterministic.

# CUDNN CONVOLUTION BWD FILTER ALGO 1

This algorithm expresses the convolution as a matrix product without actually explicitly forming the matrix that holds the input tensor data. The results are deterministic.

# CUDNN CONVOLUTION BWD FILTER ALGO FFT

This algorithm uses the Fast-Fourier Transform approach to compute the convolution. A significant workspace is needed to store intermediate results. The results are deterministic.

# CUDNN CONVOLUTION BWD FILTER ALGO 3

This algorithm is similar to CUDNN CONVOLUTION BWD FILTER ALGO 0 but uses some small workspace to precompute some indices. The results are also non-deterministic.

# CUDNN\_CONVOLUTION\_BWD\_FILTER\_WINOGRAD\_NONFUSED

This algorithm uses the Winograd Transform approach to compute the convolution. A significant workspace may be needed to store intermediate results. The results are deterministic.

# CUDNN CONVOLUTION BWD FILTER ALGO FFT TILING

This algorithm uses the Fast-Fourier Transform approach to compute the convolution but splits the input tensor into tiles. A significant workspace may be needed to store intermediate results. The results are deterministic.

# 5.1.3.10. cudnnConvolutionFwdAlgo\_t

cudnnConvolutionFwdAlgo t is an enumerated type that exposes the different algorithms available to execute the forward convolution operation.

# **Values**

# CUDNN CONVOLUTION FWD ALGO IMPLICIT GEMM

This algorithm expresses the convolution as a matrix product without actually explicitly forming the matrix that holds the input tensor data.

# CUDNN CONVOLUTION FWD ALGO IMPLICIT PRECOMP GEMM

This algorithm expresses convolution as a matrix product without actually explicitly forming the matrix that holds the input tensor data, but still needs some memory workspace to precompute some indices in order to facilitate the implicit construction of the matrix that holds the input tensor data.

### CUDNN CONVOLUTION FWD ALGO GEMM

This algorithm expresses the convolution as an explicit matrix product. A significant memory workspace is needed to store the matrix that holds the input tensor data.

# CUDNN\_CONVOLUTION\_FWD\_ALGO\_DIRECT

This algorithm expresses the convolution as a direct convolution (for example, without implicitly or explicitly doing a matrix multiplication).

# CUDNN\_CONVOLUTION\_FWD\_ALGO\_FFT

This algorithm uses the Fast-Fourier Transform approach to compute the convolution. A significant memory workspace is needed to store intermediate results.

# CUDNN CONVOLUTION FWD ALGO FFT TILING

This algorithm uses the Fast-Fourier Transform approach but splits the inputs into tiles. A significant memory workspace is needed to store intermediate results but less than CUDNN\_CONVOLUTION\_FWD\_ALGO\_FFT for large size images.

# CUDNN CONVOLUTION FWD ALGO WINOGRAD

This algorithm uses the Winograd Transform approach to compute the convolution. A reasonably sized workspace is needed to store intermediate results.

# CUDNN\_CONVOLUTION\_FWD\_ALGO\_WINOGRAD\_NONFUSED

This algorithm uses the Winograd Transform approach to compute the convolution. A significant workspace may be needed to store intermediate results.

# 5.1.3.11. cudnnConvolutionMode t

cudnnConvolutionMode\_t is an enumerated type used by <a href="mailto:cudnnSetConvolution2dDescriptor">cudnnSetConvolution2dDescriptor</a>() to configure a convolution descriptor. The filter used for the convolution can be applied in two different ways, corresponding mathematically to a convolution or to a cross-correlation. (A cross-correlation is equivalent to a convolution with its filter rotated by 180 degrees.)

# **Values**

# CUDNN CONVOLUTION

In this mode, a convolution operation will be done when applying the filter to the images.

# CUDNN CROSS CORRELATION

In this mode, a cross-correlation operation will be done when applying the filter to the images.

# 5.1.3.12. cudnnGenStatsMode t

cudnnGenStatsMode\_t is an enumerated type to indicate the statistics mode in the backend statistics generation operation.

### Values

# CUDNN GENSTATS SUM SQSUM

In this mode, the sum and sum of squares of the input tensor along the specified dimensions are computed and written out. The reduction dimensions currently supported are limited per channel, however additional support may be added upon request.

# 5.1.3.13. cudnnPointwiseMode t

cudnnPointwiseMode t is an enumerated type to indicate the intended pointwise math operation in the backend pointwise operation descriptor.

# **Values**

# CUDNN POINTWISE ADD

In this mode, a pointwise add between two tensors is computed.

# CUDNN POINTWISE MUL

In this mode, a pointwise multiplication between two tensors is computed.

### CUDNN POINTWISE MIN

In this mode, a pointwise minimum is taken between two tensors.

# CUDNN POINTWISE MAX

In this mode, a pointwise max is taken between two tensors.

### CUDNN POINTWISE SQRT

In this mode, a pointwise square root of the input tensor is computed.

# CUDNN POINTWISE IDENTITY FWD

In this mode, an identity activation (pointwise value copy) is performed.

# CUDNN POINTWISE RELU FWD

In this mode, a pointwise ReLu activation is computed.

### CUDNN POINTWISE TANH FWD

In this mode, a pointwise tanh activation is computed.

# CUDNN POINTWISE SIGMOID FWD

In this mode, a pointwise sigmoid activation is computed.

# CUDNN POINTWISE ELU FWD

In this mode, a pointwise Exponential Linear Unit activation is computed.

# 5.1.3.14. cudnnReorderType\_t

```
typedef enum {
  CUDNN_DEFAULT_REORDER = 0,
```

```
CUDNN_NO_REORDER = 1,
} cudnnReorderType t;
```

 ${\tt cudnnReorderType\_t} \ is an enumerated type to set the convolution reordering type. The reordering type can be set by <math display="block">{\tt cudnnSetConvolutionReorderType[]} \ and its status can be read by \\ {\tt cudnnGetConvolutionReorderType[]}.$ 

# 5.1.4. Data Types Found In cudnn\_backend.h

# 5.1.4.1. cudnnBackendDescriptor t

cudnnBackendDescriptor\_t is a typedef void pointer to one of many opaque descriptor structures. The type of structure that it points to is determined by the argument when allocating the memory for the opaque structure using <a href="mailto:cudnnBackendCreateDescriptor">cudnnBackendCreateDescriptor</a>[].

Attributes of a descriptor can be set using <a href="cudnnBackendSetAttribute">cudnnBackendSetAttribute</a>). After all required attributes of a descriptor are set, the descriptor can be finalized by <a href="cudnnBackendFinalizeDescriptor">cudnnBackendFinalizeDescriptor</a>(). From a finalized descriptor, one can query its queryable attributes using <a href="cudnnBackendGetAttribute">cudnnBackendGetAttribute</a>(). Finally, the memory allocated for a descriptor can be freed using <a href="cudnnBackendDestroyDescriptor">cudnnBackendDestroyDescriptor</a>().

# 5.2. API Functions

# 5.2.1. cudnnBackendCreateDescriptor()

cudnnStatus\_t cudnnBackendCreateDescriptor(cudnnBackendDescriptorType\_t
descriptorType, cudnnBackendDescriptor t \*descriptor)

This function allocates memory:

- ▶ in the descriptor for a given descriptor type
- at the location pointed by the descriptor



Note: The void \* is a pointer to the cudnnBackend t.

# **Parameters**

### descriptorType

Input. One among the enumerated <u>cudnnBackendDescriptorType\_t</u>.

### descriptor

*Input.* Pointer to an instance of <u>cudnnBackendDescriptor</u> to be created.

# Returns

### CUDNN\_STATUS\_SUCCESS

The creation was successful.

# CUDNN STATUS NOT SUPPORTED

Creating a descriptor of a given type is not supported.

# CUDNN\_STATUS\_ALLOC\_FAILED

The memory allocation failed.

# 5.2.2. cudnnBackendDestroyDescriptor()

cudnnStatus t cudnnBackendDestroyDescriptor(cudnnBackendDescriptor tdescriptor)

This function destroys instances of <u>cudnnBackendDescriptor\_t</u> that were previously created using <u>cudnnBackendCreateDescriptor()</u>.

### **Parameters**

### descriptor

*Input.* Instance of <u>cudnnBackendDescriptor</u> t previously created by <u>cudnnBackendCreateDescriptor()</u>.

### Returns

# CUDNN STATUS SUCCESS

The memory was destroyed successfully.

# CUDNN STATUS ALLOC FAILED

The destruction of memory failed.

### Undefined Behavior

The descriptor was altered between the Create and Destroy Descriptor.

### Undefined

The value pointed by the descriptor will be Undefined after the memory is free and done.

# 5.2.3. cudnnBackendExecute()

cudnnStatus\_ cudnnBackendExecute(cudnnHandle\_t handle, cudnnBackendDescriptor\_t
 executionPlan, cudnnBackendDescriptor\_t varianPack)

This function executes:

- ▶ the given Engine Configuration Plan on the VariantPack
- the finalized ExecutionPlan on the data

The data and the working space are encapsulated in the VariantPack.

### **Parameters**

### executionPlan

*Input*. Pointer to the cuDNN handle to be destroyed.

### variantPack

Input. Pointer to the finalized VariantPack consisting of:

- Data pointer for each non-virtual pointer of the operation set in the execution plan.
- Pointer to user-allocated workspace in global memory at least as large as the size queried from CUDNN BACKEND .

# Returns

### CUDNN STATUS SUCCESS

The ExecutionPlan was executed successfully.

### CUDNN STATUS BAD PARAM

An incorrect or inconsistent value is encountered. Some examples:

A required data pointer is invalid.

# CUDNN STATUS INTERNAL ERROR

Some internal errors were encountered.

# CUDNN STATUS EXECUTION FAILED

An error was encountered executing the plan with the variant pack.

#### 5 2 4 cudnnBackendFinalize()

cudnnStatus t cudnnbBackendFinalize(cudnnBackendDescriptor descriptor)

This function finalizes the memory pointed to by the descriptor. The type of finalization is done depending on the descriptorType argument with which the descriptor was created using <u>cudnnBackendCreate()</u> or initialized using <u>cudnnBackendInitialize()</u>.

cudnnBackendFinalize() also checks all the attributes set between the create/ initialization and finalize phase. If successful, cudnnBackendFinalize() returns CUDNN STATUS SUCCESS and the finalized state of the descriptor is set to true. In this state, setting attributes using cudnnBackendSetAttribute() is not allowed. Getting attributes using <u>cudnnBackendGetAttribute()</u> is only allowed when the finalized state of the descriptor is true.

### **Parameters**

### descriptor

Input. Instance of cudnnBackendDescriptor t to finalize.

### Returns

# CUDNN STATUS SUCCESS

The descriptor was finalized successfully.

# CUDNN STATUS BAD PARAM

Invalid descriptor attribute values or combination thereof is encountered.

### CUDNN STATUS NOT SUPPORTED

Descriptor attribute values or combinations therefore not supported by the current version of cuDNN is encountered.

### CUDNN STATUS INTERNAL ERROR

Some internal errors are encountered.

#### 5 2 5 cudnnBackendGetAttribute()

```
cudnnStatus t cudnnBackendGetAttribute(
    cudnnBackendDescriptor_t descriptor,
    cudnnBackendAttributeName t attributeName,
    cudnnBackendAttributeType_t attributeType,
    int64_t requestedElementCount,
int64_t *elementCount,
void *arrayOfElements);
```

This function retrieves the value(s) of an attribute of a descriptor. attributeName is the name of the attribute whose value is requested. The attributeType is the type of attribute. requestsedElementCount is the number of elements to be potentially retrieved. The number of elements for the requested attribute is stored in elementCount. The retrieved values are stored in arrayOfElements. When the attribute is expected to have a single value, arrayOfElements can be pointer to the output value. This function will return CUDNN STATUS NOT INTIALIZED if the descriptor was already successfully finalized.

### **Parameters**

# descriptor

Input. Instance of cudnnBackendDescriptor t whose attribute the user wants to retrieve.

### attributeName

*Input.* The name of the attribute being get from the on the descriptor.

### attributeType

Input. The type of attribute.

### requestedElementCount

*Input.* Number of elements to output to arrayOfElements.

### elementCount

*Input.* Output pointer for the number of elements the descriptor attribute has. Note that cudnnBackendGetAttribute () will only write the least of this and requestedElementCount elements to arrayOfElements.

### arrayOfElements

Input. Output pointer to element of attribute type.

# Returns

# CUDNN STATUS SUCCESS

The attributeName was given to the descriptor successfully.

# CUDNN\_STATUS\_BAD\_PARAM

One or more invalid or inconsistent argument values was encountered. Some examples:

- ▶ attributeName is not a valid attribute for the descriptor.
- attributeType is not one of the valid types for the attribute.

# CUDNN STATUS NOT INITIALIZED

The descriptor has not been successfully finalized using cudnnBackendFinalize().

#### 5.2.6. cudnnBackendInitialize()

cudnnStatus t cudnnBackendInitialize(cudnnBackendDescriptor t descriptor, cudnnBackendDescriptorType t descriptorType, size t sizeInBytes)

This function repurposes a pre-allocated memory pointed to by a descriptor of size sizeInByte to a backend descriptor of type descriptorType. The necessary size for a descriptor type can be acquired by calling the function cudnnBackendGetSizeOf(). The finalized state of the descriptor is set to false.

### **Parameters**

# descriptor

*Input.* Instance of <u>cudnnBackendDescriptor</u> t to be initialized.

# descriptorType

Input. Enumerated value for the type of cuDNN backend descriptor.

### sizeInBytes

*Input.* Size of memory pointed to by descriptor.

### Returns

# CUDNN STATUS SUCCESS

The memory was initialized successfully.

# CUDNN STATUS BAD PARAM

An invalid or inconsistent argument value is encountered. For example:

- descriptor is a nullptr
- sizeInBytes is less than the size required by the descriptor type

#### 5.2.7. cudnnBackendSetAttribute()

```
cudnnStatus t cudnnBackendSetAttribute(
   cudnnBackendDescriptor t descriptor,
   cudnnBackendAttributeName t attributeName,
   cudnnBackendAttributeType_t attributeType,
   int64 t elementCount,
   void *arrayOfElements);
```

This function sets an attribute of a descriptor to value(s) provided as a pointer. descriptor is the descriptor to be set. attributeName is the name of the attribute to be set. attributeType is the type of attribute. The value to which the attribute is set, is pointed by the arrayOfElements. The number of elements is given by elementCount. This function will return CUDNN STATUS NOT INTIALIZED if the descriptor is already successfully finalized using cudnnBackendFinalize().

# **Parameters**

# descriptor

Input. Instance of cudnnBackendDescriptor t whose attribute is being set.

### attributeName

*Input.* The name of the attribute being set on the descriptor.

# attributeType

Input. The type of attribute.

### elementCount

Input. Number of elements being set.

# arrayOfElements

*Input*. The starting location for an array from where to read the values from.

### Returns

# CUDNN STATUS SUCCESS

The attributeName was set to the descriptor.

# CUDNN STATUS NOT INITIALIZED

The backend descriptor pointed to by descriptor is already in finalized state.

# CUDNN STATUS BAD PARAM

The function is called with arguments that correspond to invalid values. Some possible causes are:

- attributeName is not a settable attribute of descriptor
- attributeType is incorrect for this attributeName.
- elemCount value is unexpected.
- arrayOfElements contains values invalid for the attributeType.

### CUDNN STATUS NOT SUPPORTED

The value(s) to which the attributes are being set is not supported by the current version of cuDNN.

# 5.2.8. cudnnConvolutionBackwardData()

```
cudnnStatus t cudnnConvolutionBackwardData(
   cudnnHandle t
                                       handle,
   const void
                                       *alpha,
   const cudnnFilterDescriptor t
                                       wDesc,
                                      *w,
   const void
   const cudnnTensorDescriptor t
                                      dyDesc,
                                      *dy,
   const void
   const cudnnConvolutionDescriptor_t convDesc,
   cudnnConvolutionBwdDataAlgo t
                                       algo,
                                      *workSpace,
   void
   size t
                                      workSpaceSizeInBytes,
                                      *beta,
   const void
   const cudnnTensorDescriptor_t
                                      dxDesc,
                                      *dx)
```

This function computes the convolution data gradient of the tensor dy, where y is the output of the forward convolution in  $\underline{\text{cudnnConvolutionForward}}$ . It uses the specified algo, and returns the results in the output tensor dx. Scaling factors alpha and beta can be used to scale the computed result or accumulate with the current dx.

### **Parameters**

### handle

*Input.* Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

# alpha, beta

*Input*. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see Scaling Parameters in the cuDNN Developer Guide.

#### wDesc

*Input*. Handle to a previously initialized filter descriptor. For more information, see cudnnFilterDescriptor t.

w

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

# dyDesc

*Input*. Handle to the previously initialized input differential tensor descriptor. For more information, see cudnnTensorDescriptor t.

### dy

*Input.* Data pointer to GPU memory associated with the input differential tensor descriptor dyDesc.

### convDesc

*Input.* Previously initialized convolution descriptor. For more information, see <u>cudnnConvolutionDescriptor</u> t.

# algo

*Input*. Enumerant that specifies which backward data convolution algorithm should be used to compute the results. For more information, see <a href="mailto:cudnnConvolutionBwdDataAlgo\_t">cudnnConvolutionBwdDataAlgo\_t</a>.

# workSpace

*Input*. Data pointer to GPU memory to a workspace needed to be able to execute the specified algorithm. If no workspace is needed for a particular algorithm, that pointer can be nil.

### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workSpace.

### dxDesc

*Input*. Handle to the previously initialized output tensor descriptor.

#### dx

*Input/Output*. Data pointer to GPU memory associated with the output tensor descriptor dxDesc that carries the result.

# Supported configurations

This function supports the following combinations of data types for wDesc, dyDesc, convDesc, and dxDesc.

Data Type Configurations	wDesc, dyDesc and dxDesc Data Type	convDesc Data Type
TRUE_HALF_CONFIG (only supported on architectures with true FP16 support, meaning, compute capability 5.3 and later)	CUDNN_DATA_HALF	CUDNN_DATA_HALF
PSEUDO_HALF_CONFIG	CUDNN_DATA_HALF	CUDNN_DATA_FLOAT
FLOAT_CONFIG	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT
DOUBLE_CONFIG	CUDNN_DATA_DOUBLE	CUDNN_DATA_DOUBLE

# Supported algorithms



**Note:** Specifying a separate algorithm can cause changes in performance, support and computation determinism. See the following for a list of algorithm options, and their respective supported parameters and deterministic behavior.

The table below shows the list of the supported 2D and 3D convolutions. The 2D convolutions are described first, followed by the 3D convolutions.

For the following terms, the short-form versions shown in the parentheses are used in the table below, for brevity:

- ► CUDNN CONVOLUTION BWD DATA ALGO 0 (\_ALGO\_0)
- CUDNN CONVOLUTION BWD DATA ALGO 1 (\_ALGO\_1)
- CUDNN CONVOLUTION BWD DATA ALGO FFT (\_FFT)
- ► CUDNN CONVOLUTION BWD DATA ALGO FFT TILING (\_FFT\_TILING)
- ► CUDNN CONVOLUTION BWD DATA ALGO WINOGRAD (\_WINOGRAD)
- ▶ CUDNN CONVOLUTION BWD DATA ALGO WINOGRAD NONFUSED (\_WINOGRAD\_NONFUSED)
- ► CUDNN TENSOR NCHW (\_NCHW)
- CUDNN TENSOR NHWC (\_NHWC)
- ► CUDNN TENSOR NCHW VECT C (\_NCHW\_VECT\_C)

Table 11. For 2D convolutions: wDesc: NHWC

Filter descriptor wDesc: _NHWC (see <a href="mailto:cudnnTensorFormat_t">cudnnTensorFormat_t</a> )						
		Tensor Formats Supported for	Tensor Formats Supported for	_		
Algo Name	(Yes or No)	dyDesc	dxDesc	Supported	Important	
_ALGO_0		NHWC HWC-	NHWC HWC- packed	TRUE_HALF_CON	FIG	
_ALGO_1		packed	packed	PSEUDO_HALF_C	ONFIG	
				FLOAT_CONFIG		

Table 12. For 2D convolutions: wDesc: \_NCHW

Filter descriptor wDesc: _NCHW.					
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
_ALGO_0	No	NCHW CHW- packed	All except _NCHW_VECT_C.	TRUE_HALF_CON PSEUDO_HALF_CONFIG FLOAT_CONFIG DOUBLE_CONFIG	
_ALGO_1	Yes	NCHW CHW- packed	All except _NCHW_VECT_C.	TRUE_HALF_CON PSEUDO_HALF_CONFIG FLOAT_CONFIG DOUBLE_CONFIG	greater than ONFIG O for all dimensions
_FFT	Yes	NCHW CHW-packed	NCHW HW-packed	PSEUDO_HALF_C	obilation: 1 for all dimensions convDesc Group Count Support: Greater than 0 dxDesc feature map height + 2 * convDesc zero-padding height must equal 256 or less dxDesc feature map width + 2 * convDesc zero-padding

Algo Name	tor wDesc: _NCF  Deterministic (Yes or No)	Tensor Formats	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
					width must equal 256 or less convDesc vertical and horizontal filter stride must equal 1 wDesc filter height must be greater than convDesc zero-padding height wDesc filter width must be greater than convDesc zero-padding width
_FFT_TILING	Yes	NCHW CHW-packed	NCHW HW- packed	PSEUDO_HALF_COFIGE TO THE PROOF	Dilation: 1 for all dimensions convDesc Group Count Support: Greater than 0 When neither of wDesc filter dimension is 1, the filter width and height must not be larger than 32 When either of wDesc filter

Filter descriptor wDesc: _NCHW.					
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
					dimension is 1, the largest filter dimension should not exceed 256 convDesc vertical and
					horizontal filter stride must equal 1 when either the filter width or filter height is 1, otherwise, the stride can be 1 or 2
					wDesc filter height must be greater than convDesc zero-padding height
					wDesc filter width must be greater than convDesc zero-padding width
_WINOGRAD	Yes	NCHW CHW- packed	All except _NCHW_VECT_C.	PSEUDO_HALF_C	o <b>Dilation:</b> 1 for all dimensions convDesc Group Count Support:

Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
					convDesc vertical and horizontal filter stride must equal 1 wDesc filter height must be 3 wDesc filter width must be 3
WINOGRAD_NON	F <b>Ves</b> d	NCHW CHW-packed	All except _NCHW_VECT_C.	TRUE_HALF_CON PSEUDO_HALF_CO FLOAT_CONFIG	

Table 13. For 3D convolutions: wDesc: \_NCHW

•	tor wDesc: _NCF		<b>T</b>		
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
		_		• •	•
_ALGO_0	Yes	NCDHW CDHW-packed	All except _NCDHW_VECT_C	PSEUDO_HALF_CONFIG  DOUBLE_CONFIG	greater than 0 for all
					Support: Greater than 0
_ALGO_1	Yes	NCDHW	NCDHW	TRUE_HALF_CON	F <b>Ddation</b> : 1 for
		CDHW-packed	CDHW-packed	PSEUDO_HALF_C	
				FLOAT_CONFIGD	convDesc OUBLE_CONFIG Group Count
					Support:
					Greater than (
_FFT_TILING	Yes	NCDHW CDHW-packed	NCDHW DHW- packed	PSEUDO_HALF_C	o <b>Dilation:</b> 1 for
		obiliw-packed	packed	FLOAT_CONFIG DOUBLE_CONFIG	convDesc Group Count Support: Greater than C
					wDesc filter height must equal 16 or less
					wDesc filter width must equal 16 or less
					wDesc filter depth must equal 16 or less

Filter descriptor wDesc: _NCHW.					
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
					must have all filter strides equal to 1 wDesc filter height must be greater than convDesc zero-padding height wDesc filter width must be greater than convDesc zero-padding width wDesc filter depth must be greater than convDesc zero-padding width wDesc filter depth must be greater than convDesc zero-padding width

Table 14. For 3D convolutions: wDesc: \_NHWC

Filter descriptor wDesc: _NHWC						
Algo Name (3D Convolutions)	Deterministic	Tensor Formats Supported for	Tensor Formats Supported for	Data Type Configurations Supported	Important	
_ALGO_1	Yes	NDHWC	NDHWC	TRUE_HALF_CON	FDdation:	
		DHWC-packed	DHWC-packed	PSEUDO_HALF_COFIG	oreater ONFIG than 0 for all dimensions	

Filter descriptor wDesc: _NHWC						
Algo Name (3D Convolutions)	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important	
					convDesc Group Count Support: Greater than 0	

# Returns

# CUDNN\_STATUS\_SUCCESS

The operation was launched successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- At least one of the following is NULL: handle, dyDesc, wDesc, convDesc, dxDesc, dy, w, dx, alpha, beta
- wDesc and dyDesc have a non-matching number of dimensions
- ▶ wDesc and dxDesc have a non-matching number of dimensions
- ▶ wDesc has fewer than three number of dimensions
- wDesc, dxDesc, and dyDesc have a non-matching data type.
- wDesc and dxDesc have a non-matching number of input feature maps per image (or group in case of grouped convolutions).
- dyDesc spatial sizes do not match with the expected size as determined by cudnnGetConvolutionNdForwardOutputDim

# CUDNN STATUS NOT SUPPORTED

At least one of the following conditions are met:

- dyDesc or dxDesc have a negative tensor striding
- dyDesc, wDesc or dxDesc has a number of dimensions that is not 4 or 5
- ► The chosen algo does not support the parameters provided; see above for an exhaustive list of parameters that support each algo
- dyDesc or wDesc indicate an output channel count that isn't a multiple of group count (if group count has been set in convDesc).

# CUDNN STATUS MAPPING ERROR

An error occurs during the texture binding of the filter data or the input differential tensor

#### CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# 5.2.9. cudnnConvolutionBiasActivationForward()

```
cudnnStatus t cudnnConvolutionBiasActivationForward(
   cudnnHandle t
                                       handle,
   const void
                                      *alpha1,
   const cudnnTensorDescriptor t
                                       xDesc,
                                      *x,
   const void
   const cudnnFilterDescriptor t
                                       wDesc,
                                      *w,
   const void
   const cudnnConvolutionDescriptor t convDesc,
   cudnnConvolutionFwdAlgo_t
                                      *workSpace,
   void
   size t
                                      workSpaceSizeInBytes,
                                      *alpha2,
   const void
   const cudnnTensorDescriptor t
                                       zDesc,
   const void
                                      *z,
   const cudnnTensorDescriptor t
                                       biasDesc,
                                      *bias,
   const void
   const cudnnActivationDescriptor t activationDesc,
   const cudnnTensorDescriptor t
                                      yDesc,
```

This function applies a bias and then an activation to the convolutions or cross-correlations of  $\underline{\text{cudnnConvolutionForward()}}$ , returning results in y. The full computation follows the equation y = act (  $\underline{\text{alpha1}} * \underline{\text{conv}}(x) + \underline{\text{alpha2}} * z + \underline{\text{bias}}$ ).



#### Note:

- The routine <a href="mailto:cudnnGetConvolution2dForwardOutputDim()">cudnnGetConvolutionNdForwardOutputDim()</a> can be used to determine the proper dimensions of the output tensor descriptor <a href="mailto:yDesc">yDesc</a> with respect to <a href="mailto:xDesc">xDesc</a>, <a href="mailto:convDesc">convDesc</a>, and <a href="wDesc">wDesc</a>.
- ▶ Only the CUDNN\_CONVOLUTION\_FWD\_ALGO\_IMPLICIT\_PRECOMP\_GEMM algo is enabled with CUDNN\_ACTIVATION\_IDENTITY. In other words, in the <u>cudnnActivationDescriptor t</u> structure of the input activationDesc, if the mode of the <u>cudnnActivationMode t</u> field is set to the enum value CUDNN\_ACTIVATION\_IDENTITY, then the input <u>cudnnConvolutionFwdAlgo\_t</u> of this function <u>cudnnConvolutionBiasActivationForward()</u> must be set to the enum value CUDNN\_CONVOLUTION\_FWD\_ALGO\_IMPLICIT\_PRECOMP\_GEMM. For more information, see cudnnSetActivationDescriptor().
- Device pointer z and y may be pointing to the same buffer, however, x cannot point to the same buffer as z or y.

### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### alpha1, alpha2

*Input.* Pointers to scaling factors (in host memory) used to blend the computation result of convolution with z and bias as follows:

```
y = act (alpha1 * conv(x) + alpha2 * z + bias)
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### xDesc

*Input*. Handle to a previously initialized tensor descriptor. For more information, see cudnnTensorDescriptor t.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor. For more information, see <a href="mailto:cudnnFilterDescriptor\_t">cudnnFilterDescriptor\_t</a>.

w

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

#### convDesc

*Input.* Previously initialized convolution descriptor. For more information, see <u>cudnnConvolutionDescriptor\_t</u>.

# algo

*Input*. Enumerant that specifies which convolution algorithm should be used to compute the results. For more information, see <u>cudnnConvolutionFwdAlgo\_t</u>.

#### workSpace

*Input*. Data pointer to GPU memory to a workspace needed to be able to execute the specified algorithm. If no workspace is needed for a particular algorithm, that pointer can be nil.

# workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workSpace.

#### zDesc

*Input.* Handle to a previously initialized tensor descriptor.

z

Input. Data pointer to GPU memory associated with the tensor descriptor zDesc.

#### biasDesc

*Input.* Handle to a previously initialized tensor descriptor.

# bias

Input. Data pointer to GPU memory associated with the tensor descriptor biasDesc.

#### activationDesc

*Input.* Handle to a previously initialized activation descriptor. For more information, see <a href="mailto:cudnnActivationDescriptor\_t">cudnnActivationDescriptor\_t</a>.

### yDesc

Input. Handle to a previously initialized tensor descriptor.

У

Input/Output. Data pointer to GPU memory associated with the tensor descriptor yDesc that carries the result of the convolution.

For the convolution step, this function supports the specific combinations of data types for xDesc, wDesc, convDesc, and yDesc as listed in the documentation of <u>cudnnConvolutionForward()</u>. The following table specifies the supported combinations of data types for x, y, z, bias, and alpha1/alpha2.

Table 15. Supported combinations of data types (x = CUDNN DATA)

x	w	convDesc	y and z	bias	alpha1/ alpha2
X_DOUBLE	X_DOUBLE	X_DOUBLE	X_DOUBLE	X_DOUBLE	X_DOUBLE
X_FLOAT	X_FLOAT	X_FLOAT	X_FLOAT	X_FLOAT	X_FLOAT
X_HALF	X_HALF	X_FLOAT	X_HALF	X_HALF	X_FLOAT
X_INT8	X_INT8	X_INT32	X_INT8	X_FLOAT	X_FLOAT
X_INT8	X_INT8	X_INT32	X_FLOAT	X_FLOAT	X_FLOAT
X_INT8x4	X_INT8x4	X_INT32	X_INT8x4	X_FLOAT	X_FLOAT
X_INT8x4	X_INT8x4	X_INT32	X_FLOAT	X_FLOAT	X_FLOAT
X_UINT8	X_INT8	X_INT32	X_INT8	X_FLOAT	X_FLOAT
X_UINT8	X_INT8	X_INT32	X_FLOAT	X_FLOAT	X_FLOAT
X_UINT8x4	X_INT8x4	X_INT32	X_INT8x4	X_FLOAT	X_FLOAT
X_UINT8x4	X_INT8x4	X_INT32	X_FLOAT	X_FLOAT	X_FLOAT
X_INT8x32	X_INT8x32	X_INT32	X_INT8x32	X_FLOAT	X_FLOAT

# Returns

In addition to the error values listed by the documentation of <u>cudnnConvolutionForward()</u>, the possible error values returned by this function and their meanings are listed below.

# CUDNN\_STATUS\_SUCCESS

The operation was launched successfully.

#### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- At least one of the following is NULL: handle, xDesc, wDesc, convDesc, yDesc, zDesc, biasDesc, activationDesc, xData, wData, yData, zData, bias, alpha1, alpha2.
- The number of dimensions of xDesc, wDesc, yDesc, zDesc is not equal to the array length of convDesc + 2.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration. Some examples of non-supported configurations are as follows:

- The mode of activationDesc is neither CUDNN ACTIVATION RELU or CUDNN ACTIVATION\_IDENTITY.
- The relunanopt of activationDesc is not CUDNN NOT PROPAGATE NAN.
- ▶ The second stride of biasDesc is not equal to one.
- The first dimension of biasDesc is not equal to one.
- The second dimension of biasDesc and the first dimension of filterDesc are not equal.
- The data type of biasDesc does not correspond to the data type of yDesc as listed in the above data types table.
- zDesc and destDesc do not match.

#### CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# cudnnConvolutionForward()

```
cudnnStatus t cudnnConvolutionForward(
                                       handle,
   cudnnHandle t
                                      *alpha,
   const void
   const cudnnTensorDescriptor t
                                       xDesc,
                                      *x,
   const void
   const cudnnFilterDescriptor t
                                       wDesc,
                                      *w,
   const. void
   const cudnnConvolutionDescriptor t convDesc,
   cudnnConvolutionFwdAlgo t
                                      algo,
   void
                                      *workSpace,
   size t
                                      workSpaceSizeInBytes,
   const void
                                      *beta,
                                      yDesc,
   const cudnnTensorDescriptor t
                                      * y)
```

This function executes convolutions or cross-correlations over x using filters specified with w, returning results in y. Scaling factors alpha and beta can be used to scale the input tensor and the output tensor respectively.



Note: The routine cudnnGetConvolution2dForwardOutputDim() or cudnnGetConvolutionNdForwardOutputDim() can be used to determine the proper dimensions of the output tensor descriptor yDesc with respect to xDesc, convDesc, and wDesc.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

#### xDesc

Input. Handle to a previously initialized tensor descriptor. For more information, see cudnnTensorDescriptor t.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### wDesc

Input. Handle to a previously initialized filter descriptor. For more information, see cudnnFilterDescriptor t.

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

#### convDesc

Input. Previously initialized convolution descriptor. For more information, see <u>cudnnConvolutionDescriptor\_t</u>.

# algo

Input. Enumerant that specifies which convolution algorithm should be used to compute the results. For more information, see <a href="mailto:cudnnConvolutionFwdAlgo">cudnnConvolutionFwdAlgo</a> t.

### workSpace

Input. Data pointer to GPU memory to a workspace needed to be able to execute the specified algorithm. If no workspace is needed for a particular algorithm, that pointer can be nil.

#### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workSpace.

#### yDesc

*Input.* Handle to a previously initialized tensor descriptor.

# У

*Input/Output*. Data pointer to GPU memory associated with the tensor descriptor yDesc that carries the result of the convolution.

# Supported configurations

This function supports the following combinations of data types for xDesc, wDesc, convDesc, and yDesc.

Table 16. Supported configurations

Data Type Configurations	xDesc and wDesc	convDesc	yDesc
true_HALF_CONFIG (only supported on architectures with true FP16 support, meaning, compute capability 5.3 and later)	CUDNN_DATA_HALF	CUDNN_DATA_HALF	CUDNN_DATA_HALF
PSEUDO_HALF_CONFIG	CUDNN_DATA_HALF	CUDNN_DATA_FLOAT	CUDNN_DATA_HALF
FLOAT_CONFIG	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT
DOUBLE_CONFIG	CUDNN_DATA_DOUBLE	CUDNN_DATA_DOUBLE	CUDNN_DATA_DOUBLE
INT8_CONFIG  (only supported on architectures with DP4A support, meaning, compute capability 6.1 and later)	CUDNN_DATA_INT8	CUDNN_DATA_INT32	CUDNN_DATA_INT8
INT8_EXT_CONFIG [only supported on architectures with DP4A support, meaning, compute capability 6.1 and later]	CUDNN_DATA_INT8	CUDNN_DATA_INT32	CUDNN_DATA_FLOAT
INT8×4_CONFIG (only supported on architectures with DP4A support,	CUDNN_DATA_INT8x4	CUDNN_DATA_INT32	CUDNN_DATA_INT8x4

Data Type			
Configurations	xDesc and wDesc	convDesc	yDesc
meaning, compute capability 6.1 and later)			
INT8x4_EXT_CONFIG (only supported on architectures with DP4A support, meaning, compute capability 6.1 and later)	CUDNN_DATA_INT8x4	CUDNN_DATA_INT32	CUDNN_DATA_FLOAT
UINT8×4_CONFIG (only supported on architectures with DP4A support, meaning, compute capability 6.1 and later)	CUDNN_DATA_UINT8x4	CUDNN_DATA_INT32	CUDNN_DATA_UINT8x4
UINT8×4_EXT_CONFIG (only supported on architectures with DP4A support, meaning, compute capability 6.1 and later)	CUDNN_DATA_UINT8x4	CUDNN_DATA_INT32	CUDNN_DATA_FLOAT
INT8x32_CONFIG (only supported on architectures with IMMA support, meaning compute capability 7.5 and later)	CUDNN_DATA_INT8x32	CUDNN_DATA_INT32	CUDNN_DATA_INT8x32

# Supported algorithms



**Note:** For this function, all algorithms perform deterministic computations. Specifying a separate algorithm can cause changes in performance and support.

The table below shows the list of the supported 2D and 3D convolutions. The 2D convolutions are described first, followed by the 3D convolutions.

For the following terms, the short-form versions shown in the parenthesis are used in the table below, for brevity:

- CUDNN\_CONVOLUTION\_FWD\_ALGO\_IMPLICIT\_GEMM (\_IMPLICIT\_GEMM)
- CUDNN CONVOLUTION FWD ALGO IMPLICIT PRECOMP GEMM (\_IMPLICIT\_PRECOMP\_GEMM)
- ▶ CUDNN CONVOLUTION FWD ALGO GEMM (\_GEMM)
- ▶ CUDNN CONVOLUTION FWD ALGO DIRECT (\_DIRECT)
- ► CUDNN CONVOLUTION FWD ALGO FFT (\_FFT)
- ► CUDNN CONVOLUTION FWD ALGO FFT TILING (\_FFT\_TILING)
- ► CUDNN CONVOLUTION FWD ALGO WINOGRAD (\_WINOGRAD)
- ▶ CUDNN CONVOLUTION FWD ALGO WINOGRAD NONFUSED (\_WINOGRAD\_NONFUSED)
- ► CUDNN TENSOR NCHW (\_NCHW)
- ► CUDNN TENSOR NHWC (\_NHWC)
- CUDNN\_TENSOR\_NCHW\_VECT\_C (\_NCHW\_VECT\_C)

Table 17. For 2D convolutions: wDesc: \_NCHW

Filter descriptor wDesc: \_NCHW (see <a href="mailto:convDesc">convDesc</a> Group count support: Greater than 0, for all algos.

Algo Name	Tensor Formats Supported for xDesc	Tensor Formats Supported for yDesc	Data Type Configurations Supported	Important
_IMPLICIT_GEMM	All except _NCHW_VECT_C.	All except _NCHW_VECT_C.	TRUE_HALF_CONFIG  PSEUDO_HALF_CONF  FLOAT_CONFIG  DOUBLE_CONFIG	<b>Dilation:</b> Greater than 0 for all IG dimensions
_IMPLICIT_PRECOM	PAltenmept _NCHW_VECT_C.	All except _NCHW_VECT_C.	TRUE_HALF_CONFIG PSEUDO_HALF_CONF FLOAT_CONFIG DOUBLE_CONFIG	
_GEMM	All except _NCHW_VECT_C.	All except _NCHW_VECT_C.	PSEUDO_HALF_CONF FLOAT_CONFIG DOUBLE_CONFIG	ɪ <b>Bilation:</b> 1 for all dimensions
_FFT	NCHW HW-packed	NCHW HW-packed	PSEUDO_HALF_CONF	ɪ <b>Bilation:</b> 1 for all dimensions

Filter descriptor wDesc: \_NCHW (see <a href="mailto:convDesc">convDesc</a> Group count support: Greater than 0, for all algos.

convDesc Group	count support: Grea	ater than U, for all a	aigos.	
Algo Name	Tensor Formats Supported for xDesc	Tensor Formats Supported for yDesc	Data Type Configurations Supported	Important
				xDesc feature map height + 2 * convDesc zero- padding height must equal 256 or less  xDesc feature map width + 2 * convDesc zero- padding width must equal 256 or less  convDesc vertical and horizontal filter stride must equal 1  wDesc filter height must be greater than convDesc zero-padding height  wDesc filter width must be greater than convDesc zero-padding height  wDesc filter width must be greater than convDesc zero-padding width
_FFT_TILING			PSEUDO_HALF_CONF  FLOAT_CONFIG  DOUBLE_CONFIG  is also supported  when the task can  be handled by 1D  FFT, meaning,  one of the filter	r <b>Dilation:</b> 1 for all dimensions  When neither of wDesc filter dimension is 1, the filter width and height must not be larger than 32

Filter descriptor wDesc: \_NCHW (see <a href="mailto:cunvDesc">cunvDesc</a> Group count support: Greater than 0, for all algos.

Algo Name	Tensor Formats Supported for *Desc	Tensor Formats Supported for yDesc	Data Type Configurations Supported	Important
			dimensions, width or height is 1.	When either of wDesc filter dimension is 1, the largest filter dimension should not exceed 256 convDesc vertical and horizontal filter stride must equal 1 when either the filter width or filter height is 1, otherwise the stride can be a 1
				or 2 wDesc filter height must be greater than convDesc zero-padding height wDesc filter width must be greater than convDesc zero-padding width
_WINOGRAD	All except_NCHW_VECT_	All cexcept_NCHW_VECT_	PSEUDO_HALF_CONF C. FLOAT_CONFIG	

Filter descriptor wDesc: \_NCHW (see <a href="mailto:cudnnTensorFormat\_t">cudnnTensorFormat\_t</a>) convDesc Group count support: Greater than 0, for all algos. Tensor Formats Tensor Formats Data Type Supported for Supported for Configurations Algo Name xDesc yDesc Supported **Important** wDesc filter width must be 3 TRUE\_HALF\_CONFIG Dilation: 1 for all \_WINOGRAD\_NONFUSED PSEUDO\_HALF\_CONFIG convDesc vertical FLOAT\_CONFIG and horizontal filter stride must equal 1 wDesc filter (height, width) must be (3,3) or (5,5)If wDesc filter (height, width) is (5,5), then data type config TRUE\_HALF\_CONFIG is not supported. Currently not implemented in cuDNN. DIRECT

Table 18. For 2D convolutions: wDesc: NCHWC

Filter descriptor wDesc: _NCHWC						
convDesc Group count support: Greater than 0.						
Algo Name	xDesc	yDesc	Data Type Configurations Supported	Important		
_IMPLICIT_GEMM _IMPLICIT_PRECOM	_NCHW_VECT_C	_NCHW_VECT_C	INT8x4_CONFIG UINT8x4_CONFIG	<b>Dilation:</b> 1 for all dimensions		
			INT8x4_EXT_CONFI UINT8x4_EXT_CONF			

Filter descriptor wDesc: \_NCHWC convDesc Group count support: Greater than 0. Data Type Configurations Algo Name Supported **Important** xDesc yDesc **Dilation:** 1 for all \_IMPLICIT\_PRECOMP\_NGEMMN\_VECT\_C \_NCHW\_VECT\_C INT8x32\_CONFIG dimensions Requires compute capability 7.2 or above.

Table 19. For 2D convolutions: wDesc: NHWC

Filter descriptor wDesc: \_NHWC

convDesc Group count support: Greater than 0.

convines of our count support. Of eater than o.						
Algo Name	xDesc	yDesc	Data Type Configurations Supported	Important		
_IMPLICIT_GEMM _IMPLICIT_PRECOM	NHWC fully- packed IP_GEMM	NHWC fully- packed	INT8_CONFIG  INT8_EXT_CONFIG  UINT8_CONFIG  UINT8_EXT_CONFIG	Dilation: 1 for all dimensions Input and output feature maps must be a multiple of 4. Output features maps can be non-multiple in the case of INT8_EXT_CONFIG or UINT8_EXT_CONFIG.		
_IMPLICIT_GEMM _IMPLICIT_PRECOM	NHWC HWC- packed. IP_GEMM	NHWC HWC- packed. NCHW CHW- packed	TRUE_HALF_CONFIG  PSEUDO_HALF_CONF  FLOAT_CONFIG  DOUBLE_CONFIG			

Table 20. For 3D convolutions: wDesc: \_NCHW

Filter descriptor wDesc: \_NCHW

convDesc Group count support: Greater than 0, for all algos.

convDesc Group count support: Greater than 0, for all algos.								
Algo Name	жDesc	yDesc	Data Type Configurations Supported	Important				
_IMPLICIT_GEMM	All except _NCHW_VECT_C.	All except _NCHW_VECT_C.	PSEUDO_HALF_CONF	ɪ <b>Bilation:</b> Greater				
			FLOAT_CONFIG	than 0 for all dimensions				
_IMPLICIT_PRECOM	IP_GEMM		DOUBLE_CONFIG	<b>Dilation:</b> Greater than 0 for all dimensions				
_FFT_TILING	NCDHW DHW- packed	NCDHW DHW- packed		<b>Dilation:</b> 1 for all dimensions				
				wDesc filter height must equal 16 or less				
				wDesc filter width must equal 16 or less				
				wDesc filter depth must equal 16 or less				
				convDesc must have all filter strides equal to 1				
				wDesc filter height must be greater than convDesc zero-padding height				
				wDesc filter width must be greater than convDesc zero-padding width				
				wDesc filter depth must be greater				

Filter descriptor wDesc: _NCHW							
convDesc Group count support: Greater than 0, for all algos.							
Algo Name	xDesc	yDesc	Data Type Configurations Supported	Important			
				than convDesc zero-padding width			

Table 21. For 3D convolutions: wDesc: NHWC

Filter descriptor wDesc: _NHWC convDesc Group count support: Greater than 0, for all algos.							
_IMPLICIT_PRECOM	IP <b>N©##W</b> C DHWC-packed	NDHWC DHWC-packed	PSEUDO_HALF_CONF	I <b>Dilation:</b> Greater than 0 for all dimensions			



Note: Tensors can be converted to and from  $\texttt{CUDNN\_TENSOR\_NCHW\_VECT\_C}$  with  $\underline{\texttt{cudnnTransformTensor()}}.$ 

# Returns

# CUDNN\_STATUS\_SUCCESS

The operation was launched successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- At least one of the following is NULL: handle, xDesc, wDesc, convDesc, yDesc, xData, w, yData, alpha, beta
- xDesc and yDesc have a non-matching number of dimensions
- xDesc and wDesc have a non-matching number of dimensions
- xDesc has fewer than three number of dimensions
- xDesc's number of dimensions is not equal to convDesc array length + 2
- xDesc and wDesc have a non-matching number of input feature maps per image (or group in case of grouped convolutions)

- yDesc or wDesc indicate an output channel count that isn't a multiple of group count (if group count has been set in convDesc).
- xDesc, wDesc, and yDesc have a non-matching data type
- For some spatial dimension, wDesc has a spatial size that is larger than the input spatial size (including zero-padding size)

# CUDNN STATUS NOT SUPPORTED

At least one of the following conditions are met:

- xDesc or yDesc have negative tensor striding
- xDesc, wDesc, or yDesc has a number of dimensions that is not 4 or 5
- yDesc spatial sizes do not match with the expected size as determined by cudnnGetConvolutionNdForwardOutputDim()
- The chosen algo does not support the parameters provided; see above for an exhaustive list of parameters supported for each algo

# CUDNN STATUS MAPPING ERROR

An error occurred during the texture binding of the filter data.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# cudnnCreateConvolutionDescriptor()

```
cudnnStatus t cudnnCreateConvolutionDescriptor(
   cudnnConvolutionDescriptor t *convDesc)
```

This function creates a convolution descriptor object by allocating the memory needed to hold its opaque structure. For more information, see cudnnConvolutionDescriptor t.

#### Returns

#### CUDNN STATUS SUCCESS

The object was created successfully.

### CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# cudnnDestroyConvolutionDescriptor()

```
cudnnStatus t cudnnDestroyConvolutionDescriptor(
   cudnnConvolutionDescriptor t convDesc)
```

This function destroys a previously created convolution descriptor object.

#### Returns

### CUDNN STATUS SUCCESS

The descriptor was destroyed successfully.

# 5.2.13. cudnnFindConvolutionBackwardDataAlgorithm()

```
cudnnStatus t cudnnFindConvolutionBackwardDataAlgorithm(
    cudnnHandle t
                                                    handle,
    const cudnnFilterDescriptor t
                                                    wDesc,
    const cudnnTensorDescriptor_t dyDesc,
const cudnnConvolutionDescriptor_t convDesc,
const cudnnTensorDescriptor_t dxDesc,
    const int
                                                     requestedAlgoCount,
                                                    *returnedAlgoCount,
    int
    cudnnConvolutionBwdDataAlgoPerf t *perfResults)
```

This function attempts all algorithms available for <u>cudnnConvolutionBackwardData()</u>. It will attempt both the provided convDesc mathType and CUDNN DEFAULT MATH (assuming the two differ).



Note: Algorithms without the CUDNN TENSOR OP MATH availability will only be tried with CUDNN DEFAULT MATH, and returned as such.

Memory is allocated via cudaMalloc(). The performance metrics are returned in the user-allocated array of cudnnConvolutionBwdDataAlgoPerf t. These metrics are written in a sorted fashion where the first element has the lowest compute time. The total number of resulting algorithms can be gueried through the API cudnnGetConvolutionBackwardDataAlgorithmMaxCount().



#### Note:

- This function is host blocking.
- It is recommended to run this function prior to allocating layer data; doing otherwise may needlessly inhibit some algorithm options due to resource usage.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor.

### dyDesc

*Input.* Handle to the previously initialized input differential tensor descriptor.

#### convDesc

Input. Previously initialized convolution descriptor.

#### dxDesc

*Input.* Handle to the previously initialized output tensor descriptor.

#### requestedAlgoCount

*Input.* The maximum number of elements to be stored in perfResults.

#### returnedAlgoCount

*Output*. The number of output elements stored in perfResults.

#### perfResults

Output. A user-allocated array to store performance metrics sorted ascending by compute time.

# Returns

# CUDNN STATUS SUCCESS

The query was successful.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is not allocated properly.
- wDesc, dyDesc, or dxDesc is not allocated properly.
- ▶ wDesc, dyDesc, or dxDesc has fewer than 1 dimension.
- ▶ Either returnedCount or perfResults is nil.
- requestedCount is less than 1.

### CUDNN STATUS ALLOC FAILED

This function was unable to allocate memory to store sample input, filters and output.

# CUDNN STATUS INTERNAL ERROR

At least one of the following conditions are met:

- ► The function was unable to allocate necessary timing objects.
- The function was unable to deallocate necessary timing objects.
- The function was unable to deallocate sample input, filters and output.

# cudnnFindConvolutionBackwardDataAlgorithmEx(

```
cudnnStatus t cudnnFindConvolutionBackwardDataAlgorithmEx(
   cudnnHandle t
                                          handle,
   const cudnnFilterDescriptor t
                                          wDesc,
   const void
                                         *w,
   const cudnnTensorDescriptor t
                                          dyDesc,
                                         *dy,
   const cudnnConvolutionDescriptor t
                                          convDesc,
   const cudnnTensorDescriptor t
                                          dxDesc,
                                         *dx,
   void
   const int
                                         requestedAlgoCount,
                                         *returnedAlgoCount,
   int
   cudnnConvolutionBwdDataAlgoPerf t
                                         *perfResults,
                                         *workSpace,
   void
                                        workSpaceSizeInBytes)
  size t
```

This function attempts all algorithms available for cudnnConvolutionBackwardData(). It will attempt both the provided convDesc mathType and CUDNN DEFAULT MATH (assuming the two differ).



Note: Algorithms without the CUDNN TENSOR OF MATH availability will only be tried with CUDNN DEFAULT MATH, and returned as such.

Memory is allocated via cudaMalloc(). The performance metrics are returned in the user-allocated array of cudnnConvolutionBwdDataAlgoPerf t. These metrics are written in a sorted fashion where the first element has the lowest compute time. The total number of resulting algorithms can be gueried through the API cudnnGetConvolutionBackwardDataAlgorithmMaxCount().



**Note:** This function is host blocking.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### wDesc

Input. Handle to a previously initialized filter descriptor.

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

# dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

#### dy

Input. Data pointer to GPU memory associated with the filter descriptor dyDesc.

#### convDesc

Input. Previously initialized convolution descriptor.

*Input.* Handle to the previously initialized output tensor descriptor.

# dxDesc

Input/Output. Data pointer to GPU memory associated with the tensor descriptor dxDesc. The content of this tensor will be overwritten with arbitrary values.

#### requestedAlgoCount

*Input*. The maximum number of elements to be stored in perfResults.

#### returnedAlgoCount

Output. The number of output elements stored in perfResults.

#### perfResults

Output. A user-allocated array to store performance metrics sorted ascending by compute time.

# workSpace

Input. Data pointer to GPU memory is a necessary workspace for some algorithms. The size of this workspace will determine the availability of algorithms. A nil pointer is considered a workSpace of 0 bytes.

#### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workSpace.

#### Returns

### CUDNN STATUS SUCCESS

The query was successful.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is not allocated properly.
- wDesc, dyDesc, or dxDesc is not allocated properly.
- wDesc, dyDesc, or dxDesc has fewer than 1 dimension.
- w, dy, or dx is nil.
- ▶ Either returnedCount or perfResults is nil.
- requestedCount is less than 1.

# CUDNN STATUS INTERNAL ERROR

At least one of the following conditions are met:

- ▶ The function was unable to allocate necessary timing objects.
- The function was unable to deallocate necessary timing objects.
- The function was unable to deallocate sample input, filters and output.

# 5.2.15. cudnnFindConvolutionForwardAlgorithm()

```
cudnnStatus t cudnnFindConvolutionForwardAlgorithm(
   cudnnHandle t
                                handle,
  const cudnnConvolutionDescriptor t convDesc,
                               yDesc,
  const cudnnTensorDescriptor t
   const int
                                requestedAlgoCount,
                               *returnedAlgoCount,
   int
 cudnnConvolutionFwdAlgoPerf_t *perfResults)
```

This function attempts all algorithms available for <u>cudnnConvolutionForward()</u>. It will attempt both the provided <u>convDesc</u> mathType and <u>CUDNN</u> <u>DEFAULT</u> MATH (assuming the two differ).



**Note:** Algorithms without the CUDNN\_TENSOR\_OP\_MATH availability will only be tried with CUDNN DEFAULT MATH, and returned as such.

Memory is allocated via cudaMalloc(). The performance metrics are returned in the user-allocated array of <u>cudnnConvolutionFwdAlgoPerf</u> t. These metrics are written in a sorted fashion where the first element has the lowest compute time. The total number of resulting algorithms can be queried through the API <u>cudnnGetConvolutionForwardAlgorithmMaxCount()</u>.



#### Note:

- This function is host blocking.
- It is recommended to run this function prior to allocating layer data; doing otherwise may needlessly inhibit some algorithm options due to resource usage.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### **x**Desc

*Input*. Handle to the previously initialized input tensor descriptor.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor.

# convDesc

*Input.* Previously initialized convolution descriptor.

#### vDesc

*Input.* Handle to the previously initialized output tensor descriptor.

# requestedAlgoCount

Input. The maximum number of elements to be stored in perfResults.

#### returnedAlgoCount

Output. The number of output elements stored in perfResults.

# perfResults

Output. A user-allocated array to store performance metrics sorted ascending by compute time.

# Returns

# CUDNN STATUS SUCCESS

The query was successful.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is not allocated properly.
- xDesc, wDesc, or yDesc are not allocated properly.
- xDesc, wDesc, or yDesc has fewer than 1 dimension.
- ▶ Either returnedCount or perfResults is nil.
- requestedCount is less than 1.

# CUDNN STATUS ALLOC FAILED

This function was unable to allocate memory to store sample input, filters and output.

### CUDNN STATUS INTERNAL ERROR

At least one of the following conditions are met:

- ► The function was unable to allocate necessary timing objects.
- The function was unable to deallocate necessary timing objects.
- ▶ The function was unable to deallocate sample input, filters and output.

#### 5.2.16. cudnnFindConvolutionForwardAlgorithmEx()

```
cudnnStatus t cudnnFindConvolutionForwardAlgorithmEx(
   cudnnHandle t
                                      handle,
   const cudnnTensorDescriptor t
                                      xDesc.
                                      *x,
   const void
   const cudnnFilterDescriptor t
                                      wDesc,
   const void
   const cudnnConvolutionDescriptor t convDesc,
   const cudnnTensorDescriptor_t
                                     yDesc,
   void
                                     requestedAlgoCount,
   const int
                                     *returnedAlgoCount,
   cudnnConvolutionFwdAlgoPerf t
                                     *perfResults,
   void
                                      *workSpace,
   size t
                                      workSpaceSizeInBytes)
```

This function attempts all algorithms available for cudnnConvolutionForward(). It will attempt both the provided convDesc mathType and CUDNN DEFAULT MATH (assuming the two differ).



Note: Algorithms without the CUDNN TENSOR OP MATH availability will only be tried with CUDNN DEFAULT MATH, and returned as such.

Memory is allocated via cudaMalloc(). The performance metrics are returned in the user-allocated array of cudnnConvolutionFwdAlgoPerf t. These metrics are written in a sorted fashion where the first element has the lowest compute

time. The total number of resulting algorithms can be gueried through the API cudnnGetConvolutionForwardAlgorithmMaxCount().



**Note:** This function is host blocking.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### **x**Desc

*Input*. Handle to the previously initialized input tensor descriptor.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### wDesc

Input. Handle to a previously initialized filter descriptor.

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

#### convDesc

Input. Previously initialized convolution descriptor.

#### vDesc

*Input.* Handle to the previously initialized output tensor descriptor.

У

Input/Output. Data pointer to GPU memory associated with the tensor descriptor yDesc. The content of this tensor will be overwritten with arbitrary values.

# requestedAlgoCount

*Input*. The maximum number of elements to be stored in perfResults.

# returnedAlgoCount

Output. The number of output elements stored in perfResults.

# perfResults

Output. A user-allocated array to store performance metrics sorted ascending by compute time.

#### workSpace

Input. Data pointer to GPU memory is a necessary workspace for some algorithms. The size of this workspace will determine the availability of algorithms. A nil pointer is considered a workSpace of 0 bytes.

#### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workSpace.

### Returns

### CUDNN STATUS SUCCESS

The query was successful.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- handle is not allocated properly.
- xDesc, wDesc, or yDesc are not allocated properly.
- xDesc, wDesc, or yDesc has fewer than 1 dimension.
- x, w, or y is nil.
- ▶ Either returnedCount or perfResults is nil.
- requestedCount is less than 1.

# CUDNN STATUS INTERNAL ERROR

At least one of the following conditions are met:

- ► The function was unable to allocate necessary timing objects.
- ▶ The function was unable to deallocate necessary timing objects.
- ▶ The function was unable to deallocate sample input, filters and output.

# 5.2.17. cudnnGetConvolution2dDescriptor()

This function queries a previously initialized 2D convolution descriptor object.

#### **Parameters**

#### convDesc

*Input/Output*. Handle to a previously created convolution descriptor.

#### pad h

*Output*. Zero-padding height: number of rows of zeros implicitly concatenated onto the top and onto the bottom of input images.

### pad w

*Output*. Zero-padding width: number of columns of zeros implicitly concatenated onto the left and onto the right of input images.

u

Output. Vertical filter stride.

V

Output. Horizontal filter stride.

# dilation h

Output. Filter height dilation.

### dilation w

Output. Filter width dilation.

# mode

Output. Convolution mode.

# computeType

Output. Compute precision.

# Returns

# CUDNN STATUS SUCCESS

The operation was successful.

# CUDNN\_STATUS\_BAD\_PARAM

The parameter convDesc is nil.

# 5.2.18. cudnnGetConvolution2dForwardOutputDim()

This function returns the dimensions of the resulting 4D tensor of a 2D convolution, given the convolution descriptor, the input tensor descriptor and the filter descriptor This function can help to setup the output tensor and allocate the proper amount of memory prior to launch the actual convolution.

Each dimension h and w of the output images is computed as follows:

```
outputDim = 1 + ( inputDim + 2*pad - (((filterDim-1)*dilation)+1) )/
convolutionStride;
```



**Note:** The dimensions provided by this routine must be strictly respected when calling <a href="mailto:cudnnConvolutionForward(">cudnnConvolutionBackwardBias()</a>. Providing a smaller or larger output tensor is not supported by the convolution routines.

# **Parameters**

#### convDesc

*Input.* Handle to a previously created convolution descriptor.

# inputTensorDesc

*Input*. Handle to a previously initialized tensor descriptor.

#### filterDesc

*Input*. Handle to a previously initialized filter descriptor.

n

Output. Number of output images.

C

Output. Number of output feature maps per image.

h

Output. Height of each output feature map.

W

Output. Width of each output feature map.

# Returns

#### CUDNN STATUS BAD PARAM

One or more of the descriptors has not been created correctly or there is a mismatch between the feature maps of inputTensorDesc and filterDesc.

# CUDNN STATUS SUCCESS

The object was set successfully.

# 5.2.19. ${f cudnnGetConvolutionBackwardDataAlgorithmMaxC}$

```
cudnnStatus_t cudnnGetConvolutionBackwardDataAlgorithmMaxCount(
    cudnnHandle_t handle,
    int *count)
```

This function returns the maximum number of algorithms which can be returned from <a href="mailto:cudnnFindConvolutionBackwardDataAlgorithm">cudnnFindConvolutionBackwardDataAlgorithm</a>) and <a href="mailto:cudnnGetConvolutionForwardAlgorithm\_v7">cudnnGetConvolutionForwardAlgorithm\_v7</a>). This is the sum of all algorithms with Tensor Core operations supported for the current device.

# **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

#### count

*Output.* The resulting maximum number of algorithms.

### Returns

# CUDNN\_STATUS\_SUCCESS

The function was successful.

```
CUDNN STATUS BAD PARAM
```

The provided handle is not allocated properly.

# 5.2.20. cudnnGetConvolutionBackwardDataAlgorithm\_v7(

This function serves as a heuristic for obtaining the best suited algorithm for <a href="mailto:cudnnConvolutionBackwardData">cudnnConvolutionBackwardData</a> for the given layer specifications. This function will return all algorithms (including CUDNN\_TENSOR\_OP\_MATH and CUDNN\_DEFAULT\_MATH versions of algorithms where CUDNN\_TENSOR\_OP\_MATH may be available) sorted by expected (based on internal heuristic) relative performance with the fastest being index 0 of perfResults. For an exhaustive search for the fastest algorithm, use <a href="mailto:cudnnFindConvolutionBackwardDataAlgorithm">cudnnFindConvolutionBackwardDataAlgorithm</a> (). The total number of resulting algorithms can be queried through the returnedAlgoCount variable.

#### **Parameters**

### handle

*Input.* Handle to a previously created cuDNN context.

#### wDesc

Input. Handle to a previously initialized filter descriptor.

# dyDesc

*Input.* Handle to the previously initialized input differential tensor descriptor.

#### convDesc

Input. Previously initialized convolution descriptor.

#### dxDesc

*Input.* Handle to the previously initialized output tensor descriptor.

# requestedAlgoCount

Input. The maximum number of elements to be stored in perfResults.

### returnedAlgoCount

Output. The number of output elements stored in perfResults.

#### perfResults

Output. A user-allocated array to store performance metrics sorted ascending by compute time.

#### Returns

# CUDNN STATUS SUCCESS

The query was successful.

### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the parameters handle, wDesc, dyDesc, convDesc, dxDesc, perfResults, returnedAlgoCount is NULL.
- ▶ The numbers of feature maps of the input tensor and output tensor differ.
- ► The dataType of the two tensor descriptors or the filters are different.
- requestedAlgoCount is less than or equal to 0.

# 5.2.21. cudnnGetConvolutionBackwardDataWorkspaceSize

This function returns the amount of GPU memory workspace the user needs to allocate to be able to call <a href="mailto:cudnnConvolutionBackwardData">cudnnConvolutionBackwardData</a>() with the specified algorithm. The workspace allocated will then be passed to the routine <a href="cudnnConvolutionBackwardData">cudnnConvolutionBackwardData</a>(). The specified algorithm can be the result of the call to <a href="cudnnGetConvolutionBackwardDataAlgorithm\_v7">cudnnGetConvolutionBackwardDataAlgorithm\_v7</a>() or can be chosen arbitrarily by the user. Note that not every algorithm is available for every configuration of the input tensor and/or every configuration of the convolution descriptor.

# **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

#### wDesc

Input. Handle to a previously initialized filter descriptor.

# dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

#### convDesc

*Input*. Previously initialized convolution descriptor.

#### dxDesc

Input. Handle to the previously initialized output tensor descriptor.

### algo

Input. Enumerant that specifies the chosen convolution algorithm.

#### sizeInBytes

*Output*. Amount of GPU memory needed as workspace to be able to execute a forward convolution with the specified algo.

# Returns

# CUDNN STATUS SUCCESS

The query was successful.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- The numbers of feature maps of the input tensor and output tensor differ.
- ► The dataType of the two tensor descriptors or the filter are different.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The combination of the tensor descriptors, filter descriptor and convolution descriptor is not supported for the specified algorithm.

# 5.2.22. cudnnGetConvolutionForwardAlgorithmMaxCount(

```
cudnnStatus_t cudnnGetConvolutionForwardAlgorithmMaxCount(
    cudnnHandle_t handle,
    int *count)
```

This function returns the maximum number of algorithms which can be returned from <a href="mailto:cudnnFindConvolutionForwardAlgorithm">cudnnFindConvolutionForwardAlgorithm</a> v7(). This is the sum of all algorithms plus the sum of all algorithms with Tensor Core operations supported for the current device.

### **Parameters**

#### handle

*Input*. Handle to a previously created cuDNN context.

#### count

Output. The resulting maximum number of algorithms.

# Returns

### CUDNN STATUS SUCCESS

The function was successful.

```
CUDNN_STATUS_BAD_PARAM
```

The provided handle is not allocated properly.

# 5.2.23. cudnnGetConvolutionForwardAlgorithm\_v7()

This function serves as a heuristic for obtaining the best suited algorithm for <a href="mailto:cudnnConvolutionForward">cudnnConvolutionForward</a>) for the given layer specifications. This function will return all algorithms (including CUDNN\_TENSOR\_OP\_MATH and CUDNN\_DEFAULT\_MATH versions of algorithms where CUDNN\_TENSOR\_OP\_MATH may be available) sorted by expected (based on internal heuristic) relative performance with the fastest being index 0 of perfResults. For an exhaustive search for the fastest algorithm, use <a href="mailto:cudnnFindConvolutionForwardAlgorithm">cudnnFindConvolutionForwardAlgorithm</a>(). The total number of resulting algorithms can be queried through the <a href="mailto:returnedAlgoCount">returnedAlgoCount</a> variable.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### xDesc

Input. Handle to the previously initialized input tensor descriptor.

# wDesc

*Input.* Handle to a previously initialized convolution filter descriptor.

#### convDesc

Input. Previously initialized convolution descriptor.

#### yDesc

*Input.* Handle to the previously initialized output tensor descriptor.

#### requestedAlgoCount

Input. The maximum number of elements to be stored in perfResults.

#### returnedAlgoCount

Output. The number of output elements stored in perfResults.

# perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

# Returns

# CUDNN STATUS SUCCESS

The query was successful.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- One of the parameters handle, xDesc, wDesc, convDesc, yDesc, perfResults, returnedAlgoCount is NULL.
- Either yDesc or wDesc have different dimensions from xDesc.
- ▶ The data types of tensors xDesc, yDesc or wDesc are not all the same.
- ► The number of feature maps in xDesc and wDesc differs.
- ▶ The tensor xDesc has a dimension smaller than 3.
- requestedAlgoCount is less than or equal to 0.

# 5.2.24. cudnnGetConvolutionForwardWorkspaceSize()

```
cudnnStatus_t cudnnGetConvolutionForwardWorkspaceSize(
    cudnnHandle_t handle,
    const cudnnTensorDescriptor_t xDesc,
    const cudnnFilterDescriptor_t wDesc,
    const cudnnConvolutionDescriptor_t convDesc,
    const cudnnTensorDescriptor_t yDesc,
    cudnnConvolutionFwdAlgo_t algo,
    size_t *sizeInBytes)
```

This function returns the amount of GPU memory workspace the user needs to allocate to be able to call <u>cudnnConvolutionForward()</u> with the specified algorithm. The workspace allocated will then be passed to the routine <u>cudnnConvolutionForward()</u>. The specified algorithm can be the result of the call to <u>cudnnGetConvolutionForwardAlgorithm v7()</u> or can be chosen arbitrarily by the user. Note that not every algorithm is available for every configuration of the input tensor and/or every configuration of the convolution descriptor.

# **Parameters**

### handle

*Input.* Handle to a previously created cuDNN context.

#### xDesc

*Input.* Handle to the previously initialized x tensor descriptor.

#### wDesc

Input. Handle to a previously initialized filter descriptor.

#### convDesc

*Input.* Previously initialized convolution descriptor.

### yDesc

*Input.* Handle to the previously initialized y tensor descriptor.

#### algo

Input. Enumerant that specifies the chosen convolution algorithm.

### sizeInBytes

*Output*. Amount of GPU memory needed as workspace to be able to execute a forward convolution with the specified algo.

### Returns

# CUDNN STATUS SUCCESS

The query was successful.

#### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the parameters handle, xDesc, wDesc, convDesc, yDesc is NULL.
- ► The tensor yDesc or wDesc are not of the same dimension as xDesc.
- The tensor xDesc, yDesc or wDesc are not of the same data type.
- ► The numbers of feature maps of the tensor xDesc and wDesc differ.
- ► The tensor xDesc has a dimension smaller than 3.

#### CUDNN STATUS NOT SUPPORTED

The combination of the tensor descriptors, filter descriptor and convolution descriptor is not supported for the specified algorithm.

# 5.2.25. cudnnGetConvolutionGroupCount()

```
cudnnStatus_t cudnnGetConvolutionGroupCount(
    cudnnConvolutionDescriptor_t convDesc,
    int *groupCount)
```

This function returns the group count specified in the given convolution descriptor.

# Returns

#### CUDNN STATUS SUCCESS

The group count was returned successfully.

#### CUDNN STATUS BAD PARAM

An invalid convolution descriptor was provided.

# 5.2.26. cudnnGetConvolutionMathType()

```
cudnnStatus_t cudnnGetConvolutionMathType(
    cudnnConvolutionDescriptor_t convDesc,
    cudnnMathType_t *mathType)
```

This function returns the math type specified in a given convolution descriptor.

#### Returns

# CUDNN\_STATUS\_SUCCESS

The math type was returned successfully.

# CUDNN\_STATUS\_BAD\_PARAM

An invalid convolution descriptor was provided.

# 5.2.27. cudnnGetConvolutionNdDescriptor()

This function queries a previously initialized convolution descriptor object.

#### **Parameters**

#### convDesc

*Input/Output*. Handle to a previously created convolution descriptor.

#### arrayLengthRequested

*Input.* Dimension of the expected convolution descriptor. It is also the minimum size of the arrays padA, filterStrideA, and dilationA in order to be able to hold the results

# arrayLength

Output. Actual dimension of the convolution descriptor.

#### padA

Output. Array of dimension of at least arrayLengthRequested that will be filled with the padding parameters from the provided convolution descriptor.

#### filterStrideA

Output. Array of dimension of at least arrayLengthRequested that will be filled with the filter stride from the provided convolution descriptor.

#### dilationA

Output. Array of dimension of at least arrayLengthRequested that will be filled with the dilation parameters from the provided convolution descriptor.

#### mode

Output. Convolution mode of the provided descriptor.

#### datatype

Output. Datatype of the provided descriptor.

#### Returns

# CUDNN\_STATUS\_SUCCESS

The query was successful.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- The descriptor convDesc is nil.
- ► The arrayLengthRequest is negative.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The arrayLengthRequested is greater than CUDNN DIM MAX-2.

# 5.2.28. cudnnGetConvolutionNdForwardOutputDim()

This function returns the dimensions of the resulting n-D tensor of a nbDims-2-D convolution, given the convolution descriptor, the input tensor descriptor and the filter descriptor This function can help to setup the output tensor and allocate the proper amount of memory prior to launch the actual convolution.

Each dimension of the (nbDims-2) -D images of the output tensor is computed as follows:

```
outputDim = 1 + ( inputDim + 2*pad - (((filterDim-1)*dilation)+1) )/
convolutionStride;
```



**Note:** The dimensions provided by this routine must be strictly respected when calling <a href="mailto:cudnnConvolutionForward(">cudnnConvolutionBackwardBias()</a>. Providing a smaller or larger output tensor is not supported by the convolution routines.

#### **Parameters**

#### convDesc

*Input.* Handle to a previously created convolution descriptor.

## inputTensorDesc

*Input.* Handle to a previously initialized tensor descriptor.

#### filterDesc

*Input*. Handle to a previously initialized filter descriptor.

#### nbDims

*Input*. Dimension of the output tensor.

# tensorOuputDimA

Output. Array of dimensions nbDims that contains on exit of this routine the sizes of the output tensor.

#### Returns

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- One of the parameters convDesc, inputTensorDesc, and filterDesc is nil.
- The dimension of the filter descriptor filterDesc is different from the dimension of input tensor descriptor inputTensorDesc.
- ► The dimension of the convolution descriptor is different from the dimension of input tensor descriptor inputTensorDesc-2.
- ► The features map of the filter descriptor filterDesc is different from the one of input tensor descriptor inputTensorDesc.
- ► The size of the dilated filter filterDesc is larger than the padded sizes of the input tensor.
- The dimension nbDims of the output array is negative or greater than the dimension of input tensor descriptor inputTensorDesc.

# CUDNN STATUS SUCCESS

The routine exited successfully.

# 5.2.29. cudnnGetConvolutionReorderType()

```
cudnnStatus_t cudnnGetConvolutionReorderType(
  cudnnConvolutionDescriptor_t convDesc,
  cudnnReorderType t *reorderType);
```

This function retrieves the convolution reorder type from the given convolution descriptor.

#### **Parameters**

#### convDesc

Input. The convolution descriptor from which the reorder type should be retrieved.

#### reorderType

*Output*. The retrieved reorder type. For more information, see <u>cudnnReorderType\_t</u>.

# Returns

# CUDNN STATUS BAD PARAM

One of the inputs to this function is not valid.

# CUDNN\_STATUS\_SUCCESS

The reorder type is retrieved successfully.

# 5.2.30. cudnnGetFoldedConvBackwardDataDescriptors()

```
cudnnStatus t
cudnnGetFoldedConvBackwardDataDescriptors(const cudnnHandle t handle,
                                          const cudnnFilterDescriptor t filterDesc,
                                          const cudnnTensorDescriptor t diffDesc,
                                          const cudnnConvolutionDescriptor t
convDesc,
                                          const cudnnTensorDescriptor t gradDesc,
                                          const cudnnTensorFormat_t transformFormat,
                                          cudnnFilterDescriptor_t foldedFilterDesc,
                                          cudnnTensorDescriptor_t paddedDiffDesc,
                                          cudnnConvolutionDescriptor t
foldedConvDesc.
                                          cudnnTensorDescriptor t foldedGradDesc,
                                          cudnnTensorTransformDescriptor t
filterFoldTransDesc,
                                          cudnnTensorTransformDescriptor t
diffPadTransDesc,
                                          cudnnTensorTransformDescriptor t
gradFoldTransDesc,
                                          cudnnTensorTransformDescriptor t
gradUnfoldTransDesc) ;
```

This function calculates folding descriptors for backward data gradient. It takes as input the data descriptors along with convolution descriptor and computes the folded data descriptors and the folding transform descriptors. These can then be used to do the actual folding transform.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### filterDesc

*Input*. Filter descriptor before folding.

### diffDesc

Input. Diff descriptor before folding.

#### convDesc

*Input.* Convolution descriptor before folding.

# gradDesc

Input. Gradient descriptor before folding.

#### transformFormat

Input. Transform format for folding.

#### foldedFilterDesc

Output. Folded filter descriptor.

# paddedDiffDesc

Output. Padded Diff descriptor.

#### foldedConvDesc

Output. Folded convolution descriptor.

#### foldedGradDesc

Output. Folded gradient descriptor.

#### filterFoldTransDesc

Output. Folding transform descriptor for filter.

#### diffPadTransDesc

Output. Folding transform descriptor for Desc.

# ${\tt gradFoldTransDesc}$

Output. Folding transform descriptor for gradient.

#### gradUnfoldTransDesc

Output. Unfolding transform descriptor for folded gradient.

# Returns

# CUDNN STATUS SUCCESS

Folded descriptors were computed successfully.

# CUDNN\_STATUS\_BAD\_PARAM

If any of the input parameters is NULL or if the input tensor has more than 4 dimensions.

# CUDNN\_STATUS\_EXECUTION\_FAILED

Computing the folded descriptors failed.

# 5.2.31. **cudnnIm2Col()**

```
cudnnFilterDescriptor_t filterDesc,
cudnnConvolutionDescriptor_t convDesc,
void *colBuffer)
```

This function constructs the A matrix necessary to perform a forward pass of GEMM convolution. This A matrix has a height of batch\_size\*y\_height\*y\_width and width of input channels\*filter height\*filter width, where:

- batch size is xDesc first dimension
- y height/y width are computed from cudnnGetConvolutionNdForwardOutputDim()
- ▶ input channels is xDesc second dimension
- ▶ filter height/filter width are wDesc third and fourth dimension

The A matrix is stored in format HW fully-packed in GPU memory.

#### **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### srcDesc

*Input.* Handle to a previously initialized tensor descriptor.

#### srcData

Input. Data pointer to GPU memory associated with the input tensor descriptor.

# filterDesc

Input. Handle to a previously initialized filter descriptor.

#### convDesc

*Input.* Handle to a previously initialized convolution descriptor.

#### colBuffer

Output. Data pointer to GPU memory storing the output matrix.

#### Returns

#### CUDNN STATUS BAD PARAM

srcData Or colBuffer is NULL.

# CUDNN STATUS NOT SUPPORTED

Any of srcDesc, filterDesc, convDesc has dataType of CUDNN\_DATA\_INT8, CUDNN\_DATA\_INT8x4, CUDNN\_DATA\_INT8 or CUDNN\_DATA\_INT8x4 convDesc has groupCount larger than 1.

# CUDNN STATUS EXECUTION FAILED

The CUDA kernel execution was unsuccessful.

#### CUDNN STATUS SUCCESS

The output data array is successfully generated.

# 5.2.32. cudnnReorderFilterAndBias()

```
cudnnStatus_t cudnnReorderFilterAndBias(
  cudnnHandle_t handle,
  const cudnnFilterDescriptor_t filterDesc,
  cudnnReorderType_t reorderType,
  const void *filterData,
  void *reorderedFilterData,
  int reorderBias,
  const void *biasData,
  void *reorderedBiasData);
```

This function <u>cudnnReorderFilterAndBias()</u> reorders the filter and bias values. It can be used to enhance the inference time by separating the reordering operation from convolution.

For example, convolutions in a neural network of multiple layers can require reordering of kernels at every layer, which can take up a significant fraction of the total inference time. Using this function, the reordering can be done one time on the filter and bias data followed by the convolution operations at the multiple layers, thereby enhancing the inference time.

# **Parameters**

#### filterDesc

Input. Descriptor for the kernel dataset.

#### reorderType

*Input*. Setting to either perform reordering or not. For more information, see <u>cudnnReorderType\_t</u>.

#### filterData

Input. Pointer to the filter (kernel) data location in the device memory.

#### reorderedFilterData

*Input.* Pointer to the location in the device memory where the reordered filter data will be written to, by this function.

#### reorderBias

*Input*. If > 0, then reorders the bias data also. If <= 0 then does not perform reordering operations on the bias data.

#### biasData

*Input.* Pointer to the bias data location in the device memory.

# reorderedBiasData

*Input.* Pointer to the location in the device memory where the reordered bias data will be written to, by this function.

#### Returns

#### CUDNN STATUS SUCCESS

Reordering was successful.

#### CUDNN STATUS EXECUTION FAILED

Either the reordering of the filter data or of the bias data failed.

# 5.2.33. cudnnSetConvolution2dDescriptor()

```
cudnnStatus t cudnnSetConvolution2dDescriptor(
    cudnnConvolutionDescriptor_t
                                     convDesc,
                                     pad h,
   int
                                     pad w,
   int
                                     u,
   int
   int
                                     dilation h,
   int
                                     dilation w,
    cudnnConvolutionMode t
                                     mode,
                                     computeType)
    cudnnDataType t
```

This function initializes a previously created convolution descriptor object into a 2D correlation. This function assumes that the tensor and filter descriptors correspond to the forward convolution path and checks if their settings are valid. That same convolution descriptor can be reused in the backward path provided it corresponds to the same layer.

#### **Parameters**

#### convDesc

Input/Output. Handle to a previously created convolution descriptor.

### pad h

*Input*. Zero-padding height: number of rows of zeros implicitly concatenated onto the top and onto the bottom of input images.

#### pad w

*Input*. Zero-padding width: number of columns of zeros implicitly concatenated onto the left and onto the right of input images.

u

Input. Vertical filter stride.

V

Input. Horizontal filter stride.

# dilation h

Input. Filter height dilation.

### dilation w

Input. Filter width dilation.

# mode

Input. Selects between CUDNN CONVOLUTION and CUDNN CROSS CORRELATION.

### computeType

Input. Compute precision.

# Returns

# CUDNN\_STATUS\_SUCCESS

The object was set successfully.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- ► The descriptor convDesc is nil.
- One of the parameters pad h, pad w is strictly negative.
- One of the parameters u, v is negative or zero.
- One of the parameters dilation h, dilation w is negative or zero.
- ▶ The parameter mode has an invalid enumerant value.

# 5.2.34. cudnnSetConvolutionGroupCount()

```
cudnnStatus_t cudnnSetConvolutionGroupCount(
    cudnnConvolutionDescriptor_t convDesc,
    int groupCount)
```

This function allows the user to specify the number of groups to be used in the associated convolution.

#### Returns

# CUDNN STATUS SUCCESS

The group count was set successfully.

# CUDNN STATUS BAD PARAM

An invalid convolution descriptor was provided

# 5.2.35. cudnnSetConvolutionMathType()

```
cudnnStatus_t cudnnSetConvolutionMathType(
    cudnnConvolutionDescriptor_t convDesc,
    cudnnMathType t mathType)
```

This function allows the user to specify whether or not the use of tensor op is permitted in the library routines associated with a given convolution descriptor.

#### Returns

#### CUDNN STATUS SUCCESS

The math type was set successfully.

# CUDNN\_STATUS\_BAD\_PARAM

Either an invalid convolution descriptor was provided or an invalid math type was specified.

# 5.2.36. cudnnSetConvolutionNdDescriptor()

This function initializes a previously created generic convolution descriptor object into a n-D correlation. That same convolution descriptor can be reused in the backward path provided it corresponds to the same layer. The convolution computation will be done in the specified dataType, which can be potentially different from the input/output tensors.

#### **Parameters**

#### convDesc

*Input/Output*. Handle to a previously created convolution descriptor.

### arrayLength

*Input.* Dimension of the convolution.

#### padA

Input. Array of dimension arrayLength containing the zero-padding size for each dimension. For every dimension, the padding represents the number of extra zeros implicitly concatenated at the start and at the end of every element of that dimension.

#### filterStrideA

Input. Array of dimension arrayLength containing the filter stride for each dimension. For every dimension, the filter stride represents the number of elements to slide to reach the next start of the filtering window of the next point.

#### dilationA

Input. Array of dimension arrayLength containing the dilation factor for each dimension.

#### mode

Input. Selects between CUDNN CONVOLUTION and CUDNN CROSS CORRELATION.

#### datatype

*Input.* Selects the data type in which the computation will be done.



Note: CUDNN\_DATA\_HALF in <a href="mailto:cudnnSetConvolutionNdDescriptor">cudnnSetConvolutionNdDescriptor</a> () with HALF\_CONVOLUTION\_BWD\_FILTER is not recommended as it is known to not be useful for any practical use case for training and will be considered to be blocked in a future cuDNN release. The use of CUDNN\_DATA\_HALF for input tensors in <a href="mailto:cudnnSetTensorNdDescriptor">cudnnSetTensorNdDescriptor</a> () and CUDNN\_DATA\_FLOAT in <a href="mailto:cudnnSetConvolutionNdDescriptor">cudnnSetConvolutionNdDescriptor</a> () with HALF\_CONVOLUTION\_BWD\_FILTER is



recommended and is used with the automatic mixed precision (AMP) training in many well known deep learning frameworks.

### Returns

### CUDNN STATUS SUCCESS

The object was set successfully.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- ► The descriptor convDesc is nil.
- ► The arrayLengthRequest is negative.
- ▶ The enumerant mode has an invalid value.
- ► The enumerant datatype has an invalid value.
- One of the elements of padA is strictly negative.
- ▶ One of the elements of strideA is negative or zero.
- ▶ One of the elements of dilationA is negative or zero.

# CUDNN STATUS NOT SUPPORTED

At least one of the following conditions are met:

► The arrayLengthRequest is greater than CUDNN\_DIM\_MAX.

# 5.2.37. cudnnSetConvolutionReorderType()

```
cudnnStatus_t cudnnSetConvolutionReorderType(
  cudnnConvolutionDescriptor_t convDesc,
  cudnnReorderType t reorderType);
```

This function sets the convolution reorder type for the given convolution descriptor.

# **Parameters**

#### convDesc

*Input*. The convolution descriptor for which the reorder type should be set.

### reorderType

Input. Set the reorder type to this value. For more information, see <u>cudnnReorderType t</u>.

#### Returns

#### CUDNN STATUS BAD PARAM

The reorder type supplied is not supported.

# CUDNN STATUS SUCCESS

Reorder type is set successfully.

# Chapter 6. cudnn\_cnn\_train.so Library

# 6.1. Data Type References

# 6.1.1. Pointer To Opaque Struct Types

# 6.1.1.1. cudnnFusedOpsConstParamPack\_t

 ${\tt cudnnFusedOpsConstParamPack\_t is a pointer to an opaque structure holding} \\ the description of the {\tt cudnnFusedOps} constant parameters. Use the function \\ {\tt cudnnCreateFusedOpsConstParamPack()} \\ to create one instance of this structure, and the function \\ {\tt cudnnDestroyFusedOpsConstParamPack()} \\ to destroy a previously-created descriptor. \\$ 

# 6.1.1.2. cudnnFusedOpsPlan\_t

cudnnFusedOpsPlan\_t is a pointer to an opaque structure holding the description of the cudnnFusedOpsPlan. This descriptor contains the plan information, including the problem type and size, which kernels should be run, and the internal workspace partition. Use the function <a href="mailto:cudnnCreateFusedOpsPlan()">cudnnCreateFusedOpsPlan()</a> to create one instance of this structure, and the function <a href="mailto:cudnnDestroyFusedOpsPlan()">cudnnDestroyFusedOpsPlan()</a> to destroy a previously-created descriptor.

# 6.1.1.3. cudnnFusedOpsVariantParamPack t

cudnnFusedOpsVariantParamPack\_t is a pointer to an opaque structure holding the description of the cudnnFusedOps variant parameters. Use the function <a href="mailto:cudnnCreateFusedOpsVariantParamPack(">cudnnCreateFusedOpsVariantParamPack()</a>) to create one instance of this structure, and the function <a href="mailto:cudnnDestroyFusedOpsVariantParamPack(">cudnnDestroyFusedOpsVariantParamPack()</a>) to destroy a previously-created descriptor.

# 6.1.2. Struct Types

# 6.1.2.1. cudnnConvolutionBwdFilterAlgoPerf\_t

cudnnConvolutionBwdFilterAlgoPerf\_t is a structure containing performance results returned by  $\underline{\text{cudnnFindConvolutionBackwardFilterAlgorithm()}}$  or heuristic results returned by  $\underline{\text{cudnnGetConvolutionBackwardFilterAlgorithm v7()}}$ .

# Data Members

# cudnnConvolutionBwdFilterAlgo t algo

The algorithm runs to obtain the associated performance metrics.

# cudnnStatus\_t status

If any error occurs during the workspace allocation or timing of <a href="mailto:cudnnConvolutionBackwardFilter">cudnnConvolutionBackwardFilter</a>(), this status will represent that error. Otherwise, this status will be the return status of <a href="mailto:cudnnConvolutionBackwardFilter">cudnnConvolutionBackwardFilter</a>().

- CUDNN\_STATUS\_ALLOC\_FAILED if any error occurred during workspace allocation or if the provided workspace is insufficient.
- CUDNN\_STATUS\_INTERNAL\_ERROR if any error occurred during timing calculations or workspace deallocation.
- Otherwise, this will be the return status of cudnnConvolutionBackwardFilter().

#### float time

The execution time of <a href="mailto:cudnnConvolutionBackwardFilter">cudnnConvolutionBackwardFilter</a>() (in milliseconds).

# size\_t memory

The workspace size (in bytes).

# cudnnDeterminism\_t determinism

The determinism of the algorithm.

# cudnnMathType t mathType

The math type provided to the algorithm.

# int reserved[3]

Reserved space for future properties.

# 6.1.3. Enumeration Types

# 6.1.3.1. cudnnFusedOps t

The cudnnFusedOps\_t type is an enumerated type to select a specific sequence of computations to perform in the fused operations.

Member	Description
CUDNN_FUSED_SCALE_BIAS_ACTIVATION_CONV_BN = 0	s@ATESper-channel basis, performs these operations in this order: scale, add bias, activation, convolution, and generate batchnorm statistics.

Member	Description
CUDNN_FUSED_SCALE_BIAS_ACTIVATION_WG = 1	On a per-channel basis, performs these operations in this order: scale, add bias, activation, convolution backward weights, and generate batchnorm statistics.
CUDNN_FUSED_SCA	LE_BIAS_ACTIVATION_WGRAD
Output	Input
dw ← wgrad <sup>y<sub>1</sub></sup>	ReLU  Scale & equivalent scale equivalent bias
	RRELU(y <sub>0</sub> ) y <sub>0</sub> = scale(x)+bias  TRAININGomputes the equivalent scale and bias from ySum, ySqSum and learned scale, bias.  Optionally update running statistics and generate
CUDNN_FUSED_BN_FINALIZE_STATISTICS_I = 3	saved stats  INFERENCEMPUtes the equivalent scale and bias from the learned running statistics and the learned scale, bias.
CUDNN_FUSED_CONV_SCALE_BIAS_ADD_ACTI = 4	ONATIONON a per-channel basis, performs these operations in this order: convolution, scale, add bias, element-wise addition with another tensor, and activation.
CUDNN_FUSED_SCALE_BIAS_ADD_ACTIVATION = 5	on GEN

CUDNN\_FUSED\_DACTIVATION\_FORK\_DBATCHNORM

= 6

On a per-channel basis, performs these operations in this order: backward activation,

fork (meaning, write out gradient for the residual branch), and backward batch norm.

# 6.1.3.2. cudnnFusedOpsConstParamLabel\_t

The cudnnFusedOpsConstParamLabel\_t is an enumerated type for the selection of the type of the cudnnFusedOps descriptor. For more information, see cudnnSetFusedOpsConstParamPackAttribute().

```
typedef enum {
 CUDNN PARAM XDESC
                                                                                                             = 0,
 CUDNN PARAM XDATA PLACEHOLDER
                                                                                                             = 1,
 CUDNN PARAM AND MODE
CUDNN PARAM BN MODE
CUDNN PARAM BN EQSCALEBIAS DESC
CUDNN PARAM BN EQSCALE PLACEHOLDER
CUDNN PARAM BN EQBIAS PLACEHOLDER
                                                                                                           = 2,
                                                                                                           = 3,
 CUDNN_PARAM_BN_EQBIAS_ILLCCCUDNN_PARAM_ACTIVATION_DESC
CUDNN_PARAM_CONV_DESC
 CUDNN_PARAM_WDESC
CUDNN_PARAM_WDATA_PLACEHOLDER
                                                                                                          = 8,
                                                                                                     = 9,
= 10,
  CUDNN_PARAM_DWDATA_PLACEHOLDER
                                                                                                         = 11,
 CUDNN PARAM DYDESC = 12,
CUDNN PARAM DYDESC = 13,
CUDNN PARAM DYDESC = 14,

CUDNN PARAM DYDATA PLACEHOLDER = 15,

CUDNN PARAM YSTATS DESC = 16,

CUDNN PARAM YSUM PLACEHOLDER = 17,

CUDNN PARAM YSQSUM PLACEHOLDER = 18,

CUDNN PARAM BN SCALEBIAS MEANVAR DESC = 19,

CUDNN PARAM BN SCALE PLACEHOLDER = 20,

CUDNN PARAM BN BIAS PLACEHOLDER = 21,

CUDNN PARAM BN SAVED MEAN PLACEHOLDER = 21,
 CUDNN PARAM BN BIAS PLACEHOLDER = 21,
CUDNN PARAM BN SAVED MEAN PLACEHOLDER = 22,
  CUDNN PARAM BN SAVED INVSTD PLACEHOLDER = 23,
 CUDNN PARAM BN SAVED INVSTD PLACEHOLDER = 23,
CUDNN PARAM BN RUNNING MEAN PLACEHOLDER = 24,
CUDNN PARAM BN RUNNING VAR PLACEHOLDER = 25,
CUDNN PARAM ZDESC = 26,
CUDNN PARAM ZDATA PLACEHOLDER = 27,
CUDNN PARAM BN Z EQSCALEBIAS DESC = 28,
CUDNN PARAM BN Z EQSCALE PLACEHOLDER = 29,
CUDNN PARAM BN Z EQBIAS PLACEHOLDER = 30,
CUDNN PARAM ACTIVATION BITMASK DESC = 31,
  CUDNN PARAM ACTIVATION BITMASK PLACEHOLDER = 32,
 CUDNN PARAM DXDESC = 33,
CUDNN PARAM DXDATA PLACEHOLDER = 34,
CUDNN PARAM DZDESC = 35,
CUDNN PARAM DZDATA PLACEHOLDER = 36,
CUDNN PARAM BN DSCALE PLACEHOLDER = 37,
CUDNN PARAM BN DBIAS PLACEHOLDER = 37,
CUDNN PARAM BN DBIAS PLACEHOLDER = 38,
} cudnnFusedOpsConstParamLabel t;
```

Short-form used	Stands for
Setter	<pre>cudnnSetFusedOpsConstParamPackAttribute()</pre>
Getter	$\underline{cudnnGetFusedOpsConstParamPackAttribute()}$
X_PointerPlaceHolder_t	<u>cudnnFusedOpsPointerPlaceHolder_t</u>
x_ prefix in the Attribute column	Stands for CUDNN_PARAM_ in the enumerator name

Table 22. CUDNN\_FUSED\_SCALE\_BIAS\_ACTIVATION\_CONV\_BNSTATS

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
X_XDESC	In the setter, the *param should be xDesc, a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout, and datatype of the x (input) tensor. r_t.	NULL
X_XDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether xData pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
x_bn_mode	In the setter, the *param should be a pointer to a previously initialized cudnnBatchNormMode_t	Describes the mode of operation for the scale, bias and the statistics.  *As of cuDNN 7.6.0, only CUDNN_BATCHNORM_SPAT and CUDNN_BATCHNORM_SPAT are supported, meaning, scale, bias, and statistics are all per-channel.	
X_BN_EQSCALEBIAS_DES	scIn the setter, the  *param should  be a pointer to a  previously initialized  cudnnTensorDescriptor	Tensor descriptor describing the size, layout, and datatype of the batchNorm tequivalent scale and bias tensors. The shapes must match the mode specified in CUDNN_PARAM_BN_MODE. If set to NULL, both scale and bias operation will become a NOP.	NULL
X_BN_EQSCALE_PLACEHO	Libethe setter, the  *param should  be a pointer to a  previously initialized  X_PointerPlaceHolder	Describes whether batchnorm equivalent scale pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
		If set to CUDNN_PTR_NULL, then the scale operation becomes a NOP.	
X_BN_EQBIAS_PLACEHOL	DERATHE SETTER, the  *param should  be a pointer to a  previously initialized  X_PointerPlaceHolder	user promised pointer alignment *.  If set to  CUDNN_PTR_NULL, then the bias operation	CUDNN_PTR_NULL
X_ACTIVATION_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnActivationDescripto	CUDNN_ACTIVATION_REL	
		and CUDNN_ACTIVATION_IDE are supported. If set to NULL or if the activation mode is set to CUDNN_ACTIVATION_IDE then the activation in the op sequence becomes a NOP.	
x_conv_desc	In the setter, the *param should be a pointer to a previously initialized cudnnConvolutionDescrip	Describes the convolution operation.	NULL
x_wdesc	In the setter, the  *param should be a pointer to a previously initialized cudnnFilterDescriptor_t*	Filter descriptor describing the size, layout and datatype of the w (filter) tensor.	NULL
X_WDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether w (filter) tensor pointer in the VariantParamPack will be NULL, or if not, _t*.	CUDNN_PTR_NULL

For the attribute CUDNN_FUSED_SCALE_BIAS_ACTIVATION_CONV_BNSTATS in cudnnFusedOp t			
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After
		user promised pointer alignment *.	
x_YDESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescriptor	Tensor descriptor describing the size, layout and datatype of the y (output) tensor.  **.	NULL
X_YDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether y (output) tensor pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_YSTATS_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout and datatype of the sum of y and sum of rytsquare tensors. The shapes need to match the mode specified in CUDNN_PARAM_BN_MODE.	NULL
		If set to NULL, the y statistics generation operation will become a NOP.	
X_YSUM_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether sum of y pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
		If set to CUDNN_PTR_NULL, the y statistics generation operation will become a NOP.	
X_YSQSUM_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether sum of y square pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL

For the attribute CUDNN_FUSED_SCALE_BIAS_ACTIVATION_CONV_BNSTATS in cudnnFusedOp_t				
Expected Descriptor Type Passed in, in Attribute the Setter Description Creation				
		If set to CUDNN_PTR_NULL, the y statistics generation operation will become a NOP.		



# Note:

- If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well.
- ▶ If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and need to be at least element-aligned or 16 bytes-aligned, respectively.

As of cuDNN 7.6.0, if the conditions in <u>Table 23</u> are met, then the fully fused fast path will be triggered. Otherwise, a slower partially fused path will be triggered.

Table 23. Conditions for Fully Fused Fast Path (Forward)

Parameter	Condition
Device compute capability	Need to be one of 7.0, 7.2 or 7.5.
CUDNN_PARAM_XDESC	Tensor is 4 dimensional
CUDNN_PARAM_XDATA_PLACEHOLDER	Datatype is CUDNN_DATA_HALF
	Layout is NHWC fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED
	Tensor's c dimension is a multiple of 8.
CUDNN_PARAM_BN_EQSCALEBIAS_DESC  CUDNN PARAM BN EQSCALE PLACEHOLDER	If either one of scale and bias operation is not turned into a NOP:
CUDNN PARAM BN EQBIAS PLACEHOLDER	Tensor is 4 dimensional with shape 1xCx1x1
CODNIV_I ARAM_DIV_DQDIAS_I BACBIIODDBIX	Datatype is CUDNN_DATA_HALF
	Layout is fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED
CUDNN_PARAM_CONV_DESC	Convolution descriptor's mode needs to be CUDNN_CROSS_CORRELATION.
CUDNN_PARAM_WDESC CUDNN_PARAM_WDATA_PLACEHOLDER	Convolution descriptor's dataType needs to be CUDNN_DATA_FLOAT.
	Convolution descriptor's dilationA is (1,1).

Parameter	Condition
	Convolution descriptor's group count needs to be 1.
	Convolution descriptor's mathType needs to be CUDNN_TENSOR_OP_MATH or CUDNN_TENSOR_OP_MATH_ALLOW_CONVERSION.
	Filter is in NHWC layout
	Filter's data type is CUDNN_DATA_HALF
	Filter's K dimension is a multiple of 32
	Filter size RxS is either 1x1 or 3x3
	If filter size RxS is 1x1, convolution descriptor's padA needs to be $(0,0)$ and filterStrideA needs to be $(1,1)$ .
	Filter's alignment is CUDNN_PTR_16B_ALIGNED
CUDNN_PARAM_YDESC	Tensor is 4 dimensional
CUDNN_PARAM_YDATA_PLACEHOLDER	Datatype is CUDNN_DATA_HALF
	Layout is NHWC fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED
CUDNN_PARAM_YSTATS_DESC  CUDNN_PARAM_YSUM_PLACEHOLDER	If the generate statistics operation is not turned into a NOP:
CUDNN PARAM YSQSUM PLACEHOLDER	Tensor is 4 dimensional with shape 1xKx1x1
CODAN_IMAM_IDGOOM_I BACBIOEDEN	Datatype is CUDNN_DATA_FLOAT
	Layout is fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED

Table 24. CUDNN\_FUSED\_SCALE\_BIAS\_ACTIVATION\_WGRAD

For the attribute CUDNN_FUSED_SCALE_BIAS_ACTIVATION_WGRAD in cudnnFusedOp_t			
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
X_XDESC	In the setter, the *param should be xDesc, a pointer to a previously initialized cudnnTensorDescrip	Tensor descriptor describing the size, layout and datatype of the x (input) tensor tor_t.	NULL
X_XDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether xData pointer in the VariantParamPack will be NULL, or if not, er_t*.	CUDNN_PTR_NULL

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
		user promised pointer alignment *.	
X_BN_MODE	In the setter, the *param should be a pointer to a previously initialized cudnnBatchNormMod	Describes the mode of operation for the scale, bias and the statistics.  Lett As of cuDNN 7.6.0, only CUDNN_BATCHNORM_SPA and CUDNN_BATCHNORM_SPA are supported, meaning, scale, bias, and statistics are all per-channel.	
X_BN_EQSCALEBIAS_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescript	Tensor descriptor describing the size, layout and datatype of the batchNorm orequivalent scale and bias tensors. The shapes must match the mode specified in CUDNN_PARAM_BN_MODE If set to NULL, both scale and bias operation will become a NOP.	NULL
X_BN_EQSCALE_PLACEHOLDER	*param should be a pointer to a previously initialized	Describes whether batchnorm equivalent scale pointer in the VariantParamPack dewilt be NULL, or if not, user promised pointer alignment *.  If set to CUDNN_PTR_NULL, then the scale operation becomes a NOP.	CUDNN_PTR_NULL
X_BN_EQBIAS_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether batchnorm equivalent bias pointer in the VariantParamPack	CUDNN_PTR_NULL

Attribute	Expected Descriptor Type Passed in, in the Setter	Descriptor Type Passed in, in the	
		user promised pointer alignment *.  If set to  CUDNN_PTR_NULL, then the bias operation becomes a NOP.	
X_ACTIVATION_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnActivationDescr	Describes the activation operation.  As of cuDNN 7.6.0, only activation mode of CUDNN_ACTIVATION_RE and CUDNN_ACTIVATION_ID is supported. If set to NULL or if the activation mode is set to CUDNN_ACTIVATION_ID then the activation in the op sequence becomes a NOP.	ENTITY
X_CONV_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnConvolutionDes	Describes the convolution operation.	NULL
X_DWDESC	In the setter, the *param should be a pointer to a previously initialized cudnnFilterDescriptor	Filter descriptor describing the size, layout and datatype of the dw (filter gradient toutput) tensor.	NULL
X_DWDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether dw (filter gradient output) tensor pointer in the VariantParamPack dewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_DYDESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout and datatype of the dy (gradient input)	NULL

For the attribute CUDNN_FUSED_SCALE_BIAS_ACTIVATION_WGRAD in cudnnFusedOp_t				
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation	
X_DYDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether dy (gradient input) tensor pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL	



# Note:

- If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well.
- ▶ If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and needs to be at least element-aligned or 16 bytes-aligned, respectively.

As of cuDNN 7.6.0, if the conditions in <u>Table 25</u> are met, then the fully fused fast path will be triggered. Otherwise a slower partially fused path will be triggered.

Table 25. Conditions for Fully Fused Fast Path (Backward)

Parameter	Condition
Device compute capability	Needs to be one of 7.0, 7.2 or 7.5.
CUDNN_PARAM_XDESC	Tensor is 4 dimensional
CUDNN_PARAM_XDATA_PLACEHOLDER	Datatype is CUDNN_DATA_HALF
	Layout is NHWC fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED
	Tensor's c dimension is a multiple of 8.
CUDNN_PARAM_BN_EQSCALEBIAS_DESC  CUDNN PARAM BN EQSCALE PLACEHOLDER	If either one of scale and bias operation is not turned into a NOP:
CUDNN_PARAM_BN_EQBIAS_PLACEHOLDER	Tensor is 4 dimensional with shape 1xCx1x1
CODNIC_TIMEN_DIV_DEDITIO_T MICHIGEDEN	Datatype is CUDNN_DATA_HALF
	Layout is fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED
CUDNN_PARAM_CONV_DESC CUDNN PARAM DWDESC	Convolution descriptor's mode needs to be CUDNN_CROSS_CORRELATION.
CUDNN_PARAM_DWDATA_PLACEHOLDER	Convolution descriptor's dataType needs to be CUDNN_DATA_FLOAT.

Parameter	Condition
	Convolution descriptor's dilationA is (1,1)
	Convolution descriptor's group count needs to be 1.
	Convolution descriptor's mathType needs to be CUDNN_TENSOR_OP_MATH or CUDNN_TENSOR_OP_MATH_ALLOW_CONVERSION.
	Filter gradient is in NHWC layout
	Filter gradient's data type is CUDNN_DATA_HALF
	Filter gradient's ĸ dimension is a multiple of 32.
	Filter gradient size RxS is either 1x1 or 3x3
	If filter gradient size RxS is 1x1, convolution descriptor's padA needs to be (0,0) and filterStrideA needs to be (1,1).
	Filter gradient's alignment is CUDNN_PTR_16B_ALIGNED
CUDNN_PARAM_DYDESC	Tensor is 4 dimensional
CUDNN_PARAM_DYDATA_PLACEHOLDER	Datatype is CUDNN_DATA_HALF
	Layout is NHWC fully packed
	Alignment is CUDNN_PTR_16B_ALIGNED

Table 26. CUDNN\_FUSED\_BN\_FINALIZE\_STATISTICS\_TRAINING

For the attribute CUDNN_FUSED_BN_FINALIZE_STATISTICS_TRAINING in cudnnFusedOp_t				
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation	
X_BN_MODE	In the setter, the *param should be a pointer to a previously initialized cudnnBatchNormMod	Describes the mode of operation for the scale, bias and the statistics.  e t* As of cuDNN 7.6.0, only CUDNN_BATCHNORM_SPA and CUDNN_BATCHNORM_SPA are supported, meaning, scale, bias and statistics are all per-channel.		
X_YSTATS_DESC	In the setter, the *param should	Tensor descriptor describing the size,	NULL	

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
	be a pointer to a previously initialized cudnnTensorDescrip	layout and datatype of the sum of y and towntof y square tensors. The shapes need to match the mode specified in CUDNN_PARAM_BN_MODE	
X_YSUM_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether sum of y pointer in the VariantParamPack will be NULL, or if not, euser promised pointer alignment *.	CUDNN_PTR_NULL
X_YSQSUM_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether sum of y square pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_BN_SCALEBIAS_MEANVAR_DE	skn the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	A common tensor descriptor describing the size, layout and datatype of the rbatchNorm trained scale, bias and statistics tensors. The shapes need to match the mode specified in CUDNN_PARAM_BN_MODE (similar to the bnScaleBiasMeanVarD field in the cudnnBatchNormaliza API).	
X_BN_SCALE_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether the batchNorm trained scale pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.  If the output of BN_EQSCALE is not needed, then this is	CUDNN_PTR_NULL

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
		not needed and may be NULL.	
X_BN_BIAS_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether the batchNorm trained bias pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
		If neither output of BN_EQSCALE or BN_EQBIAS is needed, then this is not needed and may be NULL.	
X_BN_SAVED_MEAN_PLACEHOLD	*param should be a pointer to a previously initialized	Describes whether the batchNorm saved mean pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
		If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.	
X_BN_SAVED_INVSTD_PLACEHO	Limethe setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether the batchNorm saved inverse standard deviation pointer in the eVattantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
		If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.	
X_BN_RUNNING_MEAN_PLACEHO	Limethe setter, the *param should be a pointer to a	Describes whether the batchNorm running mean pointer in the VariantParamPack will be NULL, or if not,	CUDNN_PTR_NULL

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
	<pre>previously initialized X_PointerPlaceHold</pre>	user promised pointer ea <u>li</u> gament *.	
		If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.	
X_BN_RUNNING_VAR_PLACEHOL	*param should be a pointer to a previously initialized	Describes whether the batchNorm running variance pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.  If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.	CUDNN_PTR_NULL
X_BN_EQSCALEBIAS_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout and datatype of the batchNorm rettuivalent scale and bias tensors. The shapes need to match the mode specified in CUDNN_PARAM_BN_MODE If neither output of BN_EQSCALE or BN_EQBIAS is needed, then this is not needed and may be NULL.	NULL
X_BN_EQSCALE_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether batchnorm equivalent scale pointer in the VariantParamPack ewilt to NULL, or if not, user promised pointer alignment *.  If set to  CUDNN_PTR_NULL, then the computation for	CUDNN_PTR_NULL

For the attribute CUDNN_FUSED_BN_FINALIZE_STATISTICS_TRAINING in cudnnFusedOp_t				
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation	
		this output becomes a NOP.		
X_BN_EQBIAS_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether batchnorm equivalent bias pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL	
		If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.		

Table 27. CUDNN\_FUSED\_BN\_FINALIZE\_STATISTICS\_INFERENCE

For the attribute CUDNN_FUSED_BN_FINALIZE_STATISTICS_INFERENCE in cudnnFusedOp_t				
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation	
X_BN_MODE	In the setter, the *param should be a pointer to a previously initialized cudnnBatchNormMode	Describes the mode of operation for the scale, bias and the statistics.  The statistics of cuDNN  The statistics of cuDNN		
X_BN_SCALEBIAS_MEANVAR_DE	skn the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	A common tensor descriptor describing the size, layout and datatype of the rbatchNorm trained scale, bias and statistics tensors. The	NULL	

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
		shapes need to match the mode specified in CUDNN_PARAM_BN_MODE (similar to the bnScaleBiasMeanVarDield in the cudnnBatchNormaliza API).	
X_BN_SCALE_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether the batchNorm trained scale pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_BN_BIAS_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether the batchNorm trained bias pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_BN_RUNNING_MEAN_PLACEHO	*param should be a pointer to a previously initialized	Describes whether the batchNorm running mean pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_BN_RUNNING_VAR_PLACEHOL	*param should be a pointer to a previously initialized	Describes whether the batchNorm running variance pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_BN_EQSCALEBIAS_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout and datatype of the batchNorm prequivalent scale and bias tensors. The shapes need to match the mode specified in CUDNN_PARAM_BN_MODE	NULL

For the attribute CUDNN_FUSED_BN_FINALIZE_STATISTICS_INFERENCE in cudnnFusedOp_t				
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation	
X_BN_EQSCALE_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether batchnorm equivalent scale pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL	
		If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.		
X_BN_EQBIAS_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHold	Describes whether batchnorm equivalent bias pointer in the VariantParamPack ewilt be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL	
		If set to CUDNN_PTR_NULL, then the computation for this output becomes a NOP.		

Table 28. CUDNN\_FUSED\_CONVOLUTION\_SCALE\_BIAS\_ADD\_RELU

For the attribute CUDNN\_FUSED\_CONVOLUTION\_SCALE\_BIAS\_ADD\_RELU in cudnnFusedOp\_t This operation performs the following computation, where  $\star$  denotes convolution operator: y=1 (w\*x)+2 z+b

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
X_XDESC	In the setter, the *param should be xDesc, a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout and datatype of the x (input) tensor.  r_t.	NULL
X_XDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a	Describes whether xData pointer in the VariantParamPack will be NULL, or if not,	CUDNN_PTR_NULL

For the attribute CUDNN\_FUSED\_CONVOLUTION\_SCALE\_BIAS\_ADD\_RELU in cudnnFusedOp\_t
This operation performs the following computation, where  $\star$  denotes convolution operator: y=1 (w\*x)+2 z+b

	Expected Descriptor		D ( 11)/ 1 40
Attribute	Type Passed in, in the Setter	Description	Default Value After Creation
	previously initialized X_PointerPlaceHolder	user promised pointer _athgnment *.	
x_CONV_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnConvolutionDescrip	Describes the convolution operation.	NULL
X_WDESC	In the setter, the *param should be a pointer to a previously initialized cudnnFilterDescriptor t.	Filter descriptor describing the size, layout and datatype of the w (filter) tensor.	NULL
X_WDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether w (filter) tensor pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL
X_BN_EQSCALEBIAS_DES	*param should be a pointer to a previously initialized	Tensor descriptor describing the size, layout and datatype of the a <sub>1</sub> scale and this tensors. The tensor should have shape (1,K,1,1), K is the number of output features.	NULL
X_BN_EQSCALE_PLACEHO	Libethe setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether batchnorm equivalent scale or o1 tensor pointer in the \textstyle=\tex	CUDNN_PTR_NULL
		If set to CUDNN_PTR_NULL, then a <sub>1</sub> scaling becomes an NOP.	
X_ZDESC	In the setter, the *param should be xDesc, a pointer to a	Tensor descriptor describing the size, layout and datatype of the z tensor.	NULL

For the attribute CUDNN\_FUSED\_CONVOLUTION\_SCALE\_BIAS\_ADD\_RELU in cudnnFusedOp\_t
This operation performs the following computation, where  $\star$  denotes convolution operator: y=1 (w\*x)+2 z+b

y=1 (w^x) +2 Z+D			
Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
	previously initialized cudnnTensorDescripto	If unset, then z scale- radd term becomes a NOP.	
CUDNN_PARAM_ZDATA_PL	Abethorsetter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether z tensor pointer in the VariantParamPack will be NULL, or if not, teser promised pointer alignment *.  If set to CUDNN_PTR_NULL, then z scale-add term becomes a NOP.	CUDNN_PTR_NULL
CUDNN_PARAM_BN_Z_EQS	ckr.theraetter.stbe *param should be a pointer to a previously initialized cudnnTensorDescriptor	Tensor descriptor describing the size, layout and datatype of the a <sub>2</sub> tensor.  If set to NULL then scaling for input z becomes a NOP.	NULLPTR
CUDNN_PARAM_BN_Z_EQS	CRITHESELTER, CHORER *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether batchnorm z-equivalent scaling pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.  If set to CUDNN_PTR_NULL, then the scaling for input z becomes a NOP.	CUDNN_PTR_NULL
X_ACTIVATION_DESC	In the setter, the *param should be a pointer to a previously initialized cudnnActivationDescripto	Describes the activation operation.  As of 7.6.0, only activation modes of outlined to the color of the color of outlined to the color of outlined to the color of outlined to the color of the activation mode is set to	U

For the attribute CUDNN\_FUSED\_CONVOLUTION\_SCALE\_BIAS\_ADD\_RELU in cudnnFusedOp\_t This operation performs the following computation, where \* denotes convolution operator: y=1(w\*x)+2 z+b

Attribute	Expected Descriptor Type Passed in, in the Setter	Description	Default Value After Creation
		CUDNN_ACTIVATION_IDE then the activation in the op sequence becomes a NOP.	NTITY,
X_YDESC	In the setter, the *param should be a pointer to a previously initialized cudnnTensorDescripto	Tensor descriptor describing the size, layout and datatype of the y (output) tensor.  r_t*.	NULL
X_YDATA_PLACEHOLDER	In the setter, the *param should be a pointer to a previously initialized X_PointerPlaceHolder	Describes whether y (output) tensor pointer in the VariantParamPack will be NULL, or if not, user promised pointer alignment *.	CUDNN_PTR_NULL

#### 6.1.3.3. cudnnFusedOpsPointerPlaceHolder t

cudnnFusedOpsPointerPlaceHolder t is an enumerated type used to select the alignment type of the cudnnFusedOps descriptor pointer.

Member	Description
CUDNN_PTR_NULL = 0	Indicates that the pointer to the tensor in the variantPack will be NULL.
CUDNN_PTR_ELEM_ALIGNED = 1	Indicates that the pointer to the tensor in the variantPack will not be NULL, and will have element alignment.
CUDNN_PTR_16B_ALIGNED = 2	Indicates that the pointer to the tensor in the variantPack will not be NULL, and will have 16 byte alignment.

#### 6.1.3.4. cudnnFusedOpsVariantParamLabel t

The cudnnFusedOpsVariantParamLabel t is an enumerated type that is used to set the buffer pointers. These buffer pointers can be changed in each iteration.

```
typedef enum {
CUDNN PTR XDATA
                                                     = 0,
CUDNN PTR BN EQSCALE
                                                     = 1,
                                                     = 2,
CUDNN PTR BN EQBIAS
                                                     = 3,
CUDNN PTR WDATA
                                                    = 4,
CUDNN_PTR_DWDATA
CUDNN_PTR_YDATA
CUDNN_PTR_DYDATA
                                                     = 5,
```

```
CUDNN PTR YSUM
                                                           = 8,
 CUDNN_PTR_YSQSUM
CUDNN_PTR_WORKSPACE
CUDNN_PTR_BN_SCALE
                                                            = 9,
                                                           = 10,
                                                           = 11,
 CUDNN PTR BN BIAS
 CUDNN PTR BN SAVED MEAN
                                                           = 12,
                                                           = 13,
 CUDNN_PTR_BN_SAVED_INVSTD
CUDNN PTR BN RUNNING MEAN CUDNN PTR BN RUNNING VAR
                                                           = 14,
                                                          = 15,
 CUDNN PTR ZDATA
                                                          = 16,
                                                          = 17,
 CUDNN PTR BN Z EQSCALE
                                                           = 18,
 CUDNN_PTR_BN_Z_EQBIAS
 CUDNN_PTR_ACTIVATION_BITMASK
                                                           = 19,
CUDNN_PTR_DXDATA
CUDNN_PTR_DZDATA
                                                           = 20,
                                                           = 21,
 CUDNN PTR BN DSCALE
                                                           = 22,
 CUDNN PTR BN DBIAS
                                                           = 23,
CUDNN SCALAR SIZE T WORKSPACE SIZE IN BYTES = 100,
CUDNN SCALAR INT64 T BN ACCUMULATION COUNT = 101,
CUDNN SCALAR DOUBLE BN EXP AVG FACTOR = 102,
 CUDNN SCALAR DOUBLE BN EPSILON
                                                           = 103,
} cudnnFusedOpsVariantParamLabel t;
```

# Table 29. Legend For Tables in This Section

Short-form used	Stands for
Setter	<pre>cudnnSetFusedOpsVariantParamPackAttribute()</pre>
Getter	$\underline{cudnnGetFusedOpsVariantParamPackAttribute()}$
x_ prefix in the <b>Attribute key</b> column	Stands for CUDNN_PTR_ or CUDNN_SCALAR_ in the enumerator name.

# Table 30. CUDNN\_FUSED\_SCALE\_BIAS\_ACTIVATION\_CONV\_BNSTATS

For the attribute CUDNN_FUSED_SCALE_BIAS_ACTIVATION_CONV_BNSTATS in cudnnFusedOp_t					
Attribute key	Expected Descriptor Type Passed in, in the Setter	I/O Type	Description	Default Value	
X_XDATA	void *	input	Pointer to x (input) tensor on device, need to agree with previously set CUDNN_PARAM_XDATA_PLACEHOLD: attribute *.	NULL ER	
X_BN_EQSCALE	void *	input	Pointer to batchnorm equivalent scale tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQSCALE_PLACTACTUDINE *.	NULL EHOLDER	

For the attribute CUDNN_cudnnFusedOp_t	FUSED_SCAL	E_BIAS_ACT	'IVATION_CONV_BNSTATS in	
Attribute key	Expected Descriptor Type Passed in, in the Setter	I/O Type	Description	Default Value
X_BN_EQBIAS	void *	input	Pointer to batchnorm equivalent bias tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQBIAS_PLACE attribute *.	NULL HOLDER
X_WDATA	void *	input	Pointer to w (filter) tensor on device, need to agree with previously set CUDNN_PARAM_WDATA_PLACEHOLD attribute *.	NULL ER
X_YDATA	void *	output	Pointer to y (output) tensor on device, need to agree with previously set CUDNN_PARAM_YDATA_PLACEHOLD attribute *.	NULL ER
X_YSUM	void *	output	Pointer to sum of y tensor on device, need to agree with previously set CUDNN_PARAM_YSUM_PLACEHOLDE attribute *.	NULL R
X_YSQSUM	void *	output	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_YSQSUM_PLACEHOL attribute *.	NULL
X_WORKSPACE	void *	input	Pointer to user allocated workspace on device. Can be NULL if the workspace size requested is 0.	NULL
X_SIZE_T_WORKSPACE_SIZ	E <u>s</u> im <u>eB</u> ¥TES	input	Pointer to a size_t value in host memory describing the user allocated workspace size in bytes. The amount needs to be equal or larger than the amount requested in cudnnMakeFusedOpsPlan.	0

# Note:

▶ If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well

If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and needs to be at least element-aligned or 16 bytes-aligned, respectively.

Table 31. CUDNN\_FUSED\_SCALE\_BIAS\_ACTIVATION\_WGRAD

	Expected Descripto Type Passed in, in the			Default
Attribute key	Setter	I/O Type	Description	Value
X_XDATA	void *	input	Pointer to x (input) tensor on device, need to agree with previously set CUDNN_PARAM_XDATA_PLACEHO attribute *.	NULL OLDER
X_BN_EQSCALE	void *	input	Pointer to batchnorm equivalent scale tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQSCALE_P: attribute *.	NULL LACEHOLDEF
X_BN_EQBIAS	void *	input	Pointer to batchnorm equivalent bias tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQBIAS_PL attribute *.	NULL ACEHOLDER
X_DWDATA	void *	output	Pointer to dw (filter gradient output) tensor on device, need to agree with previously set CUDNN_PARAM_WDATA_PLACEHOALTIBUTE *.	NULL OLDER
X_DYDATA	void *	input	Pointer to dy (gradient input) tensor on device, need to agree with previously set CUDNN_PARAM_YDATA_PLACEHOATTIBUTE *.	NULL
X_WORKSPACE	void *	input	Pointer to user allocated workspace on device. Can be NULL if the workspace size requested is 0.	NULL
X_SIZE_T_WORKSPACE_SIZE_IN_F	BYSESe_t *	input	Pointer to a size_t value in host memory describing the	0

For the attribute CUDNN_FUSED_	_SCALE_BIA	AS_ACTIVAT	FION_WGRAD in cudnnFusedO	p_t
Attribute key	Expected Descriptor Type Passed in, in the Setter	I/O Type	Description	Default Value
			user allocated workspace size in bytes. The amount needs to be equal or larger than the amount requested	



# Note:

- If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well.
- ▶ If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and needs to be at least element-aligned or 16 bytes-aligned, respectively.

Table 32. CUDNN FUSED BN FINALIZE STATISTICS TRAINING

For the attribute CUDNN_FUSED	_BN_FINAI	LIZE_STAT	ISTICS_TRAINING in cudnnFus	sedOp_t
Attribute key	Expected Descripto Type Passed in, in the Setter	I/O Type	Description	Default Value
X_YSUM	void *	input	Pointer to sum of y tensor on device, need to agree with previously set CUDNN_PARAM_YSUM_PLACEHOLDE attribute *.	NULL R
X_YSQSUM	void *	input	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_YSQSUM_PLACEHOL attribute *.	NULL DER
X_BN_SCALE	void *	input	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_SCALE_PLACEH attribute *.	NULL OLDER

Attribute key	Expected Descripto Type Passed in, in the Setter		Description	Default Value
X_BN_BIAS	void *	input	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_BIAS_PLACEHO attribute *.	NULL LDER
X_BN_SAVED_MEAN	void *	output	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_SAVED_MEAN_Pattribute *.	NULL LACEHOLDER
X_BN_SAVED_INVSTD	void *	output	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_SAVED_INVSTD attribute *.	NULL _PLACEHOLD
X_BN_RUNNING_MEAN	void *	input/ output	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_RUNNING_MEAN attribute *.	NULL _PLACEHOLD
X_BN_RUNNING_VAR	void *	input/ output	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_RUNNING_VAR_attribute *.	NULL PLACEHOLDE
X_BN_EQSCALE	void *	output	Pointer to batchnorm equivalent scale tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQSCALE_PLAC attribute *.	
X_BN_EQBIAS	void *	output	Pointer to batchnorm equivalent bias tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQBIAS_PLACE attribute *.	NULL
X_INT64_T_BN_ACCUMULATION_CO	UNIE 64_t *	input	Pointer to a scalar value in int64_t on host memory.  This value should describe the number of tensor elements accumulated in the sum of y and sum of y square tensors.	0

	Expected Descriptor Type Passed in, in the			Default
Attribute key	Setter	I/O Type	For example, in the single GPU use case, if the mode is CUDNN_BATCHNORM_SPATIAL OF CUDNN_BATCHNORM_SPATIAL_PER the value should be equal to N*H*W of the tensor from which the statistics are calculated.  In multi-GPU use case, if all-reduce has been performed on the sum of y and sum of y square tensors, this value should be the sum of the single GPU accumulation count on	Value
X_DOUBLE_BN_EXP_AVG_FACTOR	double *	input	each of the GPUs.  Pointer to a scalar value in double on host memory.  Factor used in the moving average computation. See exponentialAverageFactor in cudnnBatchNormalization* APIs.	0.0
X_DOUBLE_BN_EPSILON	double *	input	Pointer to a scalar value in double on host memory.  A conditioning constant used in the batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN_BN_MIN_EPSILON in cudnn.h.  See exponentialAverageFactor in cudnnBatchNormalization* APIs.	0.0
X_WORKSPACE	void *	input	Pointer to user allocated workspace on device. Can be NULL if the workspace size requested is 0.	NULL
X_SIZE_T_WORKSPACE_SIZE_IN_F	3 <b>YTR</b> &t *	input	Pointer to a size_t value in host memory describing the user allocated workspace	0

For the attribute CUDNN_FUSED_BN_FINALIZE_STATISTICS_TRAINING in cudnnFusedOp_t						
Attribute key	Expected Descripto Type Passed in, in the Setter		Description	Default Value		
			size in bytes. The amount needs to be equal or larger than the amount requested in cudnnMakeFusedOpsPlan.			



## Note:

- If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well.
- ▶ If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and needs to be at least element-aligned or 16 bytes-aligned, respectively.

Table 33. CUDNN\_FUSED\_BN\_FINALIZE\_STATISTICS\_INFERENCE

For the attribute CUDNN_FT	USED_BN_FINA	LIZE_STA	TISTICS_INFERENCE in cudnnF	usedOp_t
Attribute key	Expected Descripto Type Passed in, in the Setter		Description	Default Value
X_BN_SCALE	void *	input	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_SCALE_PLACEH attribute *.	NULL
X_BN_BIAS	void *	input	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_BIAS_PLACEHO attribute *.	NULL LDER
X_BN_RUNNING_MEAN	void *	input/ output	Pointer to sum of y square tensor on device, need to agree with previously set CUDNN_PARAM_BN_RUNNING_MEAN attribute *.	NULL PLACEHOLDE
X_BN_RUNNING_VAR	void *	input/ output	Pointer to sum of y square tensor on device, need to	NULL

Attribute key	Expected Descripto Type Passed in, in the Setter	I/O Type	Description	Default Value
			agree with previously set  CUDNN_PARAM_BN_RUNNING_VAR_  attribute *.	PLACEHOLD:
X_BN_EQSCALE	void *	output	Pointer to batchnorm equivalent scale tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQSCALE_PLACTACTUDE *.	NULL EHOLDER
X_BN_EQBIAS	void *	output	Pointer to batchnorm equivalent bias tensor on device, need to agree with previously set CUDNN_PARAM_BN_EQBIAS_PLACE attribute *.	NULL HOLDER
X_DOUBLE_BN_EPSILON	double *	input	Pointer to a scalar value in double on host memory.  A conditioning constant used in the batch normalization formula. Its value should be equal to or greater than the value defined for CUDNN_BN_MIN_EPSILON in cudnn.h.  See exponentialAverageFactor in cudnnBatchNormalization* APIs.	0.0
X_WORKSPACE	void *	input	Pointer to user allocated workspace on device. Can be NULL if the workspace size requested is 0.	NULL
X_SIZE_T_WORKSPACE_SIZE_IN_	BSTTRS_t *	input	Pointer to a size_t value in host memory describing the user allocated workspace size in bytes. The amount needs to be equal or larger than the amount requested in cudnnMakeFusedOpsPlan.	0

## Note:

If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well.

If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and needs to be at least element-aligned or 16 bytes-aligned, respectively.

Table 34. CUDNN\_FUSED\_SCALE\_BIAS\_ADD\_RELU

Attribute key	Expected Descriptor Type Passed in, in the Setter	I/O Type	Description	Default Value
x_xdata	void *	input	Pointer to x (image) tensor on device, need to agree with previously set CUDNN_PARAM_XDA' attribute *.	NULL  TA_PLACEHOLDER
X_WDATA	void *	input	Pointer to w (filter) tensor on device, need to agree with previously set CUDNN_PARAM_WDAY attribute *.	NULL  FA_PLACEHOLDER
X_BN_EQSCALE	void *	input	Pointer to alphal or batchnorm equivalent scale tensor on device; need to agree with previously set CUDNN_PARAM_BN_1 attribute *.	NULL  EQSCALE_PLACEHOLDER
X_ZDATA	void *	input	Pointer to z ( tensor on device; Need to agree with previously set CUDNN_PARAM_YDA' attribute *.	NULL TA_PLACEHOLDER
X_BN_Z_EQSCALE	void *	input	Pointer to alpha2, equivalent scale tensor for z; Need to agree with previously set CUDNN_PARAM_BN_attribute *.	NULL Z_EQSCALE_PLACEHOLDE
X_BN_Z_EQBIAS	void *	input	Pointer to batchnorm equivalent bias	NULL

Attribute key	Expected Descriptor Type Passed in, in the Setter	I/O Type	Description	Default Value
			tensor on device, need to agree with previously set CUDNN_PARAM_BN_Z attribute *.	_EQBIAS_PLACEHOLI
X_YDATA	void *	output	Pointer to y (output) tensor on device, need to agree with previously set CUDNN_PARAM_YDAT attribute *.	NULL  A_PLACEHOLDER
X_WORKSPACE	void *	input	Pointer to user allocated workspace on device. Can be NULL if the workspace size requested is 0.	NULL
X_SIZE_T_WORKSPA	CSLi264_ZTE_TIN_BYTES	input	Pointer to a size_t value in host memory describing the user allocated workspace size in bytes. The amount needs to be equal or larger than the amount requested in cudnnMakeFusedOp	OsPlan.



## Note:

- If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_NULL, then the device pointer in the VariantParamPack needs to be NULL as well.
- ▶ If the corresponding pointer placeholder in ConstParamPack is set to CUDNN\_PTR\_ELEM\_ALIGNED or CUDNN\_PTR\_16B\_ALIGNED, then the device pointer in the VariantParamPack may not be NULL and needs to be at least element-aligned or 16 bytes-aligned, respectively.

# 6.2. API Functions

# 6.2.1. cudnnConvolutionBackwardBias()

This function computes the convolution function gradient with respect to the bias, which is the sum of every element belonging to the same feature map across all of the images of the input tensor. Therefore, the number of elements produced is equal to the number of features maps of the input tensor.

## **Parameters**

## handle

*Input.* Handle to a previously created cuDNN context. For more information, see <u>cudnnHandle</u> t.

## alpha, beta

*Input*. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*resultValue + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

## dyDesc

*Input*. Handle to the previously initialized input tensor descriptor. For more information, see <u>cudnnTensorDescriptor</u> t.

## dy

Input. Data pointer to GPU memory associated with the tensor descriptor dyDesc.

#### dbDesc

*Input.* Handle to the previously initialized output tensor descriptor.

#### db

Output. Data pointer to GPU memory associated with the output tensor descriptor dbDesc.

#### Returns

## CUDNN STATUS SUCCESS

The operation was launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the parameters n, height, width of the output tensor is not 1.
- The numbers of feature maps of the input tensor and output tensor differ.
- The dataType of the two tensor descriptors is different.

# cudnnConvolutionBackwardFilter()

```
cudnnStatus t cudnnConvolutionBackwardFilter(
   cudnnHandle t
   const void
                                       *alpha,
   const cudnnTensorDescriptor t
                                       xDesc,
   const void
                                      *x,
   const cudnnTensorDescriptor t
                                       dyDesc,
                                      *dy,
   const void
   const cudnnConvolutionDescriptor_t convDesc,
   cudnnConvolutionBwdFilterAlgo t
                                       algo,
                                      *workSpace,
   void
   size t
                                       workSpaceSizeInBytes,
   const void
                                      *beta,
   const cudnnFilterDescriptor t
                                      dwDesc,
                                       *dw)
```

This function computes the convolution weight (filter) gradient of the tensor dy, where y is the output of the forward convolution in <a href="mailto:cudnnConvolutionForward">cudnnConvolutionForward()</a>. It uses the specified algo, and returns the results in the output tensor dw. Scaling factors alpha and beta can be used to scale the computed result or accumulate with the current dw.

## **Parameters**

## handle

Input. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### alpha, beta

Input. Pointers to scaling factors (in host memory) used to blend the computation result with prior value in the output layer as follows:

```
dstValue = alpha[0]*result + beta[0]*priorDstValue
```

For more information, see <u>Scaling Parameters</u> in the *cuDNN Developer Guide*.

## **x**Desc

Input. Handle to a previously initialized tensor descriptor. For more information, see cudnnTensorDescriptor t.

x

Input. Data pointer to GPU memory associated with the tensor descriptor xDesc.

#### dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

#### dy

*Input*. Data pointer to GPU memory associated with the backpropagation gradient tensor descriptor dyDesc.

#### convDesc

*Input.* Previously initialized convolution descriptor. For more information, see <u>cudnnConvolutionDescriptor\_t</u>.

## algo

*Input*. Enumerant that specifies which convolution algorithm should be used to compute the results. For more information, see <u>cudnnConvolutionBwdFilterAlgo</u> t.

## workSpace

*Input*. Data pointer to GPU memory to a workspace needed to be able to execute the specified algorithm. If no workspace is needed for a particular algorithm, that pointer can be nil.

## workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workSpace.

#### dwDesc

*Input.* Handle to a previously initialized filter gradient descriptor. For more information, see <u>cudnnFilterDescriptor</u> t.

### dw

*Input/Output*. Data pointer to GPU memory associated with the filter gradient descriptor dwDesc that carries the result.

## Supported configurations

This function supports the following combinations of data types for xDesc, dyDesc, convDesc, and dwDesc.

Data Type Configurations	xDesc, dyDesc, and dwDesc Data Type	convDesc Data Type
TRUE_HALF_CONFIG (only supported on architectures with true FP16 support, meaning, compute capability 5.3 and later)	CUDNN_DATA_HALF	CUDNN_DATA_HALF
PSEUDO_HALF_CONFIG	CUDNN_DATA_HALF	CUDNN_DATA_FLOAT
FLOAT_CONFIG	CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT
DOUBLE_CONFIG	CUDNN_DATA_DOUBLE	CUDNN_DATA_DOUBLE

## Supported algorithms



**Note:** Specifying a separate algorithm can cause changes in performance, support and computation determinism. See the following table for an exhaustive list of algorithm options and their respective supported parameters and deterministic behavior.

The table below shows the list of the supported 2D and 3D convolutions. The 2D convolutions are described first, followed by the 3D convolutions.

For the following terms, the short-form versions shown in the parentheses are used in the table below, for brevity:

- ► CUDNN CONVOLUTION BWD FILTER ALGO 0 (\_ALGO\_0)
- ► CUDNN CONVOLUTION BWD FILTER ALGO 1 (\_ALGO\_1)
- CUDNN CONVOLUTION BWD FILTER ALGO 3 (\_ALGO\_3)
- CUDNN CONVOLUTION BWD FILTER ALGO FFT (\_FFT)
- ► CUDNN\_CONVOLUTION\_BWD\_FILTER\_ALGO\_FFT\_TILING (\_FFT\_TILING)
- ▶ CUDNN CONVOLUTION BWD FILTER ALGO WINOGRAD NONFUSED (\_WINOGRAD\_NONFUSED)
- CUDNN TENSOR NCHW (\_NCHW)
- ► CUDNN TENSOR NHWC (\_NHWC)
- ► CUDNN TENSOR NCHW VECT C (\_NCHW\_VECT\_C)

Table 35. For 2D convolutions: dwDesc: NHWC

Filter descriptor dwDesc: _NHWC (see <u>cudnnTensorFormat_t</u> )						
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important	
_ALGO_0 and _ALGO_1		NHWC HWC- packed	NHWC HWC- packed	PSEUDO_HALF_C	ONFIG	

Table 36. For 2D convolutions: Desc: \_NCHW

ritter descrip	otor Desc: _NCHW	V			
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
_ALGO_0	No	All except _NCHW_VECT_C	NCHW CHW- packed	PSEUDO_HALF_C	o <b>Dilation:</b> greater than 0 for all dimensions convDesc Group Count Support: Greater than 0
_ALGO_1	Yes	All except _NCHW_VECT_C	NCHW CHW- packed	TRUE_HALF_CON PSEUDO_HALF_CONFIG FLOAT_CONFIG DOUBLE_CONFIG	
_FFT	Yes	NCHW CHW-packed	NCHW CHW-packed	PSEUDO_HALF_C	oDilation: 1 for all dimensions convDesc Group Count Support: Greater than (xDesc feature map height + 2 * convDesc zero-padding height must equal 256 or less xDesc feature map width + 2 * convDesc zero-padding

Filter descript	or Desc: _NCHV	₹			
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important
					width must equal 256 or less convDesc vertical and horizontal filter stride must equal 1 dwDesc filter height must be greater than convDesc zero-padding height dwDesc filter width must be greater than convDesc zero-padding
_ALGO_3	Yes	All except _NCHW_VECT_C	NCHW CHW- packed	PSEUDO_HALF_CONFIG  FLOAT_CONFIG  DOUBLE_CONFIG	convDesc Group Count Support: Greater than 0
_WINOGRAD_NON	f <b>ve</b> £d	All except _NCHW_VECT_C	NCHW CHW- packed	TRUE_HALF_CON PSEUDO_HALF_CONFIG	F <b>Dilation:</b> 1 for all dimensions DNF IG convDesc Group Count Support: Greater than 0 convDesc vertical and

Filter descriptor Desc: _NCHW							
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important		
					horizontal filter stride must equal 1		
					wDesc filter (height, width) must be (3,3) or (5,5)		
					If wDesc filter (height, width) is (5,5), then the data type config TRUE_HALF_CONF is not supported.		
_FFT_TILING	Yes	NCHW CHW-	NCHW CHW-	PSEUDO_HALF_C	o <b>Dilation:</b> 1 for		
		packed	packed	FLOAT_CONFIG	all dimensions		
				DOUBLE_CONFIG	convDesc Group Count Support: Greater than 0 xDesc width or height must equal 1 dyDesc width or height must equal 1 (the same dimension as in xDesc). The other dimension must be less than or equal to 256,		

Filter descript	Filter descriptor Desc: _NCHW						
Algo Name	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important		
					meaning, the largest 1D tile size currently supported.  convDesc vertical and horizontal filter stride must equal 1  dwDesc filter height must be greater than convDesc zero-padding height  dwDesc filter width must be greater than convDesc zero-padding height width must be greater than convDesc zero-padding width		

Table 37. For 3D convolutions: wDesc: \_NCHW

Filter descriptor wDesc: _NCHW.										
Algo Name (3D Convolutions)	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important					
_ALGO_0	No	All except _NCDHW_VECT_C	NCDHW . CDHW-packed	PSEUDO_HALF_COFLOAT_CONFIG	greater than O for all					

Filter descriptor wDesc: _NCHW.									
Algo Name (3D Convolutions)	Deterministic (Yes or No)	Tensor Formats Supported for dyDesc	Tensor Formats Supported for dxDesc	Data Type Configurations Supported	Important				
					Support: Greater than 0				
_ALGO_3	No	NCDHW fully- packed	NCDHW fully- packed	PSEUDO_HALF_COFIGEDOUBLE_CONFI	greater than O for all				

## Returns

## CUDNN\_STATUS\_SUCCESS

The operation was launched successfully.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- At least one of the following is NULL: handle, xDesc, dyDesc, convDesc, dwDesc, xData, dyData, dwData, alpha, beta
- xDesc and dyDesc have a non-matching number of dimensions
- xDesc and dwDesc have a non-matching number of dimensions
- xDesc has fewer than three number of dimensions
- xDesc, dyDesc, and dwDesc have a non-matching data type.
- \*Desc and dwDesc have a non-matching number of input feature maps per image (or group in case of grouped convolutions).
- yDesc or wDesc indicate an output channel count that isn't a multiple of group count (if group count has been set in convDesc).

## CUDNN STATUS NOT SUPPORTED

At least one of the following conditions are met:

- xDesc or dyDesc have negative tensor striding
- xDesc, dyDesc or dwDesc has a number of dimensions that is not 4 or 5
- The chosen algo does not support the parameters provided; see above for exhaustive list of parameter support for each algo

## CUDNN STATUS MAPPING ERROR

An error occurs during the texture binding of the filter data.

## CUDNN\_STATUS\_EXECUTION\_FAILED

The function failed to launch on the GPU.

# 6.2.3. cudnnCreateFusedOpsConstParamPack()

```
cudnnStatus_t cudnnCreateFusedOpsConstParamPack(
  cudnnFusedOpsConstParamPack_t *constPack,
  cudnnFusedOps t ops);
```

This function creates an opaque structure to store the various problem size information, such as the shape, layout and the type of tensors, and the descriptors for convolution and activation, for the selected sequence of cudnnFusedOps computations.

## **Parameters**

#### constPack

*Input.* The opaque structure that is created by this function. For more information, see cudnnFusedOpsConstParamPack t.

#### ops

Input. The specific sequence of computations to perform in the cudnnFusedOps computations, as defined in the enumerant type cudnnFusedOps t.

## Returns

#### CUDNN STATUS BAD PARAM

If either constPack or ops is NULL.

## CUDNN\_STATUS\_SUCCESS

If the descriptor is created successfully.

## CUDNN STATUS NOT SUPPORTED

If the ops enum value is not supported or reserved for future use.

# 6.2.4. cudnnCreateFusedOpsPlan()

```
cudnnStatus_t cudnnCreateFusedOpsPlan(
  cudnnFusedOpsPlan_t *plan,
  cudnnFusedOps t ops);
```

This function creates the plan descriptor for the cudnnFusedOps computation. This descriptor contains the plan information, including the problem type and size, which kernels should be run, and the internal workspace partition.

## **Parameters**

#### plan

*Input*. A pointer to the instance of the descriptor created by this function.

#### ops

*Input*. The specific sequence of fused operations computations for which this plan descriptor should be created. For more information, see <u>cudnnFusedOps\_t</u>.

## Returns

## CUDNN STATUS BAD PARAM

If either the input \*plan is NULL or the ops input is not a valid cudnnFusedOp enum.

## CUDNN STATUS NOT SUPPORTED

The ops input provided is not supported.

## CUDNN STATUS SUCCESS

The plan descriptor is created successfully.

# 6.2.5. cudnnCreateFusedOpsVariantParamPack()

```
cudnnStatus_t cudnnCreateFusedOpsVariantParamPack(
  cudnnFusedOpsVariantParamPack_t *varPack,
  cudnnFusedOps t ops);
```

This function creates a descriptor for cudnnFusedOps constant parameters.

## **Parameters**

#### varPack

*Input.* Pointer to the descriptor created by this function. For more information, see <a href="mailto:cudnnFusedOpsVariantParamPack\_t">cudnnFusedOpsVariantParamPack\_t</a>.

#### ops

*Input*. The specific sequence of fused operations computations for which this descriptor should be created.

## Returns

## CUDNN STATUS SUCCESS

The descriptor is successfully created.

## CUDNN STATUS BAD PARAM

If any input is invalid.

# 6.2.6. cudnnDestroyFusedOpsConstParamPack()

```
cudnnStatus_t cudnnDestroyFusedOpsConstParamPack(
  cudnnFusedOpsConstParamPack t constPack);
```

This function destroys a previously-created cudnnFusedOpsConstParamPack t structure.

## **Parameters**

## constPack

Input. The <a href="mailto:cudnnFusedOpsConstParamPack">cudnnFusedOpsConstParamPack</a> t structure that should be destroyed.

## Returns

## CUDNN STATUS SUCCESS

If the descriptor is destroyed successfully.

#### CUDNN STATUS INTERNAL ERROR

If the ops enum value is not supported or invalid.

# 6.2.7. cudnnDestroyFusedOpsPlan()

```
cudnnStatus_t cudnnDestroyFusedOpsPlan(
  cudnnFusedOpsPlan_t plan);
```

This function destroys the plan descriptor provided.

## **Parameters**

### plan

*Input.* The descriptor that should be destroyed by this function.

## Returns

## CUDNN STATUS SUCCESS

If either the plan descriptor is NULL or the descriptor is successfully destroyed.

# 6.2.8. cudnnDestroyFusedOpsVariantParamPack()

```
cudnnStatus_t cudnnDestroyFusedOpsVariantParamPack(
  cudnnFusedOpsVariantParamPack t varPack);
```

This function destroys a previously-created descriptor for cudnnFusedOps constant parameters.

## **Parameters**

#### varPack

*Input*. The descriptor that should be destroyed.

#### Returns

## CUDNN STATUS SUCCESS

The descriptor is successfully destroyed.

# 6.2.9. cudnnFindConvolutionBackwardFilterAlgorithm (

cudnnConvolutionBwdFilterAlgoPerf t \*perfResults)

This function attempts all algorithms available for <u>cudnnConvolutionBackwardFilter()</u>. It will attempt both the provided <u>convDesc</u> mathType and <u>CUDNN\_DEFAULT\_MATH</u> (assuming the two differ).



**Note:** Algorithms without the CUDNN\_TENSOR\_OP\_MATH availability will only be tried with CUDNN\_DEFAULT\_MATH, and returned as such.

Memory is allocated via cudaMalloc(). The performance metrics are returned in the user-allocated array of <a href="mailto:cudnnConvolutionBwdFilterAlgoPerf\_t">cudnnConvolutionBwdFilterAlgoPerf\_t</a>. These metrics are written in a sorted fashion where the first element has the lowest compute time. The total number of resulting algorithms can be queried through the API <a href="mailto:cudnnGetConvolutionBackwardFilterAlgorithmMaxCount()">cudnnGetConvolutionBackwardFilterAlgorithmMaxCount()</a>.



## Note:

- ▶ This function is host blocking.
- It is recommended to run this function prior to allocating layer data; doing otherwise may needlessly inhibit some algorithm options due to resource usage.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### xDesc

*Input.* Handle to the previously initialized input tensor descriptor.

## dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

## convDesc

Input. Previously initialized convolution descriptor.

#### dwDesc

*Input.* Handle to a previously initialized filter descriptor.

## requestedAlgoCount

Input. The maximum number of elements to be stored in perfResults.

#### returnedAlgoCount

Output. The number of output elements stored in perfResults.

## perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

## Returns

## CUDNN\_STATUS\_SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is not allocated properly.
- xDesc, dyDesc, or dwDesc are not allocated properly.
- xDesc, dyDesc, or dwDesc has fewer than 1 dimension.
- Either returnedCount or perfResults is nil.
- requestedCount is less than 1.

## CUDNN STATUS ALLOC FAILED

This function was unable to allocate memory to store sample input, filters and output.

## CUDNN STATUS INTERNAL ERROR

At least one of the following conditions are met:

- ▶ The function was unable to allocate necessary timing objects.
- ▶ The function was unable to deallocate necessary timing objects.
- ▶ The function was unable to deallocate sample input, filters and output.

# 6.2.10. cudnnFindConvolutionBackwardFilterAlgorithmE

```
cudnnStatus t cudnnFindConvolutionBackwardFilterAlgorithmEx(
                                           handle,
   cudnnHandle t
   const cudnnTensorDescriptor t
                                           xDesc.
                                          *x,
   const void
   const cudnnTensorDescriptor t
                                          dyDesc,
   const void
                                          *dy,
   const cudnnConvolutionDescriptor t
                                         convDesc,
   const cudnnFilterDescriptor t
                                          dwDesc,
                                          *dw,
   void
   const int
                                          requestedAlgoCount,
                                          *returnedAlgoCount,
   cudnnConvolutionBwdFilterAlgoPerf t
                                          *perfResults,
   void
                                          *workSpace,
   size t
                                          workSpaceSizeInBytes)
```

This function attempts all algorithms available for <u>cudnnConvolutionBackwardFilter()</u>. It will attempt both the provided <u>convDesc</u> mathType and <u>CUDNN\_DEFAULT\_MATH</u> (assuming the two differ).



Note: Algorithms without the CUDNN\_TENSOR\_OP\_MATH availability will only be tried with CUDNN\_DEFAULT\_MATH, and returned as such.

Memory is allocated via cudaMalloc(). The performance metrics are returned in the user-allocated array of cudnnConvolutionBwdFilterAlgoPerf t. These metrics

are written in a sorted fashion where the first element has the lowest compute time. The total number of resulting algorithms can be queried through the API cudnnGetConvolutionBackwardFilterAlgorithmMaxCount().



Note: This function is host blocking.

## **Parameters**

## handle

*Input.* Handle to a previously created cuDNN context.

#### xDesc

*Input*. Handle to the previously initialized input tensor descriptor.

x

Input. Data pointer to GPU memory associated with the filter descriptor xDesc.

#### dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

#### dy

Input. Data pointer to GPU memory associated with the tensor descriptor dyDesc.

#### convDesc

*Input*. Previously initialized convolution descriptor.

#### dwDesc

*Input.* Handle to a previously initialized filter descriptor.

## dw

Input/Output. Data pointer to GPU memory associated with the filter descriptor dwDesc. The content of this tensor will be overwritten with arbitrary values.

## requestedAlgoCount

*Input*. The maximum number of elements to be stored in perfResults.

## returnedAlgoCount

*Output*. The number of output elements stored in perfResults.

#### perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

#### workSpace

*Input*. Data pointer to GPU memory is a necessary workspace for some algorithms. The size of this workspace will determine the availability of algorithms. A nil pointer is considered a workSpace of 0 bytes.

#### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workSpace.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- handle is not allocated properly.
- xDesc, dyDesc, or dwDesc are not allocated properly.
- xDesc, dyDesc, or dwDesc has fewer than 1 dimension.
- x, dy, or dw is nil.
- ▶ Either returnedCount or perfResults is nil.
- requestedCount is less than 1.

## CUDNN STATUS INTERNAL ERROR

At least one of the following conditions are met:

- ► The function was unable to allocate necessary timing objects.
- ▶ The function was unable to deallocate necessary timing objects.
- ▶ The function was unable to deallocate sample input, filters and output.

# 6.2.11. cudnnFusedOpsExecute()

```
cudnnStatus_t cudnnFusedOpsExecute(
  cudnnHandle_t handle,
  const cudnnFusedOpsPlan_t plan,
  cudnnFusedOpsVariantParamPack_t varPack);
```

This function executes the sequence of cudnnFusedOps operations.

## **Parameters**

#### handle

*Input*. Pointer to the cuDNN library context.

#### plan

Input. Pointer to a previously-created and initialized plan descriptor.

#### varPack

*Input.* Pointer to the descriptor to the variant parameters pack.

## Returns

## CUDNN STATUS BAD PARAM

If the type of <a href="mailto:cudnnFusedOps">cudnnFusedOps</a> t in the plan descriptor is unsupported.

# 6.2.12. cudnnGetConvolutionBackwardFilterAlgorithmMa

```
cudnnStatus_t cudnnGetConvolutionBackwardFilterAlgorithmMaxCount(
    cudnnHandle_t handle,
    int *count)
```

This function returns the maximum number of algorithms which can be returned from <a href="mailto:cudnnFindConvolutionBackwardFilterAlgorithm">cudnnFindConvolutionBackwardFilterAlgorithm</a>] and <a href="mailto:cudnnGetConvolutionForwardAlgorithm">cudnnGetConvolutionForwardAlgorithm</a> v7(). This is the sum of all algorithms plus the sum of all algorithms with Tensor Core operations supported for the current device.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

#### count

Output. The resulting maximum count of algorithms.

## Returns

## CUDNN\_STATUS\_SUCCESS

The function was successful.

## CUDNN STATUS BAD PARAM

The provided handle is not allocated properly.

# 6.2.13. cudnnGetConvolutionBackwardFilterAlgorithm\_v

This function serves as a heuristic for obtaining the best suited algorithm for <a href="cudnnConvolutionBackwardFilter">cudnnConvolutionBackwardFilter</a>[) for the given layer specifications. This function will return all algorithms (including CUDNN\_TENSOR\_OP\_MATH and CUDNN\_DEFAULT\_MATH versions of algorithms where CUDNN\_TENSOR\_OP\_MATH may be available) sorted by expected (based on internal heuristic) relative performance with fastest being index 0 of perfResults. For an exhaustive search for the fastest algorithm, use <a href="cudnnFindConvolutionBackwardFilterAlgorithm">cudnnFindConvolutionBackwardFilterAlgorithm</a>[). The total number of resulting algorithms can be queried through the <a href="returnedAlgoCount">returnedAlgoCount</a> variable.

## **Parameters**

## handle

Input. Handle to a previously created cuDNN context.

## xDesc

Input. Handle to the previously initialized input tensor descriptor.

## dyDesc

Input. Handle to the previously initialized input differential tensor descriptor.

#### convDesc

*Input.* Previously initialized convolution descriptor.

#### dwDesc

*Input*. Handle to a previously initialized filter descriptor.

## requestedAlgoCount

Input. The maximum number of elements to be stored in perfResults.

## returnedAlgoCount

Output. The number of output elements stored in perfResults.

## perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the parameters handle, xDesc, dyDesc, convDesc, dwDesc, perfResults, returnedAlgoCount is NULL.
- The numbers of feature maps of the input tensor and output tensor differ.
- ► The dataType of the two tensor descriptors or the filter are different.
- requestedAlgoCount is less than or equal to 0.

# 6.2.14. cudnnGetConvolutionBackwardFilterWorkspaceSi

This function returns the amount of GPU memory workspace the user needs to allocate to be able to call <a href="mailto:cudnnConvolutionBackwardFilter">cudnnConvolutionBackwardFilter</a>() with the specified algorithm. The workspace allocated will then be passed to the routine <a href="mailto:cudnnConvolutionBackwardFilter">cudnnConvolutionBackwardFilter</a>(). The specified algorithm can be the result of the call to <a href="mailto:cudnnGetConvolutionBackwardFilterAlgorithm">cudnnGetConvolutionBackwardFilterAlgorithm</a> v7() or can be chosen arbitrarily by the user. Note that not every algorithm is available for every configuration of the input tensor and/or every configuration of the convolution descriptor.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

#### **xDesc**

*Input*. Handle to the previously initialized input tensor descriptor.

## dyDesc

*Input*. Handle to the previously initialized input differential tensor descriptor.

#### convDesc

*Input.* Previously initialized convolution descriptor.

#### dwDesc

Input. Handle to a previously initialized filter descriptor.

#### algo

Input. Enumerant that specifies the chosen convolution algorithm.

## sizeInBytes

*Output*. Amount of GPU memory needed as workspace to be able to execute a forward convolution with the specified algo.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ The numbers of feature maps of the input tensor and output tensor differ.
- ► The dataType of the two tensor descriptors or the filter are different.

## CUDNN STATUS NOT SUPPORTED

The combination of the tensor descriptors, filter descriptor and convolution descriptor is not supported for the specified algorithm.

# 6.2.15. cudnnGetFusedOpsConstParamPackAttribute()

```
cudnnStatus_t cudnnGetFusedOpsConstParamPackAttribute(
  const cudnnFusedOpsConstParamPack_t constPack,
  cudnnFusedOpsConstParamLabel_t paramLabel,
  void *param,
  int *isNULL);
```

This function retrieves the values of the descriptor pointed to by the param pointer input. The type of the descriptor is indicated by the enum value of paramLabel input.

## **Parameters**

#### constPack

Input. The opaque <a href="mailto:cudnnFusedOpsConstParamPack\_t">cudnnFusedOpsConstParamPack\_t</a> structure that contains the various problem size information, such as the shape, layout and the type of tensors, and the descriptors for convolution and activation, for the selected sequence of <a href="mailto:cudnnFusedOps\_t">cudnnFusedOps\_t</a> computations.

## paramLabel

Input. Several types of descriptors can be retrieved by this getter function. The param input points to the descriptor itself, and this input indicates the type of the descriptor pointed to by the param input. The <a href="mailto:cudnnFusedOpsConstParamLabel\_t">cudnnFusedOpsConstParamLabel\_t</a> enumerant type enables the selection of the type of the descriptor. Refer to the <a href="mailto:param">param</a> description below.

#### param

Input. Data pointer to the host memory associated with the descriptor that should be retrieved. The type of this descriptor depends on the value of paramLabel. For the given paramLabel, if the associated value inside the constPack is set to NULL or by default NULL, then cuDNN will copy the value or the opaque structure in the constPack to the host memory buffer pointed to by param. For more information, see the table in cudnnFusedOpsConstParamLabel\_t.

## isNULL

Input/Output. Users must pass a pointer to an integer in the host memory in this field. If the value in the constPack associated with the given paramLabel is by default NULL or previously set by the user to NULL, then cuDNN will write a non-zero value to the location pointed by isnull.

## Returns

## CUDNN STATUS SUCCESS

The descriptor values are retrieved successfully.

## CUDNN STATUS BAD PARAM

If either constPack, param or isNULL is NULL; or if paramLabel is invalid.

# 6.2.16. cudnnGetFusedOpsVariantParamPackAttribute()

```
cudnnStatus_t cudnnGetFusedOpsVariantParamPackAttribute(
  const cudnnFusedOpsVariantParamPack_t varPack,
  cudnnFusedOpsVariantParamLabel t paramLabel,
```

```
void *ptr);
```

This function retrieves the settings of the variable parameter pack descriptor.

## **Parameters**

#### varPack

Input. Pointer to the cudnnFusedOps variant parameter pack (varPack) descriptor.

## paramLabel

Input. Type of the buffer pointer parameter (in the varPack descriptor). For more information, see <a href="mailto:cudnnFusedOpsConstParamLabel\_t">cudnnFusedOpsConstParamLabel\_t</a>. The retrieved descriptor values vary according to this type.

## ptr

Output. Pointer to the host or device memory where the retrieved value is written by this function. The data type of the pointer, and the host/device memory location, depend on the paramLabel input selection. For more information, see <a href="mailto:cudnnFusedOpsVariantParamLabel">cudnnFusedOpsVariantParamLabel</a> t.

## Returns

## CUDNN STATUS SUCCESS

The descriptor values are retrieved successfully.

## CUDNN STATUS BAD PARAM

If either varPack or ptr is NULL, or if paramLabel is set to invalid value.

# 6.2.17. cudnnMakeFusedOpsPlan()

```
cudnnStatus_t cudnnMakeFusedOpsPlan(
  cudnnHandle_t handle,
  cudnnFusedOpsPlan_t plan,
  const cudnnFusedOpsConstParamPack_t constPack,
  size t *workspaceSizeInBytes);
```

This function determines the optimum kernel to execute, and the workspace size the user should allocate, prior to the actual execution of the fused operations by <a href="mailto:cudnnFusedOpsExecute()">cudnnFusedOpsExecute()</a>.

## **Parameters**

#### handle

*Input*. Pointer to the cuDNN library context.

#### plan

Input. Pointer to a previously-created and initialized plan descriptor.

#### constPack

*Input*. Pointer to the descriptor to the const parameters pack.

## workspaceSizeInBytes

Output. The amount of workspace size the user should allocate for the execution of this plan.

## Returns

## CUDNN\_STATUS\_BAD\_PARAM

If any of the inputs is NULL, or if the type of <u>cudnnFusedOps\_t</u> in the <u>constPack</u> descriptor is unsupported.

## CUDNN STATUS SUCCESS

The function executed successfully.

# 6.2.18. cudnnSetFusedOpsConstParamPackAttribute()

```
cudnnStatus_t cudnnSetFusedOpsConstParamPackAttribute(
  cudnnFusedOpsConstParamPack_t constPack,
  cudnnFusedOpsConstParamLabel_t paramLabel,
  const void *param);
```

This function sets the descriptor pointed to by the param pointer input. The type of the descriptor to be set is indicated by the enum value of the paramLabel input.

## **Parameters**

#### constPack

*Input*. The opaque <u>cudnnFusedOpsConstParamPack\_t</u> structure that contains the various problem size information, such as the shape, layout and the type of tensors, the descriptors for convolution and activation, and settings for operations such as convolution and activation.

## paramLabel

Input. Several types of descriptors can be set by this setter function. The param input points to the descriptor itself, and this input indicates the type of the descriptor pointed to by the param input. The <a href="mailto:cudnnFusedOpsConstParamLabel\_t">cudnnFusedOpsConstParamLabel\_t</a> enumerant type enables the selection of the type of the descriptor.

#### param

Input. Data pointer to the host memory, associated with the specific descriptor. The type of the descriptor depends on the value of paramLabel. For more information, see the table in cudnnFusedOpsConstParamLabel t.

If this pointer is set to NULL, then the cuDNN library will record as such. If not, then the values pointed to by this pointer (meaning, the value or the opaque structure underneath) will be copied into the constPack during cudnnSetFusedOpsConstParamPackAttribute() operation.

## Returns

## CUDNN\_STATUS\_SUCCESS

The descriptor is set successfully.

## CUDNN STATUS BAD PARAM

If constPack is NULL, or if paramLabel or the ops setting for constPack is invalid.

# 6.2.19. cudnnSetFusedOpsVariantParamPackAttribute()

cudnnStatus\_t cudnnSetFusedOpsVariantParamPackAttribute(
 cudnnFusedOpsVariantParamPack\_t varPack,
 cudnnFusedOpsVariantParamLabel\_t paramLabel,
 void \*ptr);

This function sets the variable parameter pack descriptor.

## **Parameters**

#### varPack

Input. Pointer to the cudnnFusedOps variant parameter pack (varPack) descriptor.

## paramLabel

*Input.* Type to which the buffer pointer parameter (in the varPack descriptor) is set by this function. For more information, see <u>cudnnFusedOpsConstParamLabel</u> t.

## ptr

Input. Pointer, to the host or device memory, to the value to which the descriptor parameter is set. The data type of the pointer, and the host/device memory location, depend on the paramLabel input selection. For more information, see <a href="mailto:cudnnFusedOpsVariantParamLabel">cudnnFusedOpsVariantParamLabel</a> t.

## Returns

## CUDNN\_STATUS\_BAD\_PARAM

If varPack is NULL or if paramLabel is set to an unsupported value.

## CUDNN STATUS SUCCESS

The descriptor was set successfully.

# Chapter 7. **cudnn\_adv\_infer.so**Library

# 7.1. Data Type References

# 7.1.1. Pointer To Opaque Struct Types

# 7.1.1.1. cudnnAttnDescriptor\_t

cudnnAttnDescriptor\_t is a pointer to an opaque structure holding parameters of the multihead attention layer such as:

- weight and bias tensor shapes (vector lengths before and after linear projections)
- parameters that can be set in advance and do not change when invoking functions to evaluate forward responses and gradients (number of attention heads, softmax smoothing/ sharpening coefficient)
- other settings that are necessary to compute temporary buffer sizes.

Use the <u>cudnnCreateAttnDescriptor()</u> function to create an instance of the attention descriptor object and <u>cudnnDestroyAttnDescriptor()</u> to delete the previously created descriptor. Use the <u>cudnnSetAttnDescriptor()</u> function to configure the descriptor.

# 7.1.1.2. cudnnPersistentRNNPlan\_t

This function is deprecated starting in cuDNN 8.0.0.

cudnnPersistentRNNPlan\_t is a pointer to an opaque structure holding a plan to execute a dynamic persistent RNN. <u>cudnnCreatePersistentRNNPlan()</u> is used to create and initialize one instance.

# 7.1.1.3. cudnnRNNDataDescriptor\_t

cudnnRNNDataDescriptor\_t is a pointer to an opaque structure holding the description of an RNN data set. The function <u>cudnnCreateRNNDataDescriptor()</u> is used to create one instance, and <u>cudnnSetRNNDataDescriptor()</u> must be used to initialize this instance.

# 7.1.1.4. cudnnRNNDescriptor\_t

 ${\tt cudnnRNNDescriptor\_t}$  is a pointer to an opaque structure holding the description of an RNN operation.  ${\tt cudnnCreateRNNDescriptor()}$  is used to create one instance.

# 7.1.1.5. cudnnSeqDataDescriptor t

cudnnSeqDataDescriptor\_t is a pointer to an opaque structure holding parameters of the sequence data container or buffer. The sequence data container is used to store fixed size vectors defined by the VECT dimension. Vectors are arranged in additional three dimensions: TIME, BATCH and BEAM.

The TIME dimension is used to bundle vectors into sequences of vectors. The actual sequences can be shorter than the TIME dimension, therefore, additional information is needed about each sequence length and how unused (padding) vectors should be saved.

It is assumed that the sequence data container is fully packed. The TIME, BATCH and BEAM dimensions can be in any order when vectors are traversed in the ascending order of addresses. Six data layouts (permutation of TIME, BATCH and BEAM) are possible.

The cudnnSeqDataDescriptor t object holds the following parameters:

- data type used by vectors
- ▶ TIME, BATCH, BEAM and VECT dimensions
- data layout
- ▶ the length of each sequence along the TIME dimension
- an optional value to be copied to output padding vectors

Use the  $\underline{\operatorname{cudnnCreateSeqDataDescriptor()}}$  function to create one instance of the sequence data descriptor object and  $\underline{\operatorname{cudnnDestroySeqDataDescriptor()}}$  to delete a previously created descriptor. Use the  $\underline{\operatorname{cudnnSetSeqDataDescriptor()}}$  function to configure the descriptor.

This descriptor is used by multi-head attention API functions.

# 7.1.2. Enumeration Types

# 7.1.2.1. cudnnDirectionMode\_t

 $\begin{array}{l} {\tt cudnnDirectionMode\_t} \ is \ an \ enumerated \ type \ used \ to \ specify \ the \ recurrence \ pattern \ in \ the \\ \underline{\tt cudnnRNNForwardInference()}, \ \underline{\tt cudnnRNNForwardTraining()}, \ \underline{\tt cudnnRNNBackwardData()} \ and \\ \underline{\tt cudnnRNNBackwardWeights()} \ routines. \end{array}$ 

#### Values

## CUDNN UNIDIRECTIONAL

The network iterates recurrently from the first input to the last.

## CUDNN BIDIRECTIONAL

Each layer of the network iterates recurrently from the first input to the last and separately from the last input to the first. The outputs of the two are concatenated at each iteration giving the output of the layer.

# 7.1.2.2. cudnnForwardMode\_t

cudnnForwardMode\_t is an enumerated type to specify inference or training mode in RNN API. This parameter allows the cuDNN library to tune more precisely the size of the workspace buffer that could be different in inference and training regimens.

## **Values**

## CUDNN FWD MODE INFERENCE

Selects the inference mode.

## CUDNN FWD MODE TRAINING

Selects the training mode.

# 7.1.2.3. cudnnMultiHeadAttnWeightKind t

cudnnMultiHeadAttnWeightKind\_t is an enumerated type that specifies a group of weights or biases in the <u>cudnnGetMultiHeadAttnWeights()</u> function.

## Values

## CUDNN MH ATTN Q WEIGHTS

Selects the input projection weights for queries.

## CUDNN\_MH\_ATTN\_K\_WEIGHTS

Selects the input projection weights for keys.

## CUDNN MH ATTN V WEIGHTS

Selects the input projection weights for values.

## CUDNN MH ATTN O WEIGHTS

Selects the output projection weights.

## CUDNN MH ATTN Q BIASES

Selects the input projection biases for queries.

## CUDNN MH ATTN K BIASES

Selects the input projection biases for keys.

## CUDNN MH ATTN V BIASES

Selects the input projection biases for values.

## CUDNN MH ATTN O BIASES

Selects the output projection biases.

# 7.1.2.4. cudnnRNNBiasMode t

cudnnRNNBiasMode\_t is an enumerated type used to specify the number of bias vectors for RNN functions. See the description of the <u>cudnnRNNMode\_t</u> enumerated type for the equations for each cell type based on the bias mode.

## **Values**

## CUDNN\_RNN\_NO\_BIAS

Applies RNN cell formulas that do not use biases.

## CUDNN\_RNN\_SINGLE\_INP\_BIAS

Applies RNN cell formulas that use one input bias vector in the input GEMM.

## CUDNN RNN DOUBLE BIAS

Applies RNN cell formulas that use two bias vectors.

## CUDNN RNN SINGLE REC BIAS

Applies RNN cell formulas that use one recurrent bias vector in the recurrent GEMM.

# 7.1.2.5. cudnnRNNClipMode\_t

cudnnRNNClipMode\_t is an enumerated type used to select the LSTM cell clipping mode. It is used with <u>cudnnRNNSetClip()</u>, <u>cudnnRNNGetClip()</u> functions, and internally within LSTM cells.

## **Values**

## CUDNN\_RNN\_CLIP\_NONE

Disables LSTM cell clipping.

## CUDNN RNN CLIP MINMAX

Enables LSTM cell clipping.

# 7.1.2.6. cudnnRNNDataLayout t

cudnnRNNDataLayout\_t is an enumerated type used to select the RNN data layout. It is used in the API calls <u>cudnnGetRNNDataDescriptor()</u> and <u>cudnnSetRNNDataDescriptor()</u>.

## Values

## CUDNN RNN DATA LAYOUT SEQ MAJOR UNPACKED

Data layout is padded, with outer stride from one time-step to the next.

## CUDNN RNN DATA LAYOUT SEQ MAJOR PACKED

The sequence length is sorted and packed as in the basic RNN API.

## CUDNN\_RNN\_DATA\_LAYOUT\_BATCH\_MAJOR\_UNPACKED

Data layout is padded, with outer stride from one batch to the next.

# 7.1.2.7. cudnnRNNInputMode\_t

cudnnRNNInputMode\_t is an enumerated type used to specify the behavior of the first layer in the <u>cudnnRNNForwardInference()</u>, <u>cudnnRNNForwardTraining()</u>, <u>cudnnRNNBackwardData()</u> and <u>cudnnRNNBackwardWeights()</u> routines.

## **Values**

## CUDNN\_LINEAR\_INPUT

A biased matrix multiplication is performed at the input of the first recurrent layer.

## CUDNN\_SKIP\_INPUT

No operation is performed at the input of the first recurrent layer. If CUDNN\_SKIP\_INPUT is used the leading dimension of the input tensor must be equal to the hidden state size of the network.

# 7.1.2.8. cudnnRNNMode t

cudnnRNNMode\_t is an enumerated type used to specify the type of network used in the <u>cudnnRNNForwardInference</u>, <u>cudnnRNNForwardTraining</u>, <u>cudnnRNNBackwardData</u> and <u>cudnnRNNBackwardWeights</u> routines.

## **Values**

## CUDNN RNN RELU

A single-gate recurrent neural network with a ReLU activation function.

In the forward pass, the output  $h_t$  for a given iteration can be computed from the recurrent input  $h_{t-1}$  and the previous layer input  $x_t$ , given the matrices w, R and the bias vectors, where Relu(x) = max(x, 0).

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_DOUBLE\_BIAS (default mode), then the following equation with biases  $b_W$  and  $b_R$  applies:

```
h_t = ReLU(W_ix_t + R_ih_{t-1} + b_{Wi} + b_{Ri})
```

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_SINGLE\_INP\_BIAS or CUDNN\_RNN\_SINGLE\_REC\_BIAS, then the following equation with bias b applies:

```
h_t = ReLU(W_ix_t + R_ih_{t-1} + b_i)
```

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_NO\_BIAS, then the following equation applies:

```
h_t = ReLU(W_ix_t + R_ih_{t-1})
```

## CUDNN RNN TANH

A single-gate recurrent neural network with a tanh activation function.

In the forward pass, the output  $h_t$  for a given iteration can be computed from the recurrent input  $h_{t-1}$  and the previous layer input  $x_t$ , given the matrices w, R and the bias vectors, and where tanh is the hyperbolic tangent function.

If  $cudnnRNNBiasMode\_t$  biasMode in rnnDesc is  $CUDNN\_RNN\_DOUBLE\_BIAS$  (default mode), then the following equation with biasesb<sub>W</sub> and b<sub>R</sub> applies:

```
h_t = tanh(W_ix_t + R_ih_{t-1} + b_{Wi} + b_{Ri})
```

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_SINGLE\_INP\_BIAS or CUDNN\_RNN\_SINGLE\_REC\_BIAS, then the following equation with bias b applies:

```
h_t = \tanh(W_i x_t + R_i h_{t-1} + b_i)
```

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_NO\_BIAS, then the following equation applies:

```
h_t = tanh(W_ix_t + R_ih_{t-1})
```

## CUDNN LSTM

A four-gate Long Short-Term Memory (LSTM) network with no peephole connections.

In the forward pass, the output  $h_t$  and cell output  $c_t$  for a given iteration can be computed from the recurrent input  $h_{t-1}$ , the cell input  $c_{t-1}$  and the previous layer input  $x_t$ , given the matrices w, R and the bias vectors.

In addition, the following applies:

- $\triangleright$   $\sigma$  is the sigmoid operator such that:  $\sigma(x) = 1 / (1 + e^{-x})$ ,
- represents a point-wise multiplication,
- tanh is the hyperbolic tangent function, and
- $\downarrow$  i<sub>t</sub>, f<sub>t</sub>, o<sub>t</sub>, c'<sub>t</sub> represent the input, forget, output and new gates respectively.

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_DOUBLE\_BIAS (default mode), then the following equations with biases  $b_W$  and  $b_R$  apply:

```
\begin{split} & i_t = \sigma(W_i x_t + R_i h_{t-1} + b_{Wi} + b_{Ri}) \\ & f_t = \sigma(W_f x_t + R_f h_{t-1} + b_{Wf} + b_{Rf}) \\ & o_t = \sigma(W_o x_t + R_o h_{t-1} + b_{Wo} + b_{Ro}) \\ & c'_t = tanh(W_c x_t + R_c h_{t-1} + b_{Wc} + b_{Rc}) \\ & c_t = f_t \circ c_{t-1} + i_t \circ c'_t \\ & h_t = o_t \circ tanh(c_t) \end{split}
```

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN\_RNN\_SINGLE\_INP\_BIAS or CUDNN RNN SINGLE REC BIAS, then the following equations with bias b apply:

```
\begin{split} &i_{t} = \sigma(W_{i}x_{t} + R_{i}h_{t-1} + b_{i}) \\ &f_{t} = \sigma(W_{f}x_{t} + R_{f}h_{t-1} + b_{f}) \\ &o_{t} = \sigma(W_{o}x_{t} + R_{o}h_{t-1} + b_{o}) \\ &c'_{t} = tanh(W_{c}x_{t} + R_{c}h_{t-1} + b_{c}) \\ &c_{t} = f_{t} \circ c_{t-1} + i_{t} \circ c'_{t} \\ &h_{t} = o_{t} \circ tanh(c_{t}) \end{split}
```

If cudnnRNNBiasMode t biasMode in rnnDesc is CUDNN RNN NO BIAS, then the following equations apply:

```
i_t = \sigma(W_i x_t + R_i h_{t-1})
f_t = \sigma(W_f x_t + R_f h_{t-1})
o_t = \sigma(W_o x_t + R_o h_{t-1})
c'_t = tanh(W_cx_t + R_ch_{t-1})
c_t = f_t \cdot c_{t-1} + i_t \cdot c'_t
h_t = o_t \circ tanh(c_t)
```

## CUDNN GRU

A three-gate network consisting of Gated Recurrent Units.

In the forward pass, the output  $h_t$  for a given iteration can be computed from the recurrent input  $h_{t-1}$  and the previous layer input  $x_t$  given matrices w, R and the bias vectors.

In addition, the following applies:

- $\triangleright$   $\sigma$  is the sigmoid operator such that:  $\sigma(x) = 1 / (1 + e^{-x})$ ,
- represents a point-wise multiplication,
- tanh is the hyperbolic tangent function, and
- it, rt, h't represent the input, reset, new gates respectively.

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN RNN DOUBLE BIAS (default mode), then the following equations with biases  $b_W$  and  $b_R$  apply:

```
i_t = \sigma(W_i x_t + R_i h_{t-1} + b_{Wi} + b_{Ru})
r_t = \sigma(W_r x_t + R_r h_{t-1} + b_{Wr} + b_{Rr})
h'_t = tanh(W_hx_t + r_t \circ (R_hh_{t-1} + b_{Rh}) + b_{Wh})
h_t = (1 - i_t) \circ h'_t + i_t \circ h_{t-1}
```

If cudnnRNNBiasMode t biasMode in rnnDesc is CUDNN RNN SINGLE INP BIAS, then the following equations with bias b apply:

```
i_t = \sigma(W_i x_t + R_i h_{t-1} + b_i)
\begin{array}{l} \text{Lt} & -\text{O}(W_1 A_t + R_1 H_{t-1} + B_1) \\ \text{r}_t & = \sigma(W_r X_t + R_r h_{t-1} + B_r) \\ \text{h'}_t & = \text{tanh}(W_h X_t + r_t \circ (R_h h_{t-1}) + B_{Wh}) \\ \text{h}_t & = (1 - i_t) \circ \text{h'}_t + i_t \circ \text{h}_{t-1} \end{array}
```

If cudnnRNNBiasMode\_t biasMode in rnnDesc is CUDNN RNN SINGLE REC BIAS, then the following equations with bias b apply:

```
i_t = \sigma(W_i x_t + R_i h_{t-1} + b_i)
 \begin{aligned} r_t &= \sigma(W_r x_t + R_r h_{t-1} + b_r) \\ h'_t &= tanh(W_h x_t + r_t \circ (R_h h_{t-1} + b_{Rh})) \\ h_t &= (1 - i_t) \circ h'_t + i_t \circ h_{t-1} \end{aligned}
```

If cudnnRNNBiasMode t biasMode in rnnDesc is CUDNN RNN NO BIAS, then the following equations apply:

```
i_t = \sigma(W_i x_t + R_i h_{t-1})
r_t = \sigma(W_r x_t + R_r h_{t-1})
h'_t = tanh(W_hx_t + r_t \circ (R_hh_{t-1}))
h_t = (1 - i_t) \circ h'_t + i_t \circ h_{t-1}
```

# cudnnRNNPaddingMode t

cudnnRNNPaddingMode t is an enumerated type used to enable or disable the padded input/ output.

## **Values**

## CUDNN\_RNN\_PADDED\_IO\_DISABLED

Disables the padded input/output.

## CUDNN\_RNN\_PADDED\_IO\_ENABLED

Enables the padded input/output.

# 7.1.2.10. cudnnSeqDataAxis t

<code>cudnnSeqDataAxis\_t</code> is an enumerated type that indexes active dimensions in the <code>dimA[]</code> argument that is passed to the <code>cudnnSetSeqDataDescriptor()</code> function to configure the <code>sequence</code> data <code>descriptor</code> of type <code>cudnnSegDataDescriptor t</code>.

cudnnSeqDataAxis\_t constants are also used in the axis[] argument of the cudnnSetSeqDataDescriptor() call to define the layout of the sequence data buffer in memory.

See <u>cudnnSetSeqDataDescriptor()</u> for a detailed description on how to use the cudnnSeqDataAxis t enumerated type.

The CUDNN\_SEQDATA\_DIM\_COUNT macro defines the number of constants in the cudnnSeqDataAxis t enumerated type. This value is currently set to 4.

## **Values**

## CUDNN SEQDATA TIME DIM

Identifies the TIME (sequence length) dimension or specifies the TIME in the data layout.

## CUDNN SEQDATA BATCH DIM

Identifies the BATCH dimension or specifies the BATCH in the data layout.

## CUDNN SEQDATA BEAM DIM

Identifies the BEAM dimension or specifies the BEAM in the data layout.

## CUDNN SEQDATA VECT DIM

Identifies the VECT (vector) dimension or specifies the VECT in the data layout.

# 7.2. API Functions

# 7.2.1. cudnnAdvInferVersionCheck()

cudnnStatus t cudnnAdvInferVersionCheck(void)

This function checks to see whether the version of the AdvInfer subset of the library is consistent with the other sub-libraries.

# Returns

# CUDNN STATUS SUCCESS

The version is consistent with other sub-libraries.

# CUDNN\_STATUS\_VERSION\_MISMATCH

The version of AdvInfer is not consistent with other sub-libraries. Users should check the installation and make sure all sub-component versions are consistent.

#### 7.2.2. cudnnBuildRNNDynamic()

```
cudnnStatus t cudnnBuildRNNDynamic(
cudnnHandle_t handle,
cudnnRNNDescriptor_t rnnDesc,
int32 t miniBatch);
```

This function compiles the RNN persistent code using CUDA runtime compilation library (NVRTC) when the CUDNN RNN ALGO PERSIST DYNAMIC algo is selected. The code is tailored to the current GPU and specific hyperparameters (miniBatch). This call is expected to be expensive in terms of runtime and should be invoked infrequently. Note that the CUDNN RNN ALGO PERSIST DYNAMIC algo does not support variable length sequences within the batch.

# **Parameters**

# handle

*Input.* Handle to a previously created cuDNN context.

#### rnnDesc

*Input*. A previously initialized RNN descriptor.

# miniBatch

*Input*. The exact number of sequences in a batch.

## Returns

## CUDNN STATUS SUCCESS

The code was built and linked successfully.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# CUDNN STATUS RUNTIME PREREQUISITE MISSING

The prerequisite runtime library could not be found.

# CUDNN STATUS NOT SUPPORTED

The current hyperparameters are invalid.

# 7.2.3. cudnnCreateAttnDescriptor()

cudnnStatus\_t cudnnCreateAttnDescriptor(cudnnAttnDescriptor\_t \*attnDesc);

This function creates one instance of an opaque attention descriptor object by allocating the host memory for it and initializing all descriptor fields. The function writes NULL to attnDesc when the attention descriptor object cannot be allocated.

Use the <u>cudnnSetAttnDescriptor()</u> function to configure the attention descriptor and <u>cudnnDestroyAttnDescriptor()</u> to destroy it and release the allocated memory.

# **Parameters**

#### attnDesc

*Output.* Pointer where the address to the newly created attention descriptor should be written.

# Returns

# CUDNN STATUS SUCCESS

The descriptor object was created successfully.

# CUDNN STATUS BAD PARAM

An invalid input argument was encountered (attnDesc=NULL).

# CUDNN STATUS ALLOC FAILED

The memory allocation failed.

# 7.2.4. cudnnCreatePersistentRNNPlan()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnBuildRNNDynamic()</u> instead of cudnnCreatePersistentRNNPlan().

This function creates a plan to execute persistent RNNs when using the CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC algo. This plan is tailored to the current GPU and problem hyperparameters. This function call is expected to be expensive in terms of runtime and should be used infrequently. For more information, see <a href="cudnnRNNDescriptor\_t">cudnnRNNDescriptor\_t</a>, <a href="cudnnDataType\_t">cudnnDataType\_t</a>, and <a href="cudnnPersistentRNNPlan\_t">cudnnPersistentRNNPlan\_t</a>.

## Returns

# CUDNN\_STATUS\_SUCCESS

The object was created successfully.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# CUDNN STATUS RUNTIME PREREQUISITE MISSING

A prerequisite runtime library cannot be found.

```
CUDNN STATUS NOT SUPPORTED
```

The current hyperparameters are invalid.

# cudnnCreateRNNDataDescriptor()

```
cudnnStatus t cudnnCreateRNNDataDescriptor(
    cudnnRNNDataDescriptor t *RNNDataDesc)
```

This function creates a RNN data descriptor object by allocating the memory needed to hold its opaque structure.

# Returns

## CUDNN STATUS SUCCESS

The RNN data descriptor object was created successfully.

# CUDNN STATUS BAD PARAM

RNNDataDesc is NULL.

## CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

# cudnnCreateRNNDescriptor()

```
cudnnStatus t cudnnCreateRNNDescriptor(
   cudnnRNNDescriptor t *rnnDesc)
```

This function creates a generic RNN descriptor object by allocating the memory needed to hold its opaque structure.

#### Returns

# CUDNN STATUS SUCCESS

The object was created successfully.

# CUDNN STATUS ALLOC FAILED

The resources could not be allocated.

#### 7 2 7 cudnnCreateSeqDataDescriptor()

cudnnStatus\_t cudnnCreateSeqDataDescriptor(cudnnSeqDataDescriptor\_t \*seqDataDesc);

This function creates one instance of an opaque sequence data descriptor object by allocating the host memory for it and initializing all descriptor fields. The function writes NULL to seqDataDesc when the sequence data descriptor object cannot be allocated.

Use the <u>cudnnSetSeqDataDescriptor()</u> function to configure the sequence data descriptor and <u>cudnnDestroySeqDataDescriptor()</u> to destroy it and release the allocated memory.

# **Parameters**

### seqDataDesc

*Output.* Pointer where the address to the newly created sequence data descriptor should be written.

# Returns

# CUDNN STATUS SUCCESS

The descriptor object was created successfully.

# CUDNN\_STATUS\_BAD\_PARAM

An invalid input argument was encountered (segDataDesc=NULL).

# CUDNN STATUS ALLOC FAILED

The memory allocation failed.

# 7.2.8. cudnnDestroyAttnDescriptor()

cudnnStatus t cudnnDestroyAttnDescriptor(cudnnAttnDescriptor t attnDesc);

This function destroys the attention descriptor object and releases its memory. The attnDesc argument can be NULL. Invoking cudnnDestroyAttnDescriptor() with a NULL argument is a no operation (NOP).

The cudnnDestroyAttnDescriptor() function is not able to detect if the attnDesc argument holds a valid address. Undefined behavior will occur in case of passing an invalid pointer, not returned by the <a href="mailto:cudnnCreateAttnDescriptor">cudnnCreateAttnDescriptor</a>() function, or in the double deletion scenario of a valid address.

# **Parameters**

#### attnDesc

*Input.* Pointer to the attention descriptor object to be destroyed.

## Returns

# CUDNN\_STATUS\_SUCCESS

The descriptor was destroyed successfully.

# 7.2.9. cudnnDestroyPersistentRNNPlan()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus_t cudnnDestroyPersistentRNNPlan(
    cudnnPersistentRNNPlan t plan)
```

This function destroys a previously created persistent RNN plan object.

## Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 7.2.10. cudnnDestroyRNNDataDescriptor()

```
cudnnStatus_t cudnnDestroyRNNDataDescriptor(
    cudnnRNNDataDescriptor t RNNDataDesc)
```

This function destroys a previously created RNN data descriptor object.

## Returns

# CUDNN STATUS SUCCESS

The RNN data descriptor object was destroyed successfully.

# 7.2.11. cudnnDestroyRNNDescriptor()

```
cudnnStatus_t cudnnDestroyRNNDescriptor(
    cudnnRNNDescriptor t rnnDesc)
```

This function destroys a previously created RNN descriptor object.

## Returns

# CUDNN STATUS SUCCESS

The object was destroyed successfully.

# 7.2.12. cudnnDestroySeqDataDescriptor()

cudnnStatus\_t cudnnDestroySeqDataDescriptor(cudnnSeqDataDescriptor\_t seqDataDesc);

This function destroys the sequence data descriptor object and releases its memory. The seqDataDesc argument can be NULL. Invoking cudnnDestroySeqDataDescriptor() with a NULL argument is a no operation (NOP).

The cudnnDestroySeqDataDescriptor() function is not able to detect if the seqDataDesc argument holds a valid address. Undefined behavior will occur in case of passing an invalid pointer, not returned by the <a href="mailto:cudnnCreateSeqDataDescriptor()">cudnnCreateSeqDataDescriptor()</a> function, or in the double deletion scenario of a valid address.

#### **Parameters**

#### seqDataDesc

*Input.* Pointer to the sequence data descriptor object to be destroyed.

# Returns

# CUDNN STATUS SUCCESS

The descriptor was destroyed successfully.

# 7.2.13. cudnnFindRNNForwardInferenceAlgorithmEx()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnFindRNNForwardInferenceAlgorithmEx(
   cudnnHandle t
                                   handle,
   const cudnnRNNDescriptor t
                                   rnnDesc,
   const int
                                   seqLength,
   const cudnnTensorDescriptor t *xDesc,
   const void
                                   *x,
   const cudnnTensorDescriptor t hxDesc,
                                   *hx,
   const void
   const cudnnTensorDescriptor t
                                   cxDesc,
                                   *CX,
   const void
   const cudnnFilterDescriptor t
                                   wDesc,
   const void
   const cudnnTensorDescriptor t
                                   *yDesc,
                                   *y,
   const cudnnTensorDescriptor t
                                   hyDesc,
                                   *hy,
   const cudnnTensorDescriptor t cyDesc,
                                   *cy,
   void
   const float
                                  findIntensity,
   const int
                                  requestedAlgoCount,
   int
                                  *returnedAlgoCount,
   cudnnAlgorithmPerformance t
                                  *perfResults,
                                  *workspace,
   void
                                   workSpaceSizeInBytes)
   size_t
```

This function attempts all available cuDNN algorithms for <u>cudnnRNNForwardInference()</u>, using user-allocated GPU memory. It outputs the parameters that influence the performance of the algorithm to a user-allocated array of <u>cudnnAlgorithmPerformance\_t</u>. These parameter metrics are written in sorted fashion where the first element has the lowest compute time.

### **Parameters**

### handle

*Input*. Handle to a previously created cuDNN context.

#### rnnDesc

Input. A previously initialized RNN descriptor.

# seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <u>cudnnGetRNNWorkspaceSize()</u> function for querying the workspace size required to execute the RNN.

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#### **x**Desc

Input. An array of fully packed tensor descriptors describing the input to each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

x

Input. Data pointer to GPU memory associated with the tensor descriptors in the array xDesc. The data are expected to be packed contiguously with the first element of iteration n +1 following directly from the last element of iteration n.

## hxDesc

*Input*. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

#### cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### СX

*Input.* Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

# yDesc

Input. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in xDesc.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc. The data are expected to be packed contiguously with the first element of iteration n+1 following directly from the last element of iteration n.

# hyDesc

Input. A fully packed tensor descriptor describing the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

# hy

Output. Data pointer to GPU memory associated with the tensor descriptor hydesc. If a NULL pointer is passed, the final hidden state of the network will not be saved.

## cyDesc

Input. A fully packed tensor descriptor describing the final cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.

▶ If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### су

Output. Data pointer to GPU memory associated with the tensor descriptor cyDesc. If a NULL pointer is passed, the final cell state of the network will not be saved.

## findIntensity

*Input*. This input was previously unused in versions prior to 7.2.0. It is used in cuDNN 7.2.0 and later versions to control the overall runtime of the RNN find algorithms, by selecting the percentage of a large Cartesian product space to be searched.

- ▶ Setting findIntensity within the range (0,1.) will set a percentage of the entire RNN search space to search. When findIntensity is set to 1.0, a full search is performed over all RNN parameters.
- When findIntensity is set to 0.0f, a quick, minimal search is performed. This setting has the best runtime. However, in this case the parameters returned by this function will not correspond to the best performance of the algorithm; a longer search might discover better parameters. This option will execute up to three instances of the configured RNN problem. Runtime will vary proportionally to RNN problem size, as it will in the other cases, hence no guarantee of an explicit time bound can be given.
- Setting findIntensity within the range [-1.,0] sets a percentage of a reduced Cartesian product space to be searched. This reduced search space has been heuristically selected to have good performance. The setting of -1.0 represents a full search over this reduced search space.
- ▶ Values outside the range [-1,1] are truncated to the range [-1,1], and then interpreted as per the above.
- Setting findIntensity to 1.0 in cuDNN 7.2 and later versions is equivalent to the behavior of this function in versions prior to cuDNN 7.2.0.
- This function times the single RNN executions over large parameter spaces one execution per parameter combination. The times returned by this function are latencies.

## requestedAlgoCount

*Input.* The maximum number of elements to be stored in perfResults.

#### returnedAlgoCount

*Output*. The number of output elements stored in perfResults.

# perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

#### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

# workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workspace.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors hxDesc, cxDesc, wDesc, hyDesc, cyDesc or one of the descriptors in xDesc, yDesc is invalid.
- ► The descriptors in one of xDesc, hxDesc, cxDesc, wDesc, yDesc, hyDesc, cyDesc have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

# 7.2.14. cudnnGetAttnDescriptor()

```
cudnnStatus_t cudnnGetAttnDescriptor(
    cudnnAttnDescriptor t attnDesc,
    unsigned *attnMode,
    int *nHeads,
    double *smScaler,
    cudnnDataType_t *dataType,
cudnnDataType_t *computePrec,
cudnnMathType_t *mathType,
    cudnnDropoutDescriptor t *attnDropoutDesc,
    cudnnDropoutDescriptor t *postDropoutDesc,
    int *qSize,
int *kSize,
    int *vSize,
    int *qProjSize,
    int *kProjSize,
    int *vProjSize,
    int *oProjSize,
int *qoMaxSeqLength,
    int *kvMaxSeqLength,
    int *maxBatchSize,
    int *maxBeamSize);
```

This function retrieves settings from the previously created attention descriptor. The user can assign NULL to any pointer except attnDesc when the retrieved value is not needed.

# **Parameters**

#### attnDesc

Input. Attention descriptor.

## attnMode

Output. Pointer to the storage for binary attention flags.

#### nHeads

Output. Pointer to the storage for the number of attention heads.

#### smScale

Output. Pointer to the storage for the softmax smoothing/sharpening coefficient.

# dataType

Output. Data type for attention weights, sequence data inputs, and outputs.

# computePrec

*Output.* Pointer to the storage for the compute precision.

# mathType

Output. NVIDIA Tensor Core settings.

# attnDropoutDesc

Output. Descriptor of the dropout operation applied to the softmax output.

# postDropoutDesc

Output. Descriptor of the dropout operation applied to the multi-head attention output.

# qSize, kSize, vSize

Output. Q, K, and V embedding vector lengths.

# qProjSize, kProjSize, vProjSize

Output. Q, K, and V embedding vector lengths after input projections.

# oProjSize

Output. Pointer to store the output vector length after projection.

# qoMaxSeqLength

Output. Largest sequence length expected in sequence data descriptors related to **Q, O, dQ, dO** inputs and outputs.

# ${\bf kvMaxSeqLength}$

 $\it Output.$  Largest sequence length expected in sequence data descriptors related to  $\it K, V, d\it K, dV$  inputs and outputs.

# maxBatchSize

*Output.* Largest batch size expected in the <u>cudnnSeqDataDescriptor\_t</u> container.

#### maxBeamSize

Output. Largest beam size expected in the cudnnSeqDataDescriptor t container.

# Returns

# CUDNN STATUS SUCCESS

Requested attention descriptor fields were retrieved successfully.

## CUDNN STATUS BAD PARAM

An invalid input argument was found.

# 7.2.15. cudnnGetMultiHeadAttnBuffers()

```
cudnnStatus_t cudnnGetMultiHeadAttnBuffers(
  cudnnHandle_t handle,
  const cudnnAttnDescriptor_t attnDesc,
  size_t *weightSizeInBytes,
  size_t *workSpaceSizeInBytes,
  size_t *reserveSpaceSizeInBytes);
```

This function computes weight, work, and reserve space buffer sizes used by the following functions:

- cudnnMultiHeadAttnForward()
- cudnnMultiHeadAttnBackwardData()
- cudnnMultiHeadAttnBackwardWeights()

Assigning NULL to the reserveSpaceSizeInBytes argument indicates that the user does not plan to invoke multi-head attention gradient functions: <a href="mailto:cudnnMultiHeadAttnBackwardData()">cudnnMultiHeadAttnBackwardData()</a> and <a href="mailto:cudnnMultiHeadAttnBackwardWeights()">cudnnMultiHeadAttnBackwardWeights()</a>. This situation occurs in the inference mode.



Note: NULL cannot be assigned to weightSizeInBytes and workSpaceSizeInBytes pointers.

The user must allocate weight, work, and reserve space buffer sizes in the GPU memory using cudaMalloc() with the reported buffer sizes. The buffers can be also carved out from a larger chunk of allocated memory but the buffer addresses must be at least 16B aligned.

The work-space buffer is used for temporary storage. Its content can be discarded or modified after all GPU kernels launched by the corresponding API complete. The reserve-space buffer is used to transfer intermediate results from <a href="cudnnMultiHeadAttnForward">cudnnMultiHeadAttnForward()</a> to <a href="cudnnMultiHeadAttnBackwardData()">cudnnMultiHeadAttnBackwardData()</a> to <a href="cudnnMultiHeadAttnBackwardWeights()">cudnnMultiHeadAttnBackwardWeights()</a>. The content of the reserve-space buffer cannot be modified until all GPU kernels launched by the above three multi-head attention API functions finish.

All multi-head attention weight and bias tensors are stored in a single weight buffer. For speed optimizations, the cuDNN API may change tensor layouts and their relative locations in the weight buffer based on the provided attention parameters. Use the <a href="mailto:cudnnGetMultiHeadAttnWeights">cudnnGetMultiHeadAttnWeights</a> function to obtain the start address and the shape of each weight or bias tensor.

### **Parameters**

## handle

Input. The current cuDNN context handle.

#### attnDesc

*Input.* Pointer to a previously initialized attention descriptor.

#### weightSizeInBytes

*Output*. Minimum buffer size required to store all multi-head attention trainable parameters.

# workSpaceSizeInBytes

*Output.* Minimum buffer size required to hold all temporary surfaces used by the forward and gradient multi-head attention API calls.

# ${\tt reserveSpaceSizeInBytes}$

Output. Minimum buffer size required to store all intermediate data exchanged between forward and backward (gradient) multi-head attention functions. Set this parameter to NULL in the inference mode indicating that gradient API calls will not be invoked.

# Returns

## CUDNN STATUS SUCCESS

The requested buffer sizes were computed successfully.

# CUDNN STATUS BAD PARAM

An invalid input argument was found.

# 7.2.16. cudnnGetMultiHeadAttnWeights()

```
cudnnStatus_t cudnnGetMultiHeadAttnWeights(
    cudnnHandle_t handle,
    const cudnnAttnDescriptor_t attnDesc,
    cudnnMultiHeadAttnWeightKind_t wKind,
    size_t weightSizeInBytes,
    const void *weights,
    cudnnTensorDescriptor_t wDesc,
    void **wAddr);
```

This function obtains the shape of the weight or bias tensor. It also retrieves the start address of tensor data located in the weight buffer. Use the wkind argument to select a particular tensor. For more information, see  $\underline{\text{cudnnMultiHeadAttnWeightKind\_t}}$  for the description of the enumerant type.

Biases are used in the input and output projections when the CUDNN\_ATTN\_ENABLE\_PROJ\_BIASES flag is set in the attention descriptor. See <a href="cudnnSetAttnDescriptor()">cudnnSetAttnDescriptor()</a> for the description of flags to control projection biases.

When the corresponding weight or bias tensor does not exist, the function writes  $\mathtt{NULL}$  to the storage location pointed by  $\mathtt{wAddr}$  and returns zeros in the  $\mathtt{wDesc}$  tensor descriptor. The return status of the  $\mathtt{cudnnGetMultiHeadAttnWeights()}$  function is  $\mathtt{CUDNN\_STATUS\_SUCCESS}$  in this case

The cuDNN multiHeadAttention sample code demonstrates how to access multihead attention weights. Although the buffer with weights and biases should be allocated in the GPU memory, the user can copy it to the host memory and invoke the <a href="mailto:cudnnGetMultiHeadAttnWeights">cudnnGetMultiHeadAttnWeights</a> function with the host weights address to obtain tensor pointers in the host memory. This scheme allows the user to inspect trainable parameters directly in the CPU memory.

# **Parameters**

### handle

Input. The current cuDNN context handle.

#### attnDesc

Input. A previously configured attention descriptor.

#### wKind

Input. Enumerant type to specify which weight or bias tensor should be retrieved.

# weightSizeInBytes

Input. Buffer size that stores all multi-head attention weights and biases.

## weights

*Input*. Pointer to the weight buffer in the host or device memory.

#### wDesc

Output. The descriptor specifying weight or bias tensor shape. For weights, the wDesc.dimA[] array has three elements: [nHeads, projected size, original size]. For biases, the wDesc.dimA[] array also has three elements: [nHeads, projected size, 1]. The wDesc.strideA[] array describes how tensor elements are arranged in memory.

## wAddr

Output. Pointer to a location where the start address of the requested tensor should be written. When the corresponding projection is disabled, the address written to wAddr is NULL.

#### Returns

# CUDNN\_STATUS\_SUCCESS

The weight tensor descriptor and the address of data in the device memory were successfully retrieved.

## CUDNN STATUS BAD PARAM

An invalid or incompatible input argument was encountered. For example, wKind did not have a valid value or weightSizeInBytes was too small.

# 7.2.17. cudnnGetRNNBackwardDataAlgorithmMaxCount()

This function has been deprecated in cuDNN 8.0.

# 7.2.18. cudnnGetRNNBiasMode()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnGetRNNDescriptor\_v8()</u> instead of cudnnGetRNNBiasMode()

```
cudnnStatus_t cudnnGetRNNBiasMode(
   cudnnRNNDescriptor_t rnnDesc,
   cudnnRNNBiasMode_t *biasMode)
```

This function retrieves the RNN bias mode that was configured by <a href="mailto:cudnnSetRNNBiasMode">cudnnSetRNNBiasMode</a>[]. The default value of <a href="mailto:biasMode">biasMode</a> in <a href="mailto:rnnDesc">rnnDesc</a> after <a href="mailto:cudnnCreateRNNDescriptor">cudnnCreateRNNDescriptor</a>[] is <a href="mailto:cudnn">cudnn RNN DOUBLE BIAS</a>.

# **Parameters**

#### rnnDesc

*Input*. A previously created RNN descriptor.

#### \*biasMode

Output. Pointer to where RNN bias mode should be saved.

# Returns

## CUDNN STATUS BAD PARAM

Either the rnnDesc or \*biasMode is NULL.

# CUDNN STATUS SUCCESS

The biasMode parameter was retrieved successfully.

# 7.2.19. cudnnGetRNNDataDescriptor()

```
cudnnStatus t cudnnGetRNNDataDescriptor(
    cudnnRNNDataDescriptor_t RNNDataDesc,
                                    *dataType,
*layout,
    cudnnDataType t
    cudnnDataType_t
cudnnRNNDataLayout t
                                    *maxSeqLength,
    int
    int
                                     *batchSize,
    int
                                     *vectorSize,
                                     arrayLengthRequested,
    int
    int
                                     seqLengthArray[],
    void
                                     *paddingFill);
```

This function retrieves a previously created RNN data descriptor object.

## **Parameters**

## RNNDataDesc

*Input.* A previously created and initialized RNN descriptor.

## dataType

Output. Pointer to the host memory location to store the datatype of the RNN data tensor.

#### layout

*Output*. Pointer to the host memory location to store the memory layout of the RNN data tensor.

# maxSeqLength

*Output*. The maximum sequence length within this RNN data tensor, including the padding vectors.

#### batchSize

Output. The number of sequences within the mini-batch.

#### vectorSize

*Output*. The vector length (meaning, embedding size) of the input or output tensor at each time-step.

## arrayLengthRequested

*Input.* The number of elements that the user requested for seqLengthArray.

#### seqLengthArray

Output. Pointer to the host memory location to store the integer array describing the length (meaning, number of time-steps) of each sequence. This is allowed to be a NULL pointer if arrayLengthRequested is 0.

# paddingFill

*Output*. Pointer to the host memory location to store the user defined symbol. The symbol should be interpreted as the same data type as the RNN data tensor.

## Returns

## CUDNN STATUS SUCCESS

The parameters are fetched successfully.

# CUDNN STATUS BAD PARAM

Any one of these have occurred:

- Any of RNNDataDesc, dataType, layout, maxSeqLength, batchSize, vectorSize, paddingFill is NULL.
- seqLengthArray is NULL while arrayLengthRequested is greater than zero.
- arrayLengthRequested is less than zero.

# 7.2.20. cudnnGetRNNDescriptor v6()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnGetRNNDescriptor\_v8()</u> instead of cudnnGetRNNDescriptor\_v6().

```
cudnnStatus_t cudnnGetRNNDescriptor_v6(
  cudnnHandle_t handle,
  cudnnRNNDescriptor_t rnnDesc,
  int *hiddenSize,
```

```
int *numLayers,
    cudnnDropoutDescriptor_t *dropoutDesc,
cudnnRNNInputMode_t *inputMode,
cudnnDirectionMode_t *direction,
cudnnRNNMode_t *cellMode,
cudnnRNNAlgo_t *algo,
cudnnDataType t *mathPrec) {
```

This function retrieves RNN network parameters that were configured by <a href="mailto:cudnnSetRNNDescriptor\_v6">cudnnSetRNNDescriptor\_v6</a>. All pointers passed to the function should be not-NULL or <a href="mailto:cudnn\_status\_bad\_parame">cudnn\_status\_bad\_parame</a> is reported. The function does not check the validity of retrieved parameters.

# **Parameters**

#### handle

*Input*. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

Input. A previously created and initialized RNN descriptor.

#### hiddenSize

*Output*. Pointer to where the size of the hidden state should be stored (the same value is used in every RNN layer).

## numLayers

Output. Pointer to where the number of RNN layers should be stored.

#### dropoutDesc

*Output*. Pointer to where the handle to a previously configured dropout descriptor should be stored.

## inputMode

Output. Pointer to where the mode of the first RNN layer should be saved.

## direction

Output. Pointer to where RNN uni-directional/bi-directional mode should be saved.

#### mode

Output. Pointer to where RNN cell type should be saved.

## algo

Output. Pointer to where RNN algorithm type should be stored.

#### mathPrec

*Output.* Pointer to where the math precision type should be stored.

# Returns

## CUDNN STATUS SUCCESS

RNN parameters were successfully retrieved from the RNN descriptor.

## CUDNN STATUS BAD PARAM

At least one pointer passed to the function is NULL.

# 7.2.21. cudnnGetRNNDescriptor v8()

```
cudnnStatus_t cudnnGetRNNDescriptor_v8(
  cudnnRNNDescriptor_t rnnDesc,
  cudnnRNNAlgo_t *algo,
  cudnnRNNMode_t *cellMode,
  cudnnRNNBiasMode_t *biasMode,
  cudnnDirectionMode_t *dirMode,
  cudnnDirectionMode_t *inputMode,
  cudnnDataType_t *dataType,
  cudnnDataType_t *mathPrec,
  cudnnMathType_t *mathType,
  int32_t *inputSize,
  int32_t *hiddenSize,
  int32_t *projSize,
  int32_t *numLayers,
    cudnnDropoutDescriptor_t *dropoutDesc,
  uint32_t *auxFlags);
```

This function retrieves RNN network parameters that were configured by <a href="mailto:cudnnSetRNNDescriptor\_v8">cudnnSetRNNDescriptor\_v8()</a>. The user can assign NULL to any pointer except rnnDesc when the retrieved value is not needed. The function does not check the validity of retrieved parameters.

## **Parameters**

#### rnnDesc

*Input.* A previously created and initialized RNN descriptor.

## algo

Output. Pointer to where RNN algorithm type should be stored.

#### cellMode

Output. Pointer to where RNN cell type should be saved.

#### biasMode

Output. Pointer to where RNN bias mode <a href="mailto:cudnnRNNBiasMode\_t">cudnnRNNBiasMode\_t</a> should be saved.

### dirMode

Output. Pointer to where RNN uni-directional/bi-directional mode should be saved.

#### inputMode

Output. Pointer to where the mode of the first RNN layer should be saved.

#### dataType

Output. Pointer to where the data type of RNN weights/biases should be stored.

# mathPrec

Output. Pointer to where the math precision type should be stored.

## mathType

Output. Pointer to where the preferred option for Tensor Cores are saved.

# inputSize

*Output.* Pointer to where the RNN input vector size is stored.

#### hiddenSize

*Output*. Pointer to where the size of the hidden state should be stored (the same value is used in every RNN layer).

# projSize

Output. Pointer to where the LSTM cell output size after the recurrent projection is stored.

#### numLayers

Output. Pointer to where the number of RNN layers should be stored.

## dropoutDesc

*Output.* Pointer to where the handle to a previously configured dropout descriptor should be stored.

# auxFlags

*Output*. Pointer to miscellaneous RNN options (flags) that do not require passing additional numerical values to configure.

#### Returns

# CUDNN\_STATUS\_SUCCESS

RNN parameters were successfully retrieved from the RNN descriptor.

# CUDNN STATUS BAD PARAM

An invalid input argument was found (rnnDesc was NULL).

# CUDNN STATUS NOT INITIALIZED

The RNN descriptor was configured with the legacy <u>cudnnSetRNNDescriptor\_v6()</u> call.

# 7.2.22. cudnnGetRNNForwardInferenceAlgorithmMaxCount

This function has been deprecated in cuDNN 8.0.

# 7.2.23. cudnnGetRNNForwardTrainingAlgorithmMaxCount(

This function has been deprecated in cuDNN 8.0.

# 7.2.24. cudnnGetRNNLinLayerBiasParams()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnGetRNNWeightParams()</u> instead of cudnnGetRNNLinLayerBiasParams().

cudnnStatus t cudnnGetRNNLinLayerBiasParams(

```
cudnnHandle t
                                 handle,
const cudnnRNNDescriptor t
                                 rnnDesc.
const int
                                 pseudoLaver,
const cudnnTensorDescriptor t
                                 xDesc,
const cudnnFilterDescriptor t
                               wDesc,
const void
const int
                                 linLayerID,
cudnnFilterDescriptor t
                                linLayerBiasDesc,
                                **linLayerBias)
void
```

This function is used to obtain a pointer and a descriptor of every RNN bias column vector in each pseudo-layer within the recurrent network defined by rnnDesc and its input width specified in xDesc.



**Note:** The <u>cudnnGetRNNLinLayerBiasParams()</u> function was changed in cuDNN version 7.1.1 to match the behavior of <u>cudnnGetRNNLinLayerMatrixParams()</u>.

The <u>cudnnGetRNNLinLayerBiasParams()</u> function returns the RNN bias vector size in two dimensions: rows and columns.

Due to historical reasons, the minimum number of dimensions in the filter descriptor is three. In previous versions of the cuDNN library, the function returns the total number of vector elements in linLayerBiasDesc as follows:

```
filterDimA[0] = total_size,
filterDimA[1] = 1,
filterDimA[2] = 1
```

For more information, see the description of the cudnnGetFilterNdDescriptor() function.

In cuDNN 7.1.1, the format was changed to:

```
filterDimA[0]=1,
filterDimA[1]=rows,
filterDimA[2]=1 (number of columns)
```

In both cases, the format field of the filter descriptor should be ignored when retrieved by <a href="mailto:cudnnGetFilterNdDescriptor">cudnnGetFilterNdDescriptor</a>().

The RNN implementation in cuDNN uses two bias vectors before the cell non-linear function. Note that the RNN implementation in cuDNN depends on the number of bias vectors before the cell non-linear function. Refer to the equations in the  $\underline{\text{cudnnRNNMode}}\ \underline{\text{t}}\ \text{description}$ , for the enumerant type based on the value of  $\underline{\text{cudnnRNNBiasMode}}\ \underline{\text{t}}\ \text{biasMode}\ \text{in}\ \underline{\text{rnnDesc}}$ . If nonexistent biases are referenced by  $\underline{\text{linLayerID}}$ , then this function sets  $\underline{\text{linLayerBiasDesc}}\ \text{to a zeroed}\ \text{filter descriptor where}$ :

```
filterDimA[0]=0,
filterDimA[1]=0, and
filterDimA[2]=2
```

and sets linLayerBias to NULL. Refer to the details for the function parameter linLayerID to determine the relevant values of linLayerID based on biasMode.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

# rnnDesc

Input. A previously initialized RNN descriptor.

#### pseudoLayer

Input. The pseudo-layer to query. In uni-directional RNNs, a pseudo-layer is the same as a physical layer (pseudoLayer=0 is the RNN input layer, pseudoLayer=1 is the first hidden layer). In bi-directional RNNs, there are twice as many pseudo-layers in comparison to physical layers.

- pseudoLayer=0 refers to the forward part of the physical input layer
- pseudoLayer=1 refers to the backward part of the physical input layer
- pseudoLayer=2 is the forward part of the first hidden layer, and so on

#### xDesc

*Input.* A fully packed tensor descriptor describing the input to one recurrent iteration (to retrieve the RNN input width).

#### wDesc

Input. Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

#### linLayerID

Input. Linear ID index of the weight matrix.

If cellMode in rnnDesc was set to CUDNN RNN RELU or CUDNN RNN TANH:

- ▶ Value 0 references the weight matrix used in conjunction with the input from the previous layer or input to the RNN model.
- ▶ Value 1 references the weight matrix used in conjunction with the hidden state from the previous time step or the initial hidden state.

If cellMode in rnnDesc was set to CUDNN LSTM:

- ▶ Values 0, 1, 2, and 3 reference weight matrices used in conjunction with the input from the previous layer or input to the RNN model.
- Values 4, 5, 6, and 7 reference weight matrices used in conjunction with the hidden state from the previous time step or the initial hidden state.
- Value 8 corresponds to the projection matrix, if enabled.

Values and their LSTM gates:

- linLayerIDO and 4 correspond to the input gate.
- ▶ linLayerID1 and 5 correspond to the forget gate.
- ▶ linLayerID2 and 6 correspond to the new cell state calculations with a hyperbolic tangent.
- ▶ linLayerID3 and 7 correspond to the output gate.

If cellMode in rnnDesc was set to CUDNN GRU:

- ▶ Values 0, 1, and 2 reference weight matrices used in conjunction with the input from the previous layer or input to the RNN model.
- ▶ Values 3, 4, and 5 reference weight matrices used in conjunction with the hidden state from the previous time step or the initial hidden state.

Values and their GRU gates:

- linLayerIDO and 3 correspond to the reset gate.
- linLayerID1 and 4 references to the update gate.
- linLayerID2 and 5 correspond to the new hidden state calculations with a hyperbolic tangent.

## linLayerBiasDesc

Output. Handle to a previously created filter descriptor.

## linLayerBias

*Output*. Data pointer to GPU memory associated with the filter descriptor linLayerBiasDesc.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the following arguments is NULL: handle, rnnDesc, xDesc, wDesc, linLayerBiasDesc, linLayerBias.
- A data type mismatch was detected between rnnDesc and other descriptors.
- Minimum requirement for the w pointer alignment is not satisfied.
- ► The value of pseudoLayer or linLayerID is out of range.

## CUDNN STATUS INVALID VALUE

Some elements of the linLayerBias vector are outside the w buffer boundaries as specified by the wDesc descriptor.

# 7.2.25. cudnnGetRNNLinLayerMatrixParams()

This function has been deprecated in cuDNN 8.0. Use  $\underline{\text{cudnnGetRNNWeightParams()}}$  instead of  $\underline{\text{cudnnGetRNNLinLayerMatrixParams()}}$ .

```
cudnnStatus_t cudnnGetRNNLinLayerMatrixParams(
cudnnHandle t handle,
```

This function is used to obtain a pointer and a descriptor of every RNN weight matrix in each pseudo-layer within the recurrent network defined by rnnDesc and its input width specified in xDesc.



Note: The <u>cudnnGetRNNLinLayerMatrixParams()</u> function was enhanced in cuDNN version 7.1.1 without changing its prototype. Instead of reporting the total number of elements in each weight matrix in the <code>linLayerMatDesc</code> filter descriptor, the function returns the matrix size as two dimensions: rows and columns. Moreover, when a weight matrix does not exist, for example, due to <code>CUDNN\_SKIP\_INPUT</code> mode, the function returns <code>NULL</code> in <code>linLayerMat</code> and all fields of <code>linLayerMatDesc</code> are zero.

The <u>cudnnGetRNNLinLayerMatrixParams()</u> function returns the RNN matrix size in two dimensions: rows and columns. This allows the user to easily print and initialize RNN weight matrices. Elements in each weight matrix are arranged in the row-major order. Due to historical reasons, the minimum number of dimensions in the filter descriptor is three. In previous versions of the cuDNN library, the function returned the total number of weights in linLayerMatDesc as follows: filterDimA[0]=total\_size, filterDimA[1]=1, filterDimA[2]=1 (see the description of the <u>cudnnGetFilterNdDescriptor()</u> function). In cuDNN 7.1.1, the format was changed to: filterDimA[0]=1, filterDimA[1]=rows, filterDimA[2]=columns. In both cases, the "format" field of the filter descriptor should be ignored when retrieved by <u>cudnnGetFilterNdDescriptor()</u>.

## **Parameters**

### handle

*Input*. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

Input. A previously initialized RNN descriptor.

## pseudoLayer

Input. The pseudo-layer to query. In uni-directional RNNs, a pseudo-layer is the same as a physical layer (pseudoLayer=0 is the RNN input layer, pseudoLayer=1 is the first hidden layer). In bi-directional RNNs, there are twice as many pseudo-layers in comparison to physical layers.

- pseudoLayer=0 refers to the forward part of the physical input layer
- pseudoLayer=1 refers to the backward part of the physical input layer
- pseudoLayer=2 is the forward part of the first hidden layer, and so on

#### **x**Desc

*Input*. A fully packed tensor descriptor describing the input to one recurrent iteration (to retrieve the RNN input width).

#### wDesc

Input. Handle to a previously initialized filter descriptor describing the weights for the RNN.

w

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

## linLayerID

*Input*. The linear layer to obtain information about:

- ▶ If mode in rnnDesc was set to CUDNN RNN RELU OF CUDNN RNN TANH:
  - Value 0 references the bias applied to the input from the previous layer (relevant if biasMode in rnnDesc is CUDNN\_RNN\_SINGLE\_INP\_BIAS or CUDNN\_RNN\_DOUBLE\_BIAS).
  - ► Value 1 references the bias applied to the recurrent input (relevant if biasMode in rnnDesc is CUDNN RNN DOUBLE BIAS or CUDNN RNN SINGLE REC BIAS).
  - ▶ If mode in rnnDesc was set to CUDNN LSTM:
    - Values of 0, 1, 2 and 3 reference bias applied to the input from the previous layer (relevant if biasMode in rnnDesc is CUDNN\_RNN\_SINGLE\_INP\_BIAS or CUDNN\_RNN\_DOUBLE\_BIAS).
    - ► Values of 4, 5, 6 and 7 reference bias applied to the recurrent input (relevant if biasMode in rnnDesc is CUDNN\_RNN\_DOUBLE\_BIAS or CUDNN RNN SINGLE REC BIAS).
    - Values and their associated gates:
      - Values 0 and 4 reference the input gate.
      - Values 1 and 5 reference the forget gate.
      - Values 2 and 6 reference the new memory gate.
      - Values 3 and 7 reference the output gate.
  - ▶ If mode in rnnDesc was set to CUDNN GRU:
    - ▶ Values of 0, 1 and 2 reference bias applied to the input from the previous layer (relevant if biasMode in rnnDesc is CUDNN\_RNN\_SINGLE\_INP\_BIAS or CUDNN\_RNN\_DOUBLE\_BIAS).
    - Values of 3, 4 and 5 reference bias applied to the recurrent input (relevant if biasMode in rnnDesc is CUDNN\_RNN\_DOUBLE\_BIAS or CUDNN\_RNN\_SINGLE\_REC\_BIAS).
    - Values and their associated gates:
      - ▶ Values 0 and 3 reference the reset gate.

- ▶ Values 1 and 4 reference the update gate.
- ▶ Values 2 and 5 reference the new memory gate.

For more information on modes and bias modes, see cudnnRNNMode t.

### linLayerMatDesc

*Output*. Handle to a previously created filter descriptor. When the weight matrix does not exist, the returned filer descriptor has all fields set to zero.

## linLayerMat

Output. Data pointer to GPU memory associated with the filter descriptor linLayerMatDesc. When the weight matrix does not exist, the returned pointer is NULL.

# Returns

# CUDNN\_STATUS\_SUCCESS

The query was successful.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- One of the following arguments is NULL: handle, rnnDesc, xDesc, wDesc, linLayerMatDesc, linLayerMat.
- A data type mismatch was detected between rnnDesc and other descriptors.
- ▶ Minimum requirement for the w pointer alignment is not satisfied.
- ► The value of pseudoLayer or linLayerID is out of range.

# CUDNN STATUS INVALID VALUE

Some elements of the linLayerMat vector are outside the w buffer boundaries as specified by the wDesc descriptor.

# 7.2.26. cudnnGetRNNMatrixMathType()

This function has been deprecated in cuDNN 8.0. Use  $\underline{\text{cudnnGetRNNDescriptor\_v8()}}$  instead of  $\underline{\text{cudnnGetRNNMatrixMathType ()}}$ .

```
cudnnStatus_t cudnnGetRNNMatrixMathType(
  cudnnRNNDescriptor_t rnnDesc,
  cudnnMathType_t *mType);
```

This function retrieves the preferred settings for NVIDIA Tensor Cores on Volta (SM 7.0) or higher GPUs. See the cudnnMathType t description for more details.

# **Parameters**

#### rnnDesc

Input. A previously created and initialized RNN descriptor.

# mType

Output. Address where the preferred Tensor Core settings should be stored.

# Returns

# CUDNN\_STATUS\_SUCCESS

The requested RNN descriptor field was retrieved successfully.

```
CUDNN STATUS BAD PARAM
```

An invalid input argument was found (rnnDesc or mType was NULL).

# 7.2.27. cudnnGetRNNPaddingMode()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnGetRNNDescriptor\_v8()</u> instead of cudnnGetRNNPaddingMode().

```
cudnnStatus_t cudnnGetRNNPaddingMode(
    cudnnRNNDescriptor_t rnnDesc,
    cudnnRNNPaddingMode_t *paddingMode)
```

This function retrieves the RNN padding mode from the RNN descriptor.

# **Parameters**

# rnnDesc

Input/Output. A previously created RNN descriptor.

# \*paddingMode

*Input.* Pointer to the host memory where the RNN padding mode is saved.

# Returns

## CUDNN STATUS SUCCESS

The RNN padding mode parameter was retrieved successfully.

# CUDNN STATUS BAD PARAM

Either the rnnDesc or \*paddingMode is NULL.

# 7.2.28. cudnnGetRNNParamsSize()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnGetRNNWeightSpaceSize()</u> instead of cudnnGetRNNParamsSize().

```
cudnnStatus t cudnnGetRNNParamsSize(
```

This function is used to query the amount of parameter space required to execute the RNN described by rnnDesc with input dimensions defined by xDesc.

## **Parameters**

S

#### handle

Input. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

*Input.* A previously initialized RNN descriptor.

#### xDesc

*Input.* A fully packed tensor descriptor describing the input to one recurrent iteration.

# sizeInBytes

*Output*. Minimum amount of GPU memory needed as parameter space to be able to execute an RNN with the specified descriptor and input tensors.

# dataType

*Input*. The data type of the parameters.

## Returns

# CUDNN STATUS SUCCESS

The query was successful.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- ► The descriptor xDesc is invalid.
- ► The descriptor xDesc is not fully packed.
- ► The combination of dataType and tensor descriptor data type is invalid.

## CUDNN STATUS NOT SUPPORTED

The combination of the RNN descriptor and tensor descriptors is not supported.

# 7.2.29. cudnnGetRNNProjectionLayers()

This function has been deprecated in cuDNN 8.0. Use  $\underline{\text{cudnnGetRNNDescriptor\_v8()}}$  instead of  $\underline{\text{cudnnGetRNNProjectionLayers ()}}$ .

```
cudnnStatus t cudnnGetRNNProjectionLayers(
```

```
cudnnHandle t
              handle,
cudnnRNNDescriptor_t rnnDesc,
                      *recProjSize,
                      *outProjSize)
```

This function retrieves the current RNN projection parameters. By default, the projection feature is disabled so invoking this function will yield recProjSize equal to hiddenSize and outProjSize set to zero. The <a href="mailto:cudnnSetRNNProjectionLayers">cudnnSetRNNProjectionLayers</a>() method enables the RNN projection.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

#### rnnDesc

*Input.* A previously created and initialized RNN descriptor.

### recProjSize

*Output.* Pointer where the recurrent projection size should be stored.

## outProjSize

Output. Pointer where the output projection size should be stored.

## Returns

## CUDNN STATUS SUCCESS

RNN projection parameters were retrieved successfully.

## CUDNN STATUS BAD PARAM

A NULL pointer was passed to the function.

# cudnnGetRNNTempSpaceSizes()

```
cudnnStatus t cudnnGetRNNTempSpaceSizes(
cudnnHandle t handle,
cudnnRNNDescriptor_t rnnDesc,
cudnnForwardMode t fMode,
   cudnnRNNDataDescriptor t xDesc,
size t *workSpaceSize,
size t *reserveSpaceSize);
```

This function computes the work and reserve space buffer sizes based on the RNN network geometry stored in rnnDesc, designated usage (inference or training) defined by the fMode argument, and the current RNN data dimensions (maxSeqLength, batchSize) retrieved from xDesc. When RNN data dimensions change, the cudnnGetRNNTempSpaceSizes () must be called again because RNN temporary buffer sizes are not monotonic.

The user can assign NULL to workSpaceSize or reserveSpaceSize pointers when the corresponding value is not needed.

## **Parameters**

# handle

Input. The current cuDNN context handle.

#### rnnDesc

*Input.* A previously initialized RNN descriptor.

#### fMode

Input. Specifies whether temporary buffers are used in inference or training modes. The reserve-space buffer is not used during inference. Therefore, the returned size of the reserve space buffer will be zero when the fmode argument is CUDNN FWD MODE INFERENCE.

#### xDesc

*Input.* A single RNN data descriptor that specifies current RNN data dimensions: maxSeqLength and batchSize.

#### workSpaceSize

*Output.* Minimum amount of GPU memory in bytes needed as a workspace buffer. The workspace buffer is not used to pass intermediate results between APIs but as a temporary read/write buffer.

## reserveSpaceSize

Output. Minimum amount of GPU memory in bytes needed as the reserve-space buffer. The reserve space buffer is used to pass intermediate results from <a href="mailto:cudnnRNNForward()">cudnnRNNForward()</a> to RNN BackwardData and BackwardWeights routines that compute first order derivatives with respect to RNN inputs or trainable weight and biases.

## Returns

## CUDNN STATUS SUCCESS

RNN temporary buffer sizes were computed successfully.

## CUDNN STATUS BAD PARAM

An invalid input argument was detected.

## CUDNN STATUS NOT SUPPORTED

An incompatible or unsupported combination of input arguments was detected.

# 7.2.31. cudnnGetRNNWeightParams()

```
cudnnStatus_t cudnnGetRNNWeightParams(
  cudnnHandle_t handle,
  cudnnRNNDescriptor_t rnnDesc,
  int32_t pseudoLayer,
  size_t weightSpaceSize,
  const void *weightSpace,
  int32_t linLayerID,
```

```
cudnnTensorDescriptor_t mDesc,
void **mAddr,
   cudnnTensorDescriptor_t bDesc,
void **bAddr);
```

This function is used to obtain the start address and shape of every RNN weight matrix and bias vector in each pseudo-layer within the recurrent network.

# **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN library descriptor.

#### rnnDesc

*Input*. A previously initialized RNN descriptor.

## pseudoLayer

Input. The pseudo-layer to query. In uni-directional RNNs, a pseudo-layer is the same as a physical layer (pseudoLayer=0 is the RNN input layer, pseudoLayer=1 is the first hidden layer). In bi-directional RNNs, there are twice as many pseudo-layers in comparison to physical layers:

- pseudoLayer=0 refers to the forward direction sub-layer of the physical input layer
- pseudoLayer=1 refers to the backward direction sub-layer of the physical input layer
- pseudoLayer=2 is the forward direction sub-layer of the first hidden layer, and so on

# weightSpaceSize

Input. Size of the weight space buffer in bytes.

#### weightSpace

Input. Pointer to the weight space buffer.

#### linLayerID

Input. Weight matrix or bias vector linear ID index.

If cellMode in rnnDesc was set to CUDNN RNN RELU OR CUDNN RNN TANH:

- Value 0 references the weight matrix or bias vector used in conjunction with the input from the previous layer or input to the RNN model.
- Value 1 references the weight matrix or bias vector used in conjunction with the hidden state from the previous time step or the initial hidden state.

If cellMode in rnnDesc was set to CUDNN LSTM:

- Values 0, 1, 2 and 3 reference weight matrices or bias vectors used in conjunction with the input from the previous layer or input to the RNN model.
- Values 4, 5, 6 and 7 reference weight matrices or bias vectors used in conjunction with the hidden state from the previous time step or the initial hidden state.
- ▶ Value 8 corresponds to the projection matrix, if enabled (there is no bias in this operation).

If cellMode in rnnDesc was set to CUDNN GRU:

- ▶ Values 0, 1 and 2 reference weight matrices or bias vectors used in conjunction with the input from the previous layer or input to the RNN model.
- ▶ Values 3, 4 and 5 reference weight matrices or bias vectors used in conjunction with the hidden state from the previous time step or the initial hidden state.

Values and their GRU gates:

- ▶ linLayerIDO and 3 correspond to the reset gate.
- linLayerID1 and 4 reference to the update gate.
- linLayerID2 and 5 correspond to the new hidden state calculations with hyperbolic tangent.

For more information on modes and bias modes, see cudnnRNNMode t.

# mDesc

Output. Handle to a previously created tensor descriptor. The shape of the corresponding weight matrix is returned in this descriptor in the following format:  $dimA[3] = \{1, rows, cols\}$ . The reported number of tensor dimensions is zero when the weight matrix does not exist. This situation occurs for input GEMM matrices of the first layer when  $CUDNN\_SKIP\_INPUT$  is selected or for the LSTM projection matrix when the feature is disabled.

#### mAddr

*Output*. Pointer to the beginning of the weight matrix within the weight space buffer. When the weight matrix does not exist, the returned address is NULL.

#### bDesc

Output. Handle to a previously created tensor descriptor. The shape of the corresponding bias vector is returned in this descriptor in the following format:  $dimA[3] = \{1, rows, 1\}$ . The reported number of tensor dimensions is zero when the bias vector does not exist.

#### bAddr

*Output.* Pointer to the beginning of the bias vector within the weight space buffer. When the bias vector does not exist, the returned address is NULL.

# Returns

# CUDNN STATUS SUCCESS

The query was completed successfully.

# CUDNN STATUS BAD PARAM

An invalid input argument was encountered. For example, the value of pseudoLayer is out of range or linLayerID is negative or larger than 8.

## CUDNN STATUS INVALID VALUE

Some weight/bias elements are outside the weight space buffer boundaries.

# CUDNN\_STATUS\_NOT\_INITIALIZED

The RNN descriptor was configured with the legacy <u>cudnnSetRNNDescriptor\_v6()</u> call.

# 7.2.32. cudnnGetRNNWeightSpaceSize()

```
cudnnStatus_t cudnnGetRNNWeightSpaceSize(
  cudnnHandle_t handle,
  cudnnRNNDescriptor_t rnnDesc,
  size_t *weightSpaceSize);
```

This function reports the required size of the weight space buffer in bytes. The weight space buffer holds all RNN weight matrices and bias vectors.

# **Parameters**

#### handle

*Input*. The current cuDNN context handle.

#### rnnDesc

Input. A previously initialized RNN descriptor.

## weightSpaceSize

Output. Minimum size in bytes of GPU memory needed for all RNN trainable parameters.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

An invalid input argument was encountered. For example, any input argument was NULL.

# CUDNN STATUS NOT INITIALIZED

The RNN descriptor was configured with the legacy cudnnSetRNNDescriptor v6() call.

# 7.2.33. cudnnGetRNNWorkspaceSize()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnGetRNNTempSpaceSizes()</u> instead of cudnnGetRNNWorkspaceSize().

This function is used to query the amount of work space required to execute the RNN described by rnnDesc with input dimensions defined by xDesc.

## **Parameters**

### handle

*Input*. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

Input. A previously initialized RNN descriptor.

# seqLength

*Input.* Number of iterations to unroll over. Workspace that is allocated, based on the size that this function provides, cannot be used for sequences longer than seqLength.

#### **x**Desc

Input. An array of tensor descriptors describing the input to each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. For example, if you have multiple time series in a batch, they can be different lengths. This dimension is the batch size for the particular iteration of the sequence, and so it should decrease when a sequence in the batch has been terminated.

Each tensor descriptor must have the same second dimension (vector length).

# sizeInBytes

*Output*. Minimum amount of GPU memory needed as workspace to be able to execute an RNN with the specified descriptor and input tensors.

# Returns

# CUDNN STATUS SUCCESS

The query was successful.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors in xDesc is invalid.
- The descriptors in xDesc have inconsistent second dimensions, strides or data types.
- ► The descriptors in xDesc have increasing first dimensions.
- ► The descriptors in xDesc are not fully packed.

# CUDNN STATUS NOT SUPPORTED

The data types in tensors described by xDesc are not supported.

# 7.2.34. cudnnGetSeqDataDescriptor()

cudnnStatus t cudnnGetSeqDataDescriptor(

```
const cudnnSeqDataDescriptor_t seqDataDesc,
cudnnDataType_t *dataType,
int *nbDims,
int nbDimsRequested,
int dimA[],
cudnnSeqDataAxis_t axes[],
size_t *seqLengthArraySize,
size_t seqLengthSizeRequested,
int seqLengthArray[],
void *paddingFill);
```

This function retrieves settings from a previously created sequence data descriptor. The user can assign NULL to any pointer except seqDataDesc when the retrieved value is not needed. The nbDimsRequested argument applies to both dimA[] and axes[] arrays. A positive value of nbDimsRequested or seqLengthSizeRequested is ignored when the corresponding array, dimA[], axes[], Or seqLengthArray[] is NULL.

The <u>cudnnGetSeqDataDescriptor()</u> function does not report the actual strides in the sequence data buffer. Those strides can be handy in computing the offset to any sequence data element. The user must precompute strides based on the axes[] and dimA[] arrays reported by the <u>cudnnGetSeqDataDescriptor()</u> function. Below is sample code that performs this task:

```
// Array holding sequence data strides.
size_t strA[CUDNN_SEQDATA_DIM_COUNT] = {0};

// Compute strides from dimension and order arrays.
size_t stride = 1;
for (int i = nbDims - 1; i >= 0; i--) {
  int j = int(axes[i]);
  if (unsigned(j) < CUDNN_SEQDATA_DIM_COUNT-1 && strA[j] == 0) {
    strA[j] = stride;
    stride *= dimA[j];
} else {
    fprintf(stderr, "ERROR: invalid axes[%d]=%d\n\n", i, j);
    abort();
}
</pre>
```

Now, the strA[] array can be used to compute the index to any sequence data element, for example:

The above code assumes that all four indices (batch, beam, time, vect) are less than the corresponding value in the dimA[] array. The sample code also omits the strA[CUDNN\_SEQDATA\_VECT\_DIM] stride because its value is always 1, meaning, elements of one vector occupy a contiguous block of memory.

## **Parameters**

## seqDataDesc

*Input.* Sequence data descriptor.

#### dataType

Output. Data type used in the sequence data buffer.

#### nhDime

Output. The number of active dimensions in the dimA[] and axes[] arrays.

#### nbDimsRequested

Input. The maximum number of consecutive elements that can be written to dimA[] and axes[] arrays starting from index zero. The recommended value for this argument is CUDNN SEQDATA DIM COUNT.

## dimA[]

Output. Integer array holding sequence data dimensions.

#### axes[]

Output. Array of <a href="mailto:cudnnSeqDataAxis">cudnnSeqDataAxis</a> t that defines the layout of sequence data in memory.

# seqLengthArraySize

*Output.* The number of required elements in seqLengthArray[] to save all sequence lengths.

# seqLengthSizeRequested

*Input.* The maximum number of consecutive elements that can be written to the seqLengthArray[] array starting from index zero.

# seqLengthArray[]

Output. Integer array holding sequence lengths.

# paddingFill

Output. Pointer to a storage location of dataType with the fill value that should be written to all padding vectors. Use NULL when an explicit initialization of output padding vectors was not requested.

# Returns

# CUDNN\_STATUS\_SUCCESS

Requested sequence data descriptor fields were retrieved successfully.

# CUDNN\_STATUS\_BAD PARAM

An invalid input argument was found.

# CUDNN\_STATUS\_INTERNAL\_ERROR

An inconsistent internal state was encountered.

# 7.2.35. cudnnMultiHeadAttnForward()

```
cudnnStatus t cudnnMultiHeadAttnForward(
cudnnHandle_t handle,
const cudnnAttnDescriptor t attnDesc,
int currIdx,
const int loWinIdx[],
const int hiWinIdx[],
const int devSeqLengthsQO[],
const int devSeqLengthsKV[],
const cudnnSeqDataDescriptor t qDesc,
const void *queries,
const void *residuals,
const cudnnSeqDataDescriptor t kDesc,
const void *keys,
const cudnnSeqDataDescriptor t vDesc,
const void *values,
const cudnnSeqDataDescriptor t oDesc,
      void *out,
size t weightSizeInBytes,
const void *weights,
```

```
size_t workSpaceSizeInBytes,
void *workSpace,
size_t reserveSpaceSizeInBytes,
void *reserveSpace);
```

The cudnnMultiHeadAttnForward() function computes the forward responses of the multi-head attention layer. When reserveSpaceSizeInBytes=0 and reserveSpace=NULL, the function operates in the inference mode in which backward (gradient) functions are not invoked, otherwise, the training mode is assumed. In the training mode, the reserve space is used to pass intermediate results from cudnnMultiHeadAttnForward() to cudnnMultiHeadAttnBackwardData() and from cudnnMultiHeadAttnBackwardData() to cudnnMultiHeadAttnBackwardWeights().

In the inference mode, the currIdx specifies the time-step or sequence index of the embedding vectors to be processed. In this mode, the user can perform one iteration for time-step zero (currIdx=0), then update  $\mathbf{Q}$ ,  $\mathbf{K}$ ,  $\mathbf{V}$  vectors and the attention window, and execute the next step (currIdx=1). The iterative process can be repeated for all time-steps.

When all  ${\bf Q}$  time-steps are available (for example, in the training mode or in the inference mode on the encoder side in self-attention), the user can assign a negative value to currIdx and the cudnnMultiHeadAttnForward() API will automatically sweep through all  ${\bf Q}$  timesteps.

The lowinIdx[] and hiwinIdx[] host arrays specify the attention window size for each **Q** time-step. In a typical self-attention case, the user must include all previously visited embedding vectors but not the current or future vectors. In this situation, the user should set:

When currIdx is negative in cudnnMultiHeadAttnForward(), the loWinIdx[] and hiWinIdx[] arrays must be fully initialized for all time-steps. When cudnnMultiHeadAttnForward() is invoked with currIdx=0, currIdx=1, currIdx=2, etc., then the user can update loWinIdx[currIdx] and hiWinIdx[currIdx] elements only before invoking the forward response function. All other elements in the loWinIdx[] and hiWinIdx[] arrays will not be accessed. Any adaptive attention window scheme can be implemented that way.

Use the following settings when the attention window should be the maximum size, for example, in cross-attention:

```
currIdx=0: loWinIdx[0]=0; hiWinIdx[0]=maxSeqLenK;
currIdx=1: loWinIdx[1]=0; hiWinIdx[1]=maxSeqLenK;
currIdx=2: loWinIdx[2]=0; hiWinIdx[2]=maxSeqLenK;
(...)
```

The maxSeqLenK value above should be equal to or larger than dimA[CUDNN\_SEQDATA\_TIME\_DIM] in the kDesc descriptor. A good choice is to use maxSeqLenK=INT\_MAX from limits.h.



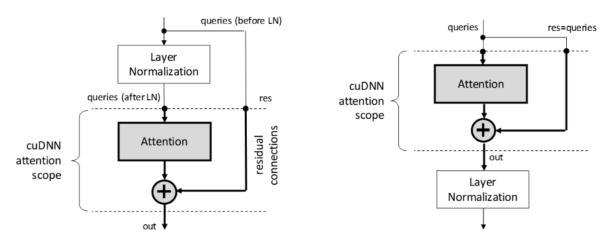
Note: The actual length of any K sequence defined in seqLengthArray[] in  $\underline{cudnnSetSeqDataDescriptor()}$  can be shorter than maxSeqLenK. The effective attention window span is computed based on seqLengthArray[] stored in the K sequence descriptor and indices held in loWinIdx[] and hiWinIdx[] arrays.

devSeqLengthsQO[] and devSeqLengthsKV[] are pointers to device (not host) arrays with Q, O, and K, V sequence lengths. Note that the same information is also passed in the corresponding descriptors of type <a href="cudnnSeqDataDescriptor">cudnnSeqDataDescriptor</a>\_t on the host side. The need for extra device arrays comes from the asynchronous nature of cuDNN calls and limited size of the constant memory dedicated to GPU kernel arguments. When the <a href="cudnnMultiHeadAttnForward">cudnnMultiHeadAttnForward</a>() API returns, the sequence length arrays stored in the descriptors can be immediately modified for the next iteration. However, the GPU kernels launched by the forward call may not have started at this point. For this reason, copies of sequence arrays are needed on the device side to be accessed directly by GPU kernels. Those copies cannot be created inside the cudnnMultiHeadAttnForward() function for very large K, V inputs without the device memory allocation and CUDA stream synchronization.

To reduce the cudnnMultiHeadAttnForward() API overhead, devSeqLengthsQO[] and devSeqLengthsKV[] device arrays are not validated to contain the same settings as seqLengthArray[] in the sequence data descriptors.

Sequence lengths in the kDesc and vDesc descriptors should be the same. Similarly, sequence lengths in the qDesc and oDesc descriptors should match. The user can define six different data layouts in the qDesc, kDesc, vDesc and oDesc descriptors. See the <a href="mailto:cudnnSetSeqDataDescriptor">cudnnSetSeqDataDescriptor</a> function for the discussion of those layouts. All multi-head attention API calls require that the same layout is used in all sequence data descriptors.

In the transformer model, the multi-head attention block is tightly coupled with the layer normalization and residual connections. <code>cudnnMultiHeadAttnForward()</code> does not encompass the layer normalization but it can be used to handle residual connections as depicted in the following figure.



Queries and residuals share the same qDesc descriptor in cudnnMultiHeadAttnForward(). When residual connections are disabled, the residuals pointer should be NULL. When residual connections are enabled, the vector length in qDesc should match the vector length specified in the oDesc descriptor, so that a vector addition is feasible.

The queries, keys, and values pointers are not allowed to be NULL, even when K and V are the same inputs or Q, K, V are the same inputs.

#### **Parameters**

### handle

Input. The current cuDNN context handle.

#### attnDesc

Input. A previously initialized attention descriptor.

#### currIdx

Input. Time-step in queries to process. When the currIdx argument is negative, all **Q** time-steps are processed. When currIdx is zero or positive, the forward response is computed for the selected time-step only. The latter input can be used in inference mode only, to process one time-step while updating the next attention window and **Q**, **R**, **K**, **V** inputs inbetween calls.

#### loWinIdx[], hiWinIdx[]

*Input.* Two host integer arrays specifying the start and end indices of the attention window for each  $\mathbf{Q}$  time-step. The start index in  $\mathbf{K}$ ,  $\mathbf{V}$  sets is inclusive, and the end index is exclusive.

## devSeqLengthsQ0[]

*Input.* Device array specifying sequence lengths of query, residual, and output sequence data.

#### devSeqLengthsKV[]

Input. Device array specifying sequence lengths of key and value input data.

## qDesc

Input. Descriptor for the query and residual sequence data.

### queries

*Input*. Pointer to queries data in the device memory.

#### residuals

Input. Pointer to residual data in device memory. Set this argument to NULL if no residual connections are required.

#### kDesc

Input. Descriptor for the keys sequence data.

#### keys

Input. Pointer to keys data in device memory.

#### vDesc

Input. Descriptor for the values sequence data.

## values

Input. Pointer to values data in device memory.

#### oDesc

Input. Descriptor for the multi-head attention output sequence data.

#### out

*Output.* Pointer to device memory where the output response should be written.

#### weightSizeInBytes

*Input.* Size of the weight buffer in bytes where all multi-head attention trainable parameters are stored.

#### weights

*Input*. Pointer to the weight buffer in device memory.

#### workSpaceSizeInBytes

*Input*. Size of the work-space buffer in bytes used for temporary API storage.

#### workSpace

*Input/Output*. Pointer to the work-space buffer in device memory.

#### reserveSpaceSizeInBytes

*Input*. Size of the reserve-space buffer in bytes used for data exchange between forward and backward (gradient) API calls. This parameter should be zero in the inference mode and non-zero in the training mode.

#### reserveSpace

Input/Output. Pointer to the reserve-space buffer in device memory. This argument should be NULL in inference mode and non-NULL in the training mode.

## Returns

## CUDNN STATUS SUCCESS

No errors were detected while processing API input arguments and launching GPU kernels.

#### CUDNN STATUS BAD PARAM

An invalid or incompatible input argument was encountered. Some examples include:

- ▶ a required input pointer was NULL
- currIdx was out of bound
- the descriptor value for attention, query, key, value, and output were incompatible with one another

## CUDNN\_STATUS\_EXECUTION\_FAILED

The process of launching a GPU kernel returned an error, or an earlier kernel did not complete successfully.

## CUDNN\_STATUS\_INTERNAL\_ERROR

An inconsistent internal state was encountered.

#### CUDNN STATUS NOT SUPPORTED

A requested option or a combination of input arguments is not supported.

## CUDNN\_STATUS\_ALLOC\_FAILED

Insufficient amount of shared memory to launch a GPU kernel.

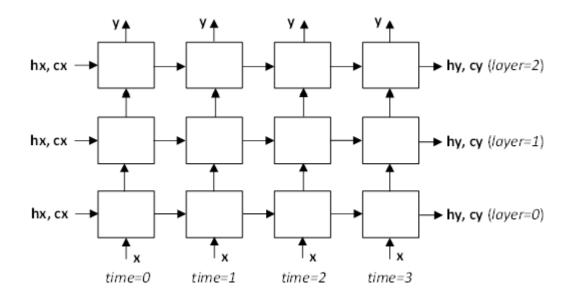
## 7.2.36. cudnnRNNForward()

```
cudnnStatus t cudnnRNNForward(
   cudnnHandle t handle,
   cudnnRNNDescriptor_t rnnDesc,
   cudnnForwardMode t fwdMode,
   const int32 t devSeqLengths[],
   cudnnRNNDataDescriptor t xDesc,
   const void *x,
   cudnnRNNDataDescriptor t yDesc,
   void *y,
   cudnnTensorDescriptor t hDesc,
   const void *hx,
   void *hy,
   cudnnTensorDescriptor t cDesc,
   const void *cx,
   void *cy,
   size t weightSpaceSize,
   const void *weightSpace,
   size t workSpaceSize,
   void *workSpace,
   size_t reserveSpaceSize,
   void *reserveSpace);
```

This routine computes the forward response of the recurrent neural network described by rnnDesc with inputs in x, hx, cx, and weights/biases in the weightSpace buffer. RNN outputs are written to y, hy, and cy buffers. Locations of x, y, hx, cx, hy, and cy signals in the multi-layer RNN model are shown in the Figure below. Note that internal RNN signals between time-steps and between layers are not exposed to the user.

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Figure 1. Locations of x, y, hx, cx, hy, and cy signals in the multi-layer RNN model.



The next Figure depicts data flow when the RNN model is bi-directional. In this mode each RNN physical layer consists of two consecutive pseudo-layers, each with its own weights, biases, the initial hidden state hx, and for LSTM, also the initial cell state cx. Even pseudo-layers 0, 2, 4 process input vectors from left to right or in the forward (F) direction. Odd pseudo-layers 1, 3, 5 process input vectors from right to left or in the reverse (R) direction. Two successive pseudo-layers operate on the same input vectors, just in a different order. Pseudo-layers 0 and 1 access the original sequences stored in the x buffer. Outputs of F and R cells are concatenated so vectors fed to the next two pseudo-layers have lengths of P0 hiddenSize or P1 projSize. Input GEMMs in subsequent pseudo-layers adjust vector lengths to P1 hiddenSize.

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 $\triangle$ ⇧  $\triangle$ hy, cy ◀ hx, cx (psedoLayer=5) hy, cy (psedoLayer=4) hx, cx ⇧ ⇧ concat  $\Box$  $\Box$ ⇧ hy, cy ◀ hx, cx (psedoLayer=3) R hx, cx hy, cy (psedoLayer=2) ⇧ ⇧ hy, cy ◀ hx, cx (psedoLayer=1) R hy, cy (psedoLayer=0) hx, cx time=0 time=1time=2

Figure 2. Data flow when the RNN model is bi-directional.

When the fwdMode parameter is set to CUDNN\_FWD\_MODE\_TRAINING, the cudnnRNNForward() function stores intermediate data required to compute first order derivatives in the reserve space buffer. Work and reserve space buffer sizes should be computed by the <a href="mailto:cudnnGetRNNTempSpaceSizes">cudnnGetRNNTempSpaceSizes</a>() function with the same fwdMode setting as used in the cudnnRNNForward() call.

The same layout type must be specified in xDesc and yDesc descriptors. The same sequence lengths must be configured in xDesc, yDesc and in the device array devSeqLengths. The cudnnRNNForward() function does not verify that sequence lengths stored in devSeqLengths in GPU memory are the same as in xDesc and yDesc descriptors in CPU memory. Sequence length arrays from xDesc and yDesc descriptors are checked for consistency, however.

#### **Parameters**

## handle

*Input*. The current cuDNN context handle.

#### rnnDesc

Input. A previously initialized RNN descriptor.

## fwdMode

Input. Specifies inference or training mode (CUDNN\_FWD\_MODE\_INFERENCE and CUDNN\_FWD\_MODE\_TRAINING). In the training mode, additional data is stored in the reserve space buffer. This information is used in the backward pass to compute derivatives.

### devSeqLengths

Input. A copy of seqLengthArray from xDesc or yDesc RNN data descriptor. The devSeqLengths array must be stored in GPU memory as it is accessed asynchronously by

GPU kernels, possibly after the cudnnRNNForward() function exists. This argument cannot be NULL.

#### xDesc

Input. A previously initialized descriptor corresponding to the RNN model primary input. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray must match that of yDesc. The parameter vectorSize must match the inputSize argument passed to the cudnnSetRNNDescriptor v8() function.

x

Input. Data pointer to the GPU memory associated with the RNN data descriptor xDesc. The vectors are expected to be arranged in memory according to the layout specified by xDesc. The elements in the tensor (including padding vectors) must be densely packed.

### yDesc

Input. A previously initialized RNN data descriptor. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray must match that of xDesc. The parameter vectorSize depends on whether LSTM projection is enabled and whether the network is bidirectional. Specifically:

- For unidirectional models, the parameter vectorSize must match the hiddenSize argument passed to <u>cudnnSetRNNDescriptor v8()</u>. If the LSTM projection is enabled, the vectorSize must be the same as the projSize argument passed to <u>cudnnSetRNNDescriptor v8()</u>.
- For bidirectional models, if the RNN cellMode is CUDNN\_LSTM and the projection feature is enabled, the parameter vectorSize must be 2x the projSize argument passed to <u>cudnnSetRNNDescriptor\_v8()</u>. Otherwise, it should be 2x the hiddenSize value.

У

Output. Data pointer to the GPU memory associated with the RNN data descriptor yDesc. The vectors are expected to be laid out in memory according to the layout specified by yDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

#### hDesc

Input. A tensor descriptor describing the initial or final hidden state of RNN. Hidden state data are fully packed. The first dimension of the tensor depends on the dirMode argument passed to the cudnnSetRNNDescriptor v8() function.

- If dirMode is CUDNN\_UNIDIRECTIONAL, then the first dimension should match the numLayers argument passed to <u>cudnnSetRNNDescriptor\_v8()</u>.
- If dirMode is CUDNN\_BIDIRECTIONAL, then the first dimension should be double the numLayers argument passed to <u>cudnnSetRNNDescriptor v8()</u>.

The second dimension must match the batchSize parameter described in xDesc. The third dimension depends on whether RNN mode is CUDNN\_LSTM and whether the LSTM projection is enabled. Specifically:

- If RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the third dimension must match the projSize argument passed to the cudnnSetRNNProjectionLayers() call.
- Otherwise, the third dimension must match the hiddenSize argument passed to the cudnnSetRNNDescriptor v8() call used to initialize rnnDesc.

#### hx

Input. Pointer to the GPU buffer with the RNN initial hidden state. Data dimensions are described by the hdesc tensor descriptor. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

#### hy

Output. Pointer to the GPU buffer where the final RNN hidden state should be stored. Data dimensions are described by the hDesc tensor descriptor. If a NULL pointer is passed, the final hidden state of the network will not be saved.

#### cDesc

Input. For LSTM networks only. A tensor descriptor describing the initial or final cell state for LSTM networks only. Cell state data are fully packed. The first dimension of the tensor depends on the dirMode argument passed to the <u>cudnnSetRNNDescriptor\_v8()</u> call.

- If dirMode is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument passed to <u>cudnnSetRNNDescriptor\_v8()</u>.
- If dirMode is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument passed to cudnnSetRNNDescriptor v8().

The second tensor dimension must match the batchSize parameter in xDesc. The third dimension must match the hiddenSize argument passed to the cudnnSetRNNDescriptor v8() call.

#### СX

Input. For LSTM networks only. Pointer to the GPU buffer with the initial LSTM state data. Data dimensions are described by the cDesc tensor descriptor. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

#### су

Output. For LSTM networks only. Pointer to the GPU buffer where final LSTM state data should be stored. Data dimensions are described by the cDesc tensor descriptor. If a NULL pointer is passed, the final LSTM cell state will not be saved.

#### weightSpaceSize

*Input.* Specifies the size in bytes of the provided weight-space buffer.

#### weightSpace

Input. Address of the weight space buffer in GPU memory.

## workSpaceSize

*Input.* Specifies the size in bytes of the provided workspace buffer.

## workSpace

Input/Output. Address of the workspace buffer in GPU memory to store temporary data.

## reserveSpaceSize

*Input.* Specifies the size in bytes of the reserve-space buffer.

#### reserveSpace

*Input/Output*. Address of the reserve-space buffer in GPU memory.

#### Returns

## CUDNN STATUS SUCCESS

No errors were detected while processing API input arguments and launching GPU kernels.

## CUDNN\_STATUS\_NOT\_SUPPORTED

At least one of the following conditions are met:

- variable sequence length input is passed while CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN RNN ALGO PERSIST DYNAMIC is specified
- CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC is requested on pre-Pascal devices
- the 'double' floating point type is used for input/output and the CUDNN\_RNN\_ALGO\_PERSIST\_STATIC algo

## CUDNN STATUS BAD PARAM

An invalid or incompatible input argument was encountered. For example:

- ▶ some input descriptors are NULL
- at least one of the settings in rnnDesc, xDesc, yDesc, hDesc, or cDesc descriptors is invalid
- weightSpaceSize, workSpaceSize, or reserveSpaceSize is too small

#### CUDNN STATUS EXECUTION FAILED

The process of launching a GPU kernel returned an error, or an earlier kernel did not complete successfully.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate CPU memory.

#### 7.2.37. cudnnRNNForwardInference()

This function has been deprecated in cuDNN 8.0. Use cudnnRNNForward() instead of cudnnRNNForwardInference().

```
cudnnStatus t cudnnRNNForwardInference(
   cudnnHandle t
                                   handle,
   const cudnnRNNDescriptor t
                                   rnnDesc.
   const int
                                   seqLength,
   const cudnnTensorDescriptor t *xDesc,
   const void
                                   *×.
   const cudnnTensorDescriptor t
                                  hxDesc,
                                   *hx,
   const void
   const cudnnTensorDescriptor t
                                   cxDesc,
   const void
                                   *CX,
   const cudnnFilterDescriptor t
                                   wDesc,
   const void
                                   ∗w,
   const cudnnTensorDescriptor t
                                    *yDesc,
   const cudnnTensorDescriptor t
                                   hyDesc,
                                   *hy,
   void
   const cudnnTensorDescriptor t
                                   cyDesc,
                                   *cy,
   void
                                   *workspace,
   void
   size t
                                   workSpaceSizeInBytes)
```

This routine executes the recurrent neural network described by rnnDesc with inputs x, hx, and cx, weights w and outputs y, hy, and cy. workspace is required for intermediate storage. This function does not store intermediate data required for training; cudnnRNNForwardTraining() should be used for that purpose.

## **Parameters**

#### handle

*Input*. Handle to a previously created cuDNN context.

#### rnnDesc

*Input.* A previously initialized RNN descriptor.

#### seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <u>cudnnGetRNNWorkspaceSize()</u> function for querying the workspace size required to execute the RNN.

#### xDesc

Input. An array of seqLength fully packed tensor descriptors. Each descriptor in the array should have three dimensions that describe the input data format to one recurrent iteration (one descriptor per RNN time-step). The first dimension (batch size) of the tensors may decrease from iteration n to iteration n+1 but may not increase. Each tensor descriptor must have the same second dimension (RNN input vector length, inputSize). The third dimension of each tensor should be 1. Input data are expected to be arranged in the column-major order so strides in xDesc should be set as follows:

```
strideA[0]=inputSize, strideA[1]=1, strideA[2]=1
```

x

Input. Data pointer to GPU memory associated with the array of tensor descriptors xDesc. The input vectors are expected to be packed contiguously with the first vector of iteration (time-step) n+1 following directly from the last vector of iteration n. In other words, input vectors for all RNN time-steps should be packed in the contiguous block of GPU memory with no gaps between the vectors.

#### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

#### cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### СX

*Input.* Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor describing the weights for the RNN.

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

## yDesc

Input. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in xDesc.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc. The data are expected to be packed contiguously with the first element of iteration n+1following directly from the last element of iteration n.

## hyDesc

Input. A fully packed tensor descriptor describing the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hy

Output. Data pointer to GPU memory associated with the tensor descriptor hyDesc. If a NULL pointer is passed, the final hidden state of the network will not be saved.

#### cyDesc

Input. A fully packed tensor descriptor describing the final cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### су

Output. Data pointer to GPU memory associated with the tensor descriptor cypesc. If a NULL pointer is passed, the final cell state of the network will not be saved.

#### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

#### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workspace.

## Returns

#### CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

#### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ The descriptor rnnDesc is invalid.
- At least one of the descriptors hxDesc, cxDesc, wDesc, hyDesc, cyDesc or one of the descriptors in xDesc, yDesc is invalid.
- ▶ The descriptors in one of xDesc, hxDesc, cxDesc, wDesc, yDesc, hyDesc, cyDesc have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

## 7.2.38. cudnnRNNForwardInferenceEx()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnRNNForward()</u> instead of cudnnRNNForwardInference().

```
cudnnStatus t cudnnRNNForwardInferenceEx(
   cudnnHandle_t handle,
const cudnnRNNDescriptor t rnnDesc,
   cudnnHandle t
   const cudnnRNNDataDescriptor t xDesc,
    const cudnnTensorDescriptor t hxDesc,
```

```
const void
                                 *hx,
 const cudnnTensorDescriptor t cxDesc,
 const void
                                  *cx,
 const cudnnFilterDescriptor t
                                 wDesc,
 const void
                                 *w,
 const cudnnRNNDataDescriptor t yDesc,
 void
                                  *У,
 const cudnnTensorDescriptor t
                                 hyDesc,
 void
                                 *hy,
 const cudnnTensorDescriptor t cyDesc,
                                 *су,
 const cudnnRNNDataDescriptor t kDesc,
 const void
                                  *kevs,
 const cudnnRNNDataDescriptor t cDesc,
                                  *cAttn,
 const cudnnRNNDataDescriptor t iDesc,
 void
                                 *iAttn,
 const cudnnRNNDataDescriptor t qDesc,
 void
                                  *queries,
                                 *workSpace,
 biov
 size t
                                 workSpaceSizeInBytes)
```

This routine is the extended version of the <u>cudnnRNNForwardInference()</u> function. The cudnnRNNForwardTrainingEx() function allows the user to use an unpacked (padded) layout for input x and output y. In the unpacked layout, each sequence in the mini-batch is considered to be of fixed length, specified by maxSeqLength in its corresponding RNNDataDescriptor. Each fixed-length sequence, for example, the nth sequence in the mini-batch, is composed of a valid segment, specified by the segLengthArray[n] in its corresponding RNNDataDescriptor, and a padding segment to make the combined sequence length equal to maxSeqLength.

With unpacked layout, both sequence major (meaning, time major) and batch major are supported. For backward compatibility, the packed sequence major layout is supported. However, similar to the non-extended function cudnnRNNForwardInference(), the sequences in the mini-batch need to be sorted in descending order according to length.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### rnnDesc

Input. A previously initialized RNN descriptor.

Input. A previously initialized RNN Data descriptor. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray need to match that of yDesc.

x

Input. Data pointer to the GPU memory associated with the RNN data descriptor xDesc. The vectors are expected to be laid out in memory according to the layout specified by xDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

#### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the batchSize parameter described in \*Desc. The third dimension depends on whether RNN mode is CUDNN\_LSTM and whether LSTM projection is enabled. Specifically:

- ▶ If RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the third dimension must match the recProjSize argument passed to <u>cudnnSetRNNProjectionLayers()</u> call used to set rnnDesc.
- Otherwise, the third dimension must match the hiddenSize argument used to initialize rnnDesc.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

#### cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the batchSize parameter in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc.

#### СX

Input. Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

#### yDesc

Input. A previously initialized RNN data descriptor. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray must match that of dyDesc and dxDesc. The parameter vectorSize depends on whether RNN mode is CUDNN\_LSTM and whether LSTM projection is enabled and whether the network is bidirectional. Specifically:

- For unidirectional network, if the RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the parameter vectorSize must match the recProjSize argument passed to <u>cudnnSetRNNProjectionLayers()</u> call used to set rnnDesc. If the network is bidirectional, then multiply the value by 2.
- Otherwise, for a unidirectional network, the parameter vectorSize must match the hiddenSize argument used to initialize rnnDesc. If the network is bidirectional, then multiply the value by 2.

#### У

Output. Data pointer to the GPU memory associated with the RNN data descriptor yDesc. The vectors are expected to be laid out in memory according to the layout specified by yDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

### hyDesc

*Input.* A fully packed tensor descriptor describing the final hidden state of the RNN. The descriptor must be set exactly the same way as hxDesc.

#### hy

Output. Data pointer to GPU memory associated with the tensor descriptor hydesc. If a NULL pointer is passed, the final hidden state of the network will not be saved.

#### cyDesc

*Input.* A fully packed tensor descriptor describing the final cell state for LSTM networks. The descriptor must be set exactly the same way as cxDesc.

### су

Output. Data pointer to GPU memory associated with the tensor descriptor cyDesc. If a NULL pointer is passed, the final cell state of the network will not be saved.

#### kDesc

Reserved. User may pass in NULL.

#### keys

Reserved. Users may pass in NULL.

#### cDesc

Reserved. Users may pass in NULL.

#### cAttn

Reserved. Users may pass in NULL.

#### iDesc

Reserved. Users may pass in NULL.

#### iAttn

Reserved. Users may pass in NULL.

#### qDesc

Reserved. Users may pass in NULL.

#### queries

Reserved. Users may pass in NULL.

#### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

## workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workspace.

### Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN\_STATUS\_NOT\_SUPPORTED

At least one of the following conditions are met:

- ▶ Variable sequence length input is passed in while CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN RNN ALGO PERSIST DYNAMIC is used.
- CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC is used on pre-Pascal devices.
- ▶ Double input/output is used for CUDNN RNN ALGO PERSIST STATIC.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors in xDesc, yDesc, hxDesc, cxDesc, wDesc, hyDesc, cyDesc is invalid, or have incorrect strides or dimensions.
- reserveSpaceSizeInBytes is too small.
- workSpaceSizeInBytes is too small.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN\_STATUS\_ALLOC\_FAILED

The function was unable to allocate memory.

## 7.2.39. cudnnRNNGetClip()

This function has been deprecated in cuDNN 8.0. Use <a href="cudnnRNNGetClip\_v8">cudnnRNNGetClip\_v8</a>() instead of cudnnRNNGetClip().

Retrieves the current LSTM cell clipping parameters, and stores them in the arguments provided.

#### **Parameters**

#### \*clipMode

Output. Pointer to the location where the retrieved clipMode is stored. The clipMode can be CUDNN\_RNN\_CLIP\_NONE in which case no LSTM cell state clipping is being performed; or CUDNN\_RNN\_CLIP\_MINMAX, in which case the cell state activation to other units are being clipped.

## \*lclip, \*rclip

Output. Pointers to the location where the retrieved LSTM cell clipping range [lclip, rclip] is stored.

#### \*clipNanOpt

Output. Pointer to the location where the retrieved clipNanOpt is stored.

#### Returns

#### CUDNN STATUS SUCCESS

The function launched successfully.

#### CUDNN STATUS BAD PARAM

If any of the pointer arguments provided are NULL.

## 7.2.40. cudnnRNNGetClip\_v8()

```
cudnnStatus_t cudnnRNNGetClip_v8(
  cudnnRNNDescriptor_t rnnDesc,
  cudnnRNNClipMode_t *clipMode,
  cudnnNanPropagation_t *clipNanOpt,
  double *lclip,
  double *rclip);
```

Retrieves the current LSTM cell clipping parameters, and stores them in the arguments provided. The user can assign NULL to any pointer except rnnDesc when the retrieved value is not needed. The function does not check the validity of retrieved parameters.

## **Parameters**

#### rnnDesc

*Input.* A previously initialized RNN descriptor.

## clipMode

Output. Pointer to the location where the retrieved <a href="cudnnRNNClipMode\_t">cudnnRNNClipMode\_t</a> value is stored. The <a href="clipMode">clipMode</a> can be <a href="cudnn\_RNN\_CLIP\_NONE">cudnn\_RNN\_CLIP\_NONE</a> in which case no LSTM cell state clipping is being performed; or <a href="cudnn\_RNN\_CLIP\_MINMAX">cudnn\_CLIP\_MINMAX</a>, in which case the cell state activation to other units are being clipped.

## clipNanOpt

Output. Pointer to the location where the retrieved <u>cudnnNanPropagation</u> t value is stored.

#### lclip, rclip

Output. Pointers to the location where the retrieved LSTM cell clipping range [lclip, rclip] is stored.

#### Returns

## CUDNN\_STATUS\_SUCCESS

LSTM clipping parameters were successfully retrieved from the RNN descriptor.

## CUDNN\_STATUS\_BAD\_PARAM

An invalid input argument was found (rnnDesc was NULL).

## 7.2.41. cudnnRNNSetClip()

This function has been deprecated in cuDNN 8.0. Use <a href="cudnnRNNSetClip\_v8">cudnnRNNSetClip\_v8</a>().

Sets the LSTM cell clipping mode. The LSTM clipping is disabled by default. When enabled, clipping is applied to all layers. This cudnnRNNSetClip() function may be called multiple times.

## **Parameters**

#### clipMode

Input. Enables or disables the LSTM cell clipping. When clipMode is set to
CUDNN\_RNN\_CLIP\_NONE no LSTM cell state clipping is performed. When clipMode is
CUDNN\_RNN\_CLIP\_MINMAX the cell state activation to other units is clipped.

#### lclip, rclip

Input. The range [lclip, rclip] to which the LSTM cell clipping should be set.

## clipNanOpt

Input. When set to CUDNN PROPAGATE NAN (see the description for cudnnNanPropagation t), NaN is propagated from the LSTM cell, or it can be set to one of the clipping range boundary values, instead of propagating.

#### Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS BAD PARAM

Returns this value if lclip > rclip; or if either lclip or rclip is NaN.

## 7.2.42. cudnnRNNSetClip\_v8()

```
cudnnStatus_t cudnnRNNSetClip_v8(
cudnnRNNDescriptor t rnnDesc,
cudnnRNNClipMode t clipMode,
cudnnNanPropagation_t clipNanOpt,
double lclip,
double rclip);
```

Sets the LSTM cell clipping mode. The LSTM clipping is disabled by default. When enabled, clipping is applied to all layers. This <u>cudnnRNNSetClip()</u> function does not affect the work, reserve, and weight-space buffer sizes and may be called multiple times.

#### **Parameters**

#### rnnDesc

*Input.* A previously initialized RNN descriptor.

#### clipMode

Input. Enables or disables the LSTM cell clipping. When clipMode is set to CUDNN RNN CLIP NONE no LSTM cell state clipping is performed. When clipMode is CUDNN RNN CLIP MINMAX the cell state activation to other units is clipped.

## clipNanOpt

Input. When set to CUDNN PROPAGATE NAN (see the description for <u>cudnnNanPropagation</u> t), NaN is propagated from the LSTM cell, or it can be set to one of the clipping range boundary values, instead of propagating.

## lclip, rclip

Input. The range [1clip, rclip] to which the LSTM cell clipping should be set.

## Returns

## CUDNN STATUS SUCCESS

The function completed successfully.

## CUDNN\_STATUS\_BAD\_PARAM

An invalid input argument was found, for example:

- rnnDesc Was NULL
- ▶ lclip > rclip
- either lclip or rclip is NaN

## CUDNN STATUS BAD PARAM

The dimensions of the bias tensor refer to an amount of data that is incompatible with the output tensor dimensions or the dataType of the two tensor descriptors are different.

#### CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## 7.2.43. cudnnSetAttnDescriptor()

```
cudnnStatus t cudnnSetAttnDescriptor(
cudnnAttnDescriptor t attnDesc,
unsigned attnMode,
int nHeads,
double smScaler,
cudnnDataType t dataType,
cudnnDataType t computePrec,
cudnnMathType_t mathType,
cudnnDropoutDescriptor t attnDropoutDesc,
cudnnDropoutDescriptor_t postDropoutDesc,
int qSize,
int kSize,
int vSize,
int qProjSize,
 int kProjSize,
int vProjSize,
int oProjSize,
int qoMaxSeqLength,
int kvMaxSeqLength,
 int maxBatchSize,
int maxBeamSize);
```

This function configures a multi-head attention descriptor that was previously created using the <a href="mailto:cudnnCreateAttnDescriptor()">cudnnCreateAttnDescriptor()</a> function. The function sets attention parameters that are necessary to compute internal buffer sizes, dimensions of weight and bias tensors, or to select optimized code paths.

Input sequence data descriptors in cudnnMultiHeadAttnForward(), cudnnMultiHeadAttnBackwardData() and cudnnMultiHeadAttnBackwardWeights() functions are checked against the configuration parameters stored in the attention descriptor. Some parameters must match exactly while max arguments such as maxBatchSize or qoMaxSeqLength establish upper limits for the corresponding dimensions.

The multi-head attention model can be described by the following equations:

$$\mathbf{h}_i = (\mathbf{W}_{V,i}\mathbf{V})$$
 softmax  $(\text{smScaler}(\mathbf{K}^T\mathbf{W}_{K,i}^T)(\mathbf{W}_{Q,i}\mathbf{q}))$ , for  $i = 0 \dots n$ Heads - 1

MultiHeadAttn(
$$\mathbf{q}$$
,  $\mathbf{K}$ ,  $\mathbf{V}$ ,  $\mathbf{W}_Q$ ,  $\mathbf{W}_K$ ,  $\mathbf{W}_V$ ,  $\mathbf{W}_O$ ) =  $\sum_{i=0}^{\text{nHeads-1}} \mathbf{W}_{O,i} \mathbf{h}_i$ 

#### Where:

- ightharpoonup nHeads is the number of independent attention heads that evaluate  $\mathbf{h}_i$  vectors.
- q is a primary input, a single query column vector.
- ▶ **K**, **V** are two matrices of key and value column vectors.

For simplicity, the above equations are presented using a single embedding vector  $\mathbf{q}$  but the API can handle multiple  $\mathbf{q}$  candidates in the beam search scheme, process  $\mathbf{q}$  vectors from multiple sequences bundled into a batch, or automatically iterate through all embedding vectors (time-steps) of a sequence. Thus, in general,  $\mathbf{q}$ ,  $\mathbf{K}$ ,  $\mathbf{V}$  inputs are tensors with additional pieces of information such as the active length of each sequence or how unused padding vectors should be saved.

In some publications,  $\mathbf{W}_{O,i}$  matrices are combined into one output projection matrix and  $\mathbf{h}_i$  vectors are merged explicitly into a single vector. This is an equivalent notation. In the library,  $\mathbf{W}_{O,i}$  matrices are conceptually treated the same way as  $\mathbf{W}_{Q,i}$ ,  $\mathbf{W}_{K,i}$  or  $\mathbf{W}_{V,i}$  input projection weights. See the description of the <u>cudnnGetMultiHeadAttnWeights()</u> function for more details.

Weight matrices  $\mathbf{W}_{Q,i}$ ,  $\mathbf{W}_{K,i}$ ,  $\mathbf{W}_{V,i}$  and  $\mathbf{W}_{O,i}$  play similar roles, adjusting vector lengths in  $\mathbf{q}$ ,  $\mathbf{K}$ ,  $\mathbf{V}$  inputs and in the multi-head attention final output. The user can disable any or all projections by setting  $\mathbf{qProjSize}$ ,  $\mathbf{kProjSize}$ ,  $\mathbf{vProjSize}$  or  $\mathbf{oProjSize}$  arguments to zero.

Embedding vector sizes in  $\mathbf{q}$ ,  $\mathbf{K}$ ,  $\mathbf{V}$  and the vector lengths after projections need to be selected in such a way that matrix multiplications described above are feasible. Otherwise, CUDNN\_STATUS\_BAD\_PARAM is returned by the cudnnSetAttnDescriptor() function. All four weight matrices are used when it is desirable to maintain rank deficiency of  $\mathbf{W}_{KQ,i} = \mathbf{W}_{K,i}^T \mathbf{W}_{Q,i}$  or  $\mathbf{W}_{OV,i} = \mathbf{W}_{O,i} \mathbf{W}_{V,i}$  matrices to eliminate one or more dimensions during linear transformations in each head. This is a form of feature extraction. In such cases, the projected sizes are smaller than the original vector lengths.

For each attention head, weight matrix sizes are defined as follows:

- ▶  $\mathbf{W}_{0,i}$  size [qProjSize x qSize], i = 0.. nHeads 1
- $\mathbf{W}_{K,i}$  size [kProjSize x kSize], i = 0... nHeads 1, kProjSize = qProjSize
- $\mathbf{W}_{V,i}$  size [vProjSize x vSize], i = 0.. nHeads 1
- $\mathbf{W}_{0,i}$  size [oProjSize x (vProjSize > 0? vProjSize : vSize)], i = 0...nHeads-1

When the output projection is disabled (oProjSize = 0), the output vector length is nHeads\* (vProjSize > 0? vProjSize: vSize), meaning, the output is a concatenation of all  $\mathbf{h}_i$  vectors. In the alternative interpretation, a concatenated matrix  $\mathbf{W}_0 = [\mathbf{W}_{0,0}, \mathbf{W}_{0,1}, \mathbf{W}_{0,2}, \dots]$  forms the identity matrix.

Softmax is a normalized, exponential vector function that takes and outputs vectors of the same size. The multi-head attention API utilizes softmax of the CUDNN SOFTMAX ACCURATE type to reduce the likelihood of the floating-point overflow.

The smScaler parameter is the softmax sharpening/smoothing coefficient. When smScaler=1.0, softmax uses the natural exponential function exp(x) or  $2.7183^*$ . When smScaler<1.0, for example smScaler=0.2, the function used by the softmax block will not grow as fast because  $exp(0.2^*x) \approx 1.2214^*$ .

The smScaler parameter can be adjusted to process larger ranges of values fed to softmax. When the range is too large (or smScaler is not sufficiently small for the given range), the output vector of the softmax block becomes categorical, meaning, one vector element is close to 1.0 and other outputs are zero or very close to zero. When this occurs, the Jacobian matrix of the softmax block is also close to zero so deltas are not back-propagated during training from output to input except through residual connections, if these connections are enabled. The user can set smScaler to any positive floating-point value or even zero. The smScaler parameter is not trainable.

The qoMaxSeqLength, kvMaxSeqLength, maxBatchSize, and maxBeamSize arguments declare the maximum sequence lengths, maximum batch size, and maximum beam size respectively, in the cudnnSeqDataDescriptor t containers. The actual dimensions supplied to forward and backward (gradient) API functions should not exceed the max limits. The max arguments should be set carefully because too large values will result in excessive memory usage due to oversized work and reserve space buffers.

The attnMode argument is treated as a binary mask where various on/off options are set. These options can affect the internal buffer sizes, enforce certain argument checks, select optimized code execution paths, or enable attention variants that do not require additional numerical arguments. An example of such options is the inclusion of biases in input and output projections.

The attnDropoutDesc and postDropoutDesc arguments are descriptors that define two dropout layers active in the training mode. The first dropout operation defined by attnDropoutDesc, is applied directly to the softmax output. The second dropout operation, specified by postDropoutDesc, alters the multi-head attention output, just before the point where residual connections are added.



Note: The cudnnSetAttnDescriptor() function performs a shallow copy of attnDropoutDesc and postDropoutDesc, meaning, the addresses of both dropout descriptors are stored in the attention descriptor and not the entire structure. Therefore, the user should keep dropout descriptors during the entire life of the attention descriptor.

#### **Parameters**

### attnDesc

*Output*. Attention descriptor to be configured.

#### attnMode

Input. Enables various attention options that do not require additional numerical values. See the table below for the list of supported flags. The user should assign a preferred set of bitwise OR-ed flags to this argument.

#### nHeads

Input. Number of attention heads.

## smScaler

Input. Softmax smoothing (1.0 >= smScaler >= 0.0) or sharpening (smScaler > 1.0) coefficient. Negative values are not accepted.

#### dataType

Input. Data type used to represent attention inputs, attention weights and attention outputs.

#### computePrec

Input. Compute precision.

### mathType

Input. NVIDIA Tensor Core settings.

## attnDropoutDesc

*Input.* Descriptor of the dropout operation applied to the softmax output. See the table below for a list of unsupported features.

## postDropoutDesc

*Input*. Descriptor of the dropout operation applied to the multi-head attention output, just before the point where residual connections are added. See the table below for a list of unsupported features.

## qSize, kSize, vSize

Input. Q, K, V embedding vector lengths.

#### qProjSize, kProjSize, vProjSize

*Input.* **Q**, **K**, **V** embedding vector lengths after input projections. Use zero to disable the corresponding projection.

#### oProjSize

Input. The  $\mathbf{h}_i$  vector length after the output projection. Use zero to disable this projection.

#### qoMaxSeqLength

Input. Largest sequence length expected in sequence data descriptors related to  $\mathbf{Q}$ ,  $\mathbf{O}$ ,  $\mathbf{dQ}$  and  $\mathbf{dO}$  inputs and outputs.

#### kvMaxSeqLength

Input. Largest sequence length expected in sequence data descriptors related to  $\mathbf{K}$ ,  $\mathbf{V}$ ,  $\mathbf{dK}$  and  $\mathbf{dV}$  inputs and outputs.

#### maxBatchSize

Input. Largest batch size expected in any <u>cudnnSeqDataDescriptor</u> t container.

#### maxBeamSize

*Input.* Largest beam size expected in any <u>cudnnSeqDataDescriptor\_t</u> container.

## Supported attnMode flags

## CUDNN ATTN QUERYMAP ALL TO ONE

Forward declaration of mapping between  $\mathbf{Q}$  and  $\mathbf{K}$ ,  $\mathbf{V}$  vectors when the beam size is greater than one in the  $\mathbf{Q}$  input. Multiple  $\mathbf{Q}$  vectors from the same beam bundle map to the same  $\mathbf{K}$ ,  $\mathbf{V}$  vectors. This means that beam sizes in the  $\mathbf{K}$ ,  $\mathbf{V}$  sets are equal to one.

## CUDNN ATTN QUERYMAP ONE TO ONE

Forward declaration of mapping between  $\mathbf{Q}$  and  $\mathbf{K}$ ,  $\mathbf{V}$  vectors when the beam size is greater than one in the  $\mathbf{Q}$  input. Multiple  $\mathbf{Q}$  vectors from the same beam bundle map to different  $\mathbf{K}$ ,  $\mathbf{V}$  vectors. This requires beam sizes in  $\mathbf{K}$ ,  $\mathbf{V}$  sets to be the same as in the  $\mathbf{Q}$  input.

## CUDNN\_ATTN\_DISABLE\_PROJ\_BIASES

Use no biases in the attention input and output projections.

## CUDNN ATTN ENABLE PROJ BIASES

Use extra biases in the attention input and output projections. In this case the projected  $\overline{\mathbf{K}}$  vectors are computed as  $\overline{\mathbf{K}}_i = \mathbf{W}_{K,i}\mathbf{K} + \mathbf{b}^* [1, 1, ..., 1]_{1\times n}$ , where n is the number of columns in the  $\mathbf{K}$  matrix. In other words, the same column vector  $\mathbf{b}$  is added to all columns of  $\mathbf{K}$  after the weight matrix multiplication.

## Supported combinations of dataType, computePrec, and mathType

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dataType	computePrec	mathType
CUDNN_DATA_DOUBLE	CUDNN_DATA_DOUBLE	CUDNN_DEFAULT_MATH
CUDNN_DATA_FLOAT	CUDNN_DATA_FLOAT	CUDNN_DEFAULT_MATH, CUDNN_TENSOR_OP_MATH_ALLOW_
CUDNN_DATA_HALF	CUDNN_DATA_HALF	CUDNN_DEFAULT_MATH, CUDNN_TENSOR_OP_MATH,
		CUDNN_TENSOR_OP_MATH_ALLOW_

## Unsupported features

- 1. The dropout option is currently not supported by the multi-head attention API. Assign NULL to attnDropoutDesc and postDropoutDesc arguments when configuring the attention descriptor.
- 2. The CUDNN\_ATTN\_ENABLE\_PROJ\_BIASES option is not supported in the multi-head attention gradient functions.
- 3. The paddingFill argument in <u>cudnnSeqDataDescriptor\_t</u> is currently ignored by all multi-head attention functions.

## Returns

## CUDNN\_STATUS\_SUCCESS

The attention descriptor was configured successfully.

## CUDNN\_STATUS\_BAD\_PARAM

An invalid input argument was encountered. Some examples include:

- post projection Q and K sizes were not equal
- dataType, computePrec, or mathType were invalid
- one or more of the following arguments were either negative or zero: nHeads, qSize, kSize, vSize, qoMaxSeqLength, kvMaxSeqLength, maxBatchSize, maxBeamSize
- one or more of the following arguments were negative: qProjSize, kProjSize, vProjSize, smScaler

#### CUDNN STATUS NOT SUPPORTED

A requested option or a combination of input arguments is not supported.

## 7.2.44. cudnnSetPersistentRNNPlan()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus_t cudnnSetPersistentRNNPlan(
    cudnnRNNDescriptor_t rnnDesc,
    cudnnPersistentRNNPlan_t plan)
```

This function sets the persistent RNN plan to be executed when using rnnDesc and CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC algo.

#### Returns

#### CUDNN STATUS SUCCESS

The plan was set successfully.

```
CUDNN STATUS BAD PARAM
```

The algo selected in rnnDesc is not CUDNN RNN ALGO PERSIST DYNAMIC.

## 7.2.45. cudnnSetRNNAlgorithmDescriptor()

This function has been deprecated in cuDNN 8.0.

## 7.2.46. cudnnSetRNNBiasMode()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnSetRNNDescriptor\_v8()</u> instead of cudnnSetRNNBiasMode().

```
cudnnStatus_t cudnnSetRNNBiasMode(
  cudnnRNNDescriptor_t rnnDesc,
  cudnnRNNBiasMode_t biasMode)
```

The cudnnSetRNNBiasMode() function sets the number of bias vectors for a previously created and initialized RNN descriptor. This function should be called to enable the specified bias mode in an RNN. The default value of biasMode in rnnDesc after cudnnCreateRNNDescriptor() is CUDNN RNN DOUBLE BIAS.

#### **Parameters**

#### rnnDesc

*Input/Output.* A previously created RNN descriptor.

#### biasMode

Input. Sets the number of bias vectors. For more information, see <a href="mailto:cudnnRNNBiasMode\_t">cudnnRNNBiasMode\_t</a>.

#### Returns

## CUDNN STATUS BAD PARAM

Either the rnnDesc is NULL or biasMode has an invalid enumerant value.

## CUDNN STATUS SUCCESS

The biasMode was set successfully.

## CUDNN STATUS NOT SUPPORTED

Non-default bias mode (an enumerated type besides CUDNN\_RNN\_DOUBLE\_BIAS) applied to an RNN algo other than CUDNN\_RNN\_ALGO\_STANDARD.

## 7.2.47. cudnnSetRNNDataDescriptor()

This function initializes a previously created RNN data descriptor object. This data structure is intended to support the unpacked (padded) layout for input and output of extended RNN inference and training functions. A packed (unpadded) layout is also supported for backward compatibility.

#### **Parameters**

#### RNNDataDesc

*Input/Output*. A previously created RNN descriptor. For more information, see <u>cudnnRNNDataDescriptor</u> t.

#### dataType

Input. The datatype of the RNN data tensor. For more information, see cudnnDataType t.

#### layout

*Input.* The memory layout of the RNN data tensor.

## maxSeqLength

Input. The maximum sequence length within this RNN data tensor. In the unpacked (padded) layout, this should include the padding vectors in each sequence. In the packed (unpadded) layout, this should be equal to the greatest element in seqLengthArray.

#### batchSize

*Input.* The number of sequences within the mini-batch.

#### vectorSize

*Input*. The vector length (embedding size) of the input or output tensor at each time-step.

### seqLengthArray

Input. An integer array with batchSize number of elements. Describes the length (number of time-steps) of each sequence. Each element in seqLengthArray must be greater than 0 but less than or equal to maxSeqLength. In the packed layout, the elements should be sorted in descending order, similar to the layout required by the non-extended RNN compute functions.

### paddingFill

Input. A user-defined symbol for filling the padding position in RNN output. This is only effective when the descriptor is describing the RNN output, and the unpacked layout is specified. The symbol should be in the host memory, and is interpreted as the same data type as that of the RNN data tensor. If a NULL pointer is passed in, then the padding position in the output will be undefined.

#### Returns

## CUDNN\_STATUS\_SUCCESS

The object was set successfully.

#### CUDNN STATUS NOT SUPPORTED

dataType is not one of CUDNN DATA HALF, CUDNN DATA FLOAT OR CUDNN DATA DOUBLE.

## CUDNN\_STATUS\_BAD\_PARAM

Any one of these have occurred:

- ▶ RNNDataDesc is NULL.
- Any one of maxSeqLength, batchSize or vectorSize is less than or equal to zero.
- An element of seqLengthArray is less than or equal to zero or greater than maxSeqLength.
- Layout is not one of CUDNN\_RNN\_DATA\_LAYOUT\_SEQ\_MAJOR\_UNPACKED,
  CUDNN\_RNN\_DATA\_LAYOUT\_SEQ\_MAJOR\_PACKED or
  CUDNN\_RNN\_DATA\_LAYOUT\_BATCH\_MAJOR\_UNPACKED.

#### CUDNN STATUS ALLOC FAILED

The allocation of internal array storage has failed.

## 7.2.48. cudnnSetRNNDescriptor\_v6()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnSetRNNDescriptor\_v8()</u> instead of cudnnSetRNNDescriptor\_v6().

```
cudnnStatus t cudnnSetRNNDescriptor v6(
cudnnHandle t
                                   handle,
 cudnnRNNDescriptor t
                                   rnnDesc,
                                   hiddenSize,
const int
                                numLayers,
dropoutDesc,
inputMode,
const int
cudnnDropoutDescriptor_t
cudnnRNNInputMode t
 cudnnDirectionMode t
                                  direction,
cudnnRNNMode t
                                   mode,
cudnnRNNAlgo t
                                   algo,
                                   mathPrec)
 cudnnDataType t
```

This function initializes a previously created RNN descriptor object.



**Note:** Larger networks, for example, longer sequences or more layers, are expected to be more efficient than smaller networks.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

Input/Output. A previously created RNN descriptor.

#### hiddenSize

Input. Size of the internal hidden state for each layer.

#### numLayers

*Input.* Number of stacked layers.

#### dropoutDesc

*Input*. Handle to a previously created and initialized dropout descriptor. Dropout will be applied between layers, for example, a single layer network will have no dropout applied.

## inputMode

Input. Specifies the behavior at the input to the first layer

#### direction

Input. Specifies the recurrence pattern, for example, bidirectional.

#### mode

*Input*. Specifies the type of RNN to compute.

#### algo

*Input.* Specifies which RNN algorithm should be used to compute the results.

#### mathPrec

*Input.* Math precision. This parameter is used for controlling the math precision in RNN. The following applies:

- For the input/output in FP16, the parameter mathPrec can be CUDNN\_DATA\_HALF or CUDNN DATA FLOAT.
- For the input/output in FP32, the parameter mathPrec can only be CUDNN DATA FLOAT.
- For the input/output in FP64, double type, the parameter mathPrec can only be CUDNN DATA DOUBLE.

#### Returns

## CUDNN STATUS SUCCESS

The object was set successfully.

## CUDNN\_STATUS\_BAD\_PARAM

Either at least one of the parameters hiddenSize or numLayers was zero or negative, one of inputMode, direction, mode, algo or dataType has an invalid enumerant value, dropoutDesc is an invalid dropout descriptor or rnnDesc has not been created correctly.

# 7.2.49. cudnnSetRNNDescriptor\_v8()

```
cudnnStatus t cudnnSetRNNDescriptor v8(
cudnnRNNDescriptor_t rnnDesc,
 cudnnRNNAlgo_t algo,
 cudnnRNNMode t cellMode,
cudnnRNNBiasMode t biasMode,
cudnnDirectionMode t dirMode,
cudnnRNNInputMode t inputMode,
cudnnDataType_t dataType,
 cudnnDataType t mathPrec,
cudnnMathType t mathType,
 int32 t input\overline{S}ize,
int32 t hiddenSize,
int32_t projSize,
 int32 t numLayers,
    cudnnDropoutDescriptor t dropoutDesc,
    uint32 t auxFlags);
```

This function initializes a previously created RNN descriptor object. The RNN descriptor configured by cudnnSetRNNDescriptor\_v8() was enhanced to store all information needed to compute the total number of adjustable weights/biases in the RNN model.

#### **Parameters**

#### rnnDesc

Input. A previously initialized RNN descriptor.

#### algo

Input. RNN algo (CUDNN\_RNN\_ALGO\_STANDARD, CUDNN\_RNN\_ALGO\_PERSIST\_STATIC, or CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC).

#### cellMode

Input. Specifies the RNN cell type in the entire model (RELU, TANH, LSTM, GRU).

#### biasMode

Input. Sets the number of bias vectors (CUDNN\_RNN\_NO\_BIAS, CUDNN\_RNN\_SINGLE\_INP\_BIAS, CUDNN\_RNN\_SINGLE\_REC\_BIAS, CUDNN\_RNN\_DOUBLE\_BIAS). The two single bias settings are functionally the same for RELU, TANH and LSTM cell types. For differences in GRU cells, see the description of CUDNN\_GRU in the <a href="mailto:cudnnRNNMode\_t">cudnnRNNMode\_t</a> enumerated type.

#### dirMode

Input. Specifies the recurrence pattern: CUDNN\_UNIDIRECTIONAL or CUDNN\_BIDIRECTIONAL. In bidirectional RNNs, the hidden states passed between physical layers are concatenations of forward and backward hidden states.

#### inputMode

Input. Specifies how the input to the RNN model is processed by the first layer. When inputMode is CUDNN\_LINEAR\_INPUT, original input vectors of size inputSize are multiplied by the weight matrix to obtain vectors of hiddenSize. When inputMode is CUDNN\_SKIP\_INPUT, the original input vectors to the first layer are used as is without multiplying them by the weight matrix.

#### dataType

Input. Specifies data type for RNN weights/biases and input and output data.

## mathPrec

*Input*. This parameter is used to control the compute math precision in the RNN model. The following applies:

- For the input/output in FP16, the parameter mathPrec can be CUDNN\_DATA\_HALF or CUDNN\_DATA\_FLOAT.
- For the input/output in FP32, the parameter mathPrec can only be CUDNN DATA FLOAT.
- For the input/output in FP64, double type, the parameter mathPrec can only be CUDNN\_DATA\_DOUBLE.

## mathType

*Input*. Sets the preferred option to use NVIDIA Tensor Cores accelerators on Volta (SM 7.0) or higher GPU-s).

▶ When dataType is CUDNN\_DATA\_HALF, the mathType parameter can be CUDNN\_DEFAULT\_MATH or CUDNN\_TENSOR\_OP\_MATH. The ALLOW\_CONVERSION setting is treated the same CUDNN\_TENSOR\_OP\_MATH for this data type.

- ▶ When dataType is CUDNN\_DATA\_FLOAT, the mathType parameter can be CUDNN\_DEFAULT\_MATH or CUDNN\_TENSOR\_OP\_MATH\_ALLOW\_CONVERSION. When the latter settings are used, original weights and intermediate results will be down-converted to CUDNN\_DATA\_HALF before they are used in another recursive iteration.
- When dataType is CUDNN\_DATA\_DOUBLE, the mathType parameter can be CUDNN DEFAULT MATH.

This option has an advisory status meaning Tensor Cores may not be always utilized, for example, due to specific GEMM dimensions restrictions.

#### inputSize

Input. Size of the input vector in the RNN model. When the inputMode=CUDNN\_SKIP\_INPUT, the inputSize should match the hiddenSize value.

#### hiddenSize

*Input*. Size of the hidden state vector in the RNN model. The same hidden size is used in all RNN layers.

#### projSize

Input. The size of the LSTM cell output after the recurrent projection. This value should not be larger than hiddenSize. It is legal to set projSize equal to hiddenSize, however, in this case, the recurrent projection feature is disabled. The recurrent projection is an additional matrix multiplication in the LSTM cell to project hidden state vectors  $h_t$  into smaller vectors  $r_t = W_r h_t$ , where  $W_r$  is a rectangular matrix with projSize rows and hiddenSize columns. When the recurrent projection is enabled, the output of the LSTM cell (both to the next layer and unrolled in-time) is  $r_t$  instead of  $h_t$ . The recurrent projection can be enabled for LSTM cells and CUDNN RNN ALGO STANDARD only.

#### numLayers

Input. Number of stacked, physical layers in the deep RNN model. When dirMode= CUDNN\_BIDIRECTIONAL, the physical layer consists of two pseudo-layers corresponding to forward and backward directions.

#### dropoutDesc

*Input*. Handle to a previously created and initialized dropout descriptor. Dropout operation will be applied between physical layers. A single layer network will have no dropout applied. Dropout is used in the training mode only.

#### auxFlags

Input. This argument is used to pass miscellaneous switches that do not require additional numerical values to configure the corresponding feature. In future cuDNN releases, this parameter will be used to extend the RNN functionality without adding new API functions (applicable options should be bitwise ORed). Currently, this parameter is used to enable or disable padded input/output (CUDNN\_RNN\_PADDED\_IO\_DISABLED, CUDNN\_RNN\_PADDED\_IO\_ENABLED). When the padded I/O is enabled, layouts CUDNN\_RNN\_DATA\_LAYOUT\_SEQ\_MAJOR\_UNPACKED

and CUDNN\_RNN\_DATA\_LAYOUT\_BATCH\_MAJOR\_UNPACKED are permitted in RNN data descriptors.

#### Returns

#### CUDNN STATUS SUCCESS

The RNN descriptor was configured successfully.

## CUDNN STATUS BAD PARAM

An invalid input argument was detected.

#### CUDNN STATUS NOT SUPPORTED

The dimensions of the bias tensor refer to an amount of data that is incompatible with the output tensor dimensions or the dataType of the two tensor descriptors are different.

## CUDNN STATUS EXECUTION FAILED

An incompatible or unsupported combination of input arguments was detected.

## 7.2.50. cudnnSetRNNMatrixMathType()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnSetRNNDescriptor\_v8()</u> instead of cudnnSetRNNMatrixMathType().

```
cudnnStatus_t cudnnSetRNNMatrixMathType(
    cudnnRNNDescriptor_t rnnDesc,
    cudnnMathType_t mType)
```

This function sets the preferred option to use NVIDIA Tensor Cores accelerators on Volta GPUs (SM 7.0 or higher). When the mType parameter is CUDNN\_TENSOR\_OP\_MATH, inference and training RNN APIs will attempt use Tensor Cores when weights/biases are of type CUDNN\_DATA\_HALF or CUDNN\_DATA\_FLOAT. When RNN weights/biases are stored in the CUDNN\_DATA\_FLOAT format, the original weights and intermediate results will be down-converted to CUDNN\_DATA\_HALF before they are used in another recursive iteration.

#### **Parameters**

#### rnnDesc

*Input.* A previously created and initialized RNN descriptor.

## mType

*Input*. A preferred compute option when performing RNN GEMMs (general matrix-matrix multiplications). This option has an advisory status meaning that Tensor Cores may not be utilized, for example, due to specific GEMM dimensions.

#### Returns

#### CUDNN STATUS SUCCESS

The preferred compute option for the RNN network was set successfully.

#### CUDNN STATUS BAD PARAM

An invalid input parameter was detected.

## 7.2.51. cudnnSetRNNPaddingMode()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnSetRNNDescriptor\_v8()</u> instead of cudnnSetRNNPaddingMode().

```
cudnnStatus_t cudnnSetRNNPaddingMode(
    cudnnRNNDescriptor_t rnnDesc,
    cudnnRNNPaddingMode_t paddingMode)
```

This function enables or disables the padded RNN input/output for a previously created and initialized RNN descriptor. This information is required before calling the <a href="mailto:cudnnGetRNNWorkspaceSize">cudnnGetRNNWorkspaceSize()</a> and <a href="mailto:cudnnGetRNNTrainingReserveSize()">cudnnGetRNNWorkspaceSize()</a> and <a href="mailto:cudnnGetRNNTrainingReserveSize()">cudnnGetRNNWorkspaceSize()</a> and <a href="mailto:cudnnGetRNNTrainingReserveSize()">cudnnGetRNNWorkspaceSize()</a> and <a href="mailto:cudnnGetRNNTrainingReserveSize()">cudnnGetRNNWorkspaceSize()</a> and <a href="mailto:cudnnGetRNNTrainingReserveSize()">cudnnGetRNNTrainingReserveSize()</a> functions, to determine whether additional workspace and training reserve space is needed. By default, the padded RNN input/output is not enabled.

## **Parameters**

#### rnnDesc

Input/Output. A previously created RNN descriptor.

#### paddingMode

*Input*. Enables or disables the padded input/output. For more information, see <a href="cudnnRNNPaddingMode">cudnnRNNPaddingMode</a> t.

#### Returns

#### CUDNN STATUS SUCCESS

The paddingMode was set successfully.

## CUDNN STATUS BAD PARAM

Either the rnnDesc is NULL or paddingMode has an invalid enumerant value.

## 7.2.52. cudnnSetRNNProjectionLayers()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnSetRNNDescriptor\_v8()</u> instead of cudnnSetRNNProjectionLayers().

```
cudnnStatus_t cudnnSetRNNProjectionLayers(
    cudnnHandle_t handle,
    cudnnRNNDescriptor_t rnnDesc,
    int recProjSize,
    int outProjSize)
```

The cudnnSetRNNProjectionLayers () function should be called to enable the recurrent and/or output projection in a recursive neural network. The recurrent projection is an additional matrix multiplication in the LSTM cell to project hidden state vectors  $h_t$  into smaller vectors  $r_t = W_r h_t$ , where  $W_r$  is a rectangular matrix with recProjSize rows and hiddenSize columns. When the recurrent projection is enabled, the output of the LSTM cell (both to the

next layer and unrolled in-time) is r<sub>t</sub> instead of h<sub>t</sub>. The dimensionality of i<sub>t</sub>, f<sub>t</sub>, o<sub>t</sub>, and c<sub>t</sub> vectors used in conjunction with non-linear functions remains the same as in the canonical LSTM cell. To make this possible, the shapes of matrices in the LSTM formulas (see <u>cudnnRNNMode t</u> type), such as W<sub>i</sub> in hidden RNN layers or R<sub>i</sub> in the entire network, become rectangular versus square in the canonical LSTM mode. Obviously, the result of  $R_i^* W_r$  is a square matrix but it is rank deficient, reflecting the compression of LSTM output. The recurrent projection is typically employed when the number of independent (adjustable) weights in the RNN network with projection is smaller in comparison to canonical LSTM for the same hiddenSize value.

The recurrent projection can be enabled for LSTM cells and CUDNN RNN ALGO STANDARD only. The recProjSize parameter should be smaller than the hiddenSize value. It is legal to set recProjSize equal to hiddenSize but in that case the recurrent projection feature is disabled.

The output projection is currently not implemented.

For more information on the recurrent and output RNN projections, see the paper by Hasim Sak, et al.: Long Short-Term Memory Based Recurrent Neural Network Architectures For Large Vocabulary Speech Recognition.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

*Input.* A previously created and initialized RNN descriptor.

#### recProjSize

Input. The size of the LSTM cell output after the recurrent projection. This value should not be larger than hiddenSize.

#### outProjSize

Input. This parameter should be zero.

## Returns

#### CUDNN STATUS SUCCESS

RNN projection parameters were set successfully.

#### CUDNN STATUS BAD PARAM

An invalid input argument was detected (for example, NULL handles, negative values for projection parameters).

## CUDNN STATUS NOT SUPPORTED

Projection applied to RNN algo other than CUDNN RNN ALGO STANDARD, cell type other than CUDNN LSTM, recProjSize larger than hiddenSize.

## 7.2.53. cudnnSetSeqDataDescriptor()

```
cudnnStatus t cudnnSetSeqDataDescriptor(
cudnnSeqDataDescriptor t seqDataDesc,
   cudnnDataType t dataType,
int nbDims,
const int dimA[],
const cudnnSeqDataAxis t axes[],
size t seqLengthArraySize,
const int seqLengthArray[],
void *paddingFill);
```

This function initializes a previously created sequence data descriptor object. In the most simplified view, this descriptor defines dimensions (dimA) and the data layout (axes) of a four-dimensional tensor. All four dimensions of the sequence data descriptor have unique identifiers that can be used to index the dimA[] array:

```
CUDNN SEQDATA TIME DIM
CUDNN SEQDATA BATCH DIM
CUDNN_SEQDATA_BEAM_DIM
CUDNN SEQDATA VECT DIM
```

For example, to express information that vectors in our sequence data buffer are five elements long, we need to assign dimA[CUDNN SEQDATA VECT DIM]=5 in the dimA[] array.

The number of active dimensions in the dimA[] and axes[] arrays is defined by the nbDims argument. Currently, the value of this argument should be four. The actual size of the dimA[] and axes[] arrays should be declared using the CUDNN SEQDATA DIM COUNT macro.

The cudnnSeqDataDescriptor t container is treated as a collection of fixed length vectors that form sequences, similarly to words (vectors of characters) constructing sentences. The TIME dimension spans the sequence length. Different sequences are bundled together in a batch. A BATCH may be a group of individual sequences or beams. A BEAM is a cluster of alternative sequences or candidates. When thinking about the beam, consider a translation task from one language to another. You may want to keep around and experiment with several translated versions of the original sentence before selecting the best one. The number of candidates kept around is the BEAM size.

Every sequence can have a different length, even within the same beam, so vectors toward the end of the sequence can be just padding. The paddingFill argument specifies how the padding vectors should be written in output sequence data buffers. The paddingFill argument points to one value of type dataType that should be copied to all elements in padding vectors. Currently, the only supported value for paddingFill is NULL which means this option should be ignored. In this case, elements of the padding vectors in output buffers will have undefined values.

It is assumed that a non-empty sequence always starts from the time index zero. The seqLengthArray[] must specify all sequence lengths in the container so the total size of this array should be dimA[CUDNN SEQDATA BATCH DIM] \* dimA[CUDNN SEQDATA BEAM DIM]. Each element of the seqLengthArray[] array should have a non-negative value, less than or equal to dimA[CUDNN SEQDATA TIME DIM; the maximum sequence length. Elements in seqLengthArray[] are always arranged in the same batch-major order, meaning, when considering BEAM and BATCH dimensions, BATCH is the outer or the slower changing index

when we traverse the array in ascending order of the addresses. Using a simple example, the seqLengthArray[] array should hold sequence lengths in the following order:

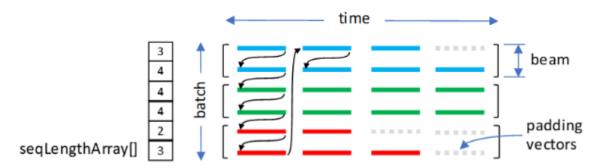
```
{batch idx=0, beam idx=0}
{batch_idx=0, beam_idx=1}
{batch_idx=1, beam_idx=0}
{batch_idx=1, beam_idx=1} {batch_idx=2, beam_idx=0} {batch_idx=2, beam_idx=1}
```

when dimA[CUDNN SEQDATA BATCH DIM]=3 and dimA[CUDNN SEQDATA BEAM DIM]=2.

Data stored in the cudnnSeqDataDescriptor t container must comply with the following constraints:

- ▶ All data is fully packed. There are no unused spaces or gaps between individual vector elements or consecutive vectors.
- ▶ The most inner dimension of the container is the vector. In other words, the first contiguous group of dimA[CUDNN SEQDATA VECT DIM] elements belongs to the first vector, followed by elements of the second vector, and so on.

The axes argument in the cudnnSetSeqDataDescriptor() function is a bit more complicated. This array should have the same capacity as dimA[]. The axes[] array specifies the actual data layout in the GPU memory. In this function, the layout is described in the following way: as we move from one element of a vector to another in memory by incrementing the element pointer, what is the order of VECT, TIME, BATCH, and BEAM dimensions that we encounter. Let us assume that we want to define the following data layout:



that corresponds to tensor dimensions:

```
int dimA[CUDNN SEQDATA DIM COUNT];
dimA[CUDNN SEQDATA TIME DIM] = 4;
dimA[CUDNN SEQDATA BATCH DIM] = 3;
dimA[CUDNN SEQDATA BEAM DIM] = 2;
dimA[CUDNN SEQDATA VECT DIM] = 5;
```

Now, let's initialize the axes[] array. Note that the most inner dimension is described by the last active element of axes[]. There is only one valid configuration here as we always traverse a full vector first. Thus, we need to write CUDNN SEQDATA VECT DIM in the last active element of axes[].

```
cudnnSegDataAxis t axes[CUDNN SEQDATA DIM COUNT];
axes[3] = CUDNN \overline{\text{SEQDATA}} VECT \overline{\text{DIM}}; /\overline{/} 3 = nbDims-1
```

Now, let's work on the remaining three elements of axes[]. When we reach the end of the first vector, we jump to the next beam, therefore:

```
axes[2] = CUDNN SEQDATA BEAM DIM;
```

When we approach the end of the second vector, we move to the next batch, therefore:

```
axes[1] = CUDNN SEQDATA BATCH DIM;
```

The last (outermost) dimension is TIME:

```
axes[0] = CUDNN_SEQDATA_TIME_DIM;
```

The four values of the axes[] array fully describe the data layout depicted in the figure.

The sequence data descriptor allows the user to select 3! = 6 different data layouts or permutations of BEAM, BATCH and TIME dimensions. The multi-head attention API supports all six layouts.

## **Parameters**

#### seqDataDesc

Output. Pointer to a previously created sequence data descriptor.

#### dataType

Input. Data type of the sequence data buffer (CUDNN\_DATA\_HALF, CUDNN\_DATA\_FLOAT or CUDNN\_DATA\_DOUBLE).

#### nbDims

Input. Must be 4. The number of active dimensions in dimA[] and axes[] arrays. Both arrays should be declared to contain at least CUDNN SEQDATA DIM COUNT elements.

#### dimA[]

*Input.* Integer array specifying sequence data dimensions. Use the <u>cudnnSeqDataAxis</u> tenumerated type to index all active dimA[] elements.

## axes[]

Input. Array of <a href="mailto:cudnnSeqDataAxis\_t">cudnnSeqDataAxis\_t</a> that defines the layout of sequence data in memory. The first <a href="mailto:nbDims">nbDims</a> elements of <a href="mailto:axes[]">axes[]</a> and the innermost dimension in <a href="mailto:axes[nbDims-1]">axes[nbDims-1]</a>.

## seqLengthArraySize

Input. Number of elements in the sequence length array, seqLengthArray[].

#### seqLengthArray[]

*Input.* An integer array that defines all sequence lengths of the container.

## paddingFill

Input. Must be NULL. Pointer to a value of dataType that is used to fill up output vectors beyond the valid length of each sequence or NULL to ignore this setting.

## Returns

## CUDNN\_STATUS\_SUCCESS

All input arguments were validated and the sequence data descriptor was successfully updated.

## CUDNN STATUS BAD PARAM

An invalid input argument was found. Some examples include:

- seqDataDesc=NULL
- dateType was not a valid type of <u>cudnnDataType t</u>
- nbDims was negative or zero

- seqLengthArraySize did not match the expected length
- some elements of seqLengthArray[] were invalid

## CUDNN\_STATUS\_NOT\_SUPPORTED

An unsupported input argument was encountered. Some examples include:

- ▶ nbDims is not equal to 4
- paddingFill is not NULL

## CUDNN STATUS ALLOC FAILED

Failed to allocate storage for the sequence data descriptor object.

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# Chapter 8. cudnn\_adv\_train.so Library

## 8.1. Data Type References

## 8.1.1. Enumeration Types

## 8.1.1.1. cudnnLossNormalizationMode\_t

cudnnLossNormalizationMode\_t is an enumerated type that controls the input normalization mode for a loss function. This type can be used with cudnnSetCTCLossDescriptorEx().

### Values

## CUDNN LOSS NORMALIZATION NONE

The input probs of <u>cudnnCTCLoss()</u> function is expected to be the normalized probability, and the output gradients is the gradient of loss with respect to the unnormalized probability.

## CUDNN LOSS NORMALIZATION SOFTMAX

The input probs of <u>cudnnCTCLoss()</u> function is expected to be the unnormalized activation from the previous layer, and the output gradients is the gradient with respect to the activation. Internally the probability is computed by softmax normalization.

## 8.1.1.2. cudnnWgradMode\_t

cudnnWgradMode\_t is an enumerated type that selects how buffers holding gradients of the loss function, computed with respect to trainable parameters, are updated. Currently, this type is used by the <a href="mailto:cudnnGetMultiHeadAttnWeights">cudnnGetMultiHeadAttnWeights</a>() function only.

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## **Values**

## CUDNN WGRAD MODE ADD

A weight gradient component corresponding to a new batch of inputs is added to previously evaluated weight gradients. Before using this mode, the buffer holding weight gradients should be initialized to zero. Alternatively, the first API call outputting to an uninitialized buffer should use the CUDNN WGRAD MODE SET option.

## CUDNN WGRAD MODE SET

A weight gradient component, corresponding to a new batch of inputs, overwrites previously stored weight gradients in the output buffer.

## 8.2. API Functions

## 8.2.1. cudnnAdvTrainVersionCheck()

cudnnStatus\_t cudnnAdvTrainVersionCheck(void)

This function checks whether the version of the AdvTrain subset of the library is consistent with the other sub-libraries.

## Returns

## CUDNN STATUS SUCCESS

The version is consistent with other sub-libraries.

## CUDNN STATUS VERSION MISMATCH

The version of AdvTrain is not consistent with other sub-libraries. Users should check the installation and make sure all sub-component versions are consistent.

## 8.2.2. cudnnCreateCTCLossDescriptor()

cudnnStatus\_t cudnnCreateCTCLossDescriptor(
 cudnnCTCLossDescriptor t\* ctcLossDesc)

This function creates a CTC loss function descriptor.

#### **Parameters**

#### ctcLossDesc

*Output*. CTC loss descriptor to be set. For more information, see cudnnCTCLossDescriptor t.

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## Returns

## CUDNN\_STATUS\_SUCCESS

The function returned successfully.

## CUDNN\_STATUS\_BAD\_PARAM

CTC loss descriptor passed to the function is invalid.

## CUDNN STATUS ALLOC FAILED

Memory allocation for this CTC loss descriptor failed.

## 8.2.3. cudnnCTCLoss()

```
cudnnStatus t cudnnCTCLoss(
   cudnnHandle t
                                          handle,
   const cudnnTensorDescriptor t
                                         probsDesc,
   const void
                                         *probs,
                                         hostLabels[],
   const int
   const int
const int
                                          hostLabelLengths[],
                                         hostInputLengths[],
   void
                                        *costs,
   const cudnnTensorDescriptor_t gradientsDesc,
const void *gradients,
                                        algo,
   cudnnCTCLossAlgo t
   const cudnnCTCLossDescriptor_t
                                         ctcLossDesc,
   void
                                         *workspace,
  size t
                                        *workSpaceSizeInBytes)
```

This function returns the CTC costs and gradients, given the probabilities and labels.



Note: This function can have an inconsistent interface depending on the <a href="mailto:cudnnLossNormalizationMode">cudnnLossNormalizationMode</a> t chosen (bound to the <a href="mailto:cudnnCTCLossDescriptor\_t">cudnnCTCLossDescriptor\_t</a> with <a href="mailto:cudnnSetCTCLossDescriptorEx">cudnnSetCTCLossDescriptorEx</a>()). For the <a href="mailto:cudnn\_loss\_normalization\_none">cudnn\_loss\_normalization\_none</a>, the probs input is probability normalized by softmax, but the gradients output is with respect to the unnormalized activation. However, for <a href="mailto:cudnn\_loss\_normalization\_softmax">cudnn\_loss\_normalization\_softmax</a>, the function has a consistent interface; all values are normalized by softmax.

#### **Parameters**

## handle

*Input*. Handle to a previously created cuDNN context. For more information, see <u>cudnnHandle\_t</u>.

#### probsDesc

*Input*. Handle to the previously initialized probabilities tensor descriptor. For more information, see <u>cudnnTensorDescriptor</u> <u>t</u>.

#### probs

*Input*. Pointer to a previously initialized probabilities tensor. These input probabilities are normalized by softmax.

#### hostLabels

Input. Pointer to a previously initialized labels list, in CPU memory.

## hostLabelLengths

*Input.* Pointer to a previously initialized lengths list in CPU memory, to walk the above labels list.

#### hostInputLengths

*Input.* Pointer to a previously initialized list of the lengths of the timing steps in each batch, in CPU memory.

#### costs

Output. Pointer to the computed costs of CTC.

## gradientsDesc

*Input.* Handle to a previously initialized gradient tensor descriptor.

## gradients

*Output*. Pointer to the computed gradients of CTC. These computed gradient outputs are with respect to the unnormalized activation.

#### algo

*Input.* Enumerant that specifies the chosen CTC loss algorithm. For more information, see <u>cudnnCTCLossAlgo</u> t.

## ctcLossDesc

*Input*. Handle to the previously initialized CTC loss descriptor. For more information, see <u>cudnnCTCLossDescriptor\_t</u>.

### workspace

*Input.* Pointer to GPU memory of a workspace needed to be able to execute the specified algorithm.

#### sizeInBytes

*Input*. Amount of GPU memory needed as workspace to be able to execute the CTC loss computation with the specified algo.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- The dimensions of probsDesc do not match the dimensions of gradientsDesc.
- The inputLengths do not agree with the first dimension of probsDesc.

- ▶ The workSpaceSizeInBytes is not sufficient.
- ▶ The labelLengths is greater than 256.

## CUDNN STATUS NOT SUPPORTED

A compute or data type other than FLOAT was chosen, or an unknown algorithm type was chosen.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

#### 8.2.4. cudnnCTCLoss v8()

```
cudnnStatus t cudnnCTCLoss v8(
   cudnnHandle t
                                       handle,
   cudnnCTCLossAlgo t
                                       algo,
   const cudnnCTCLossDescriptor t
                                      ctcLossDesc,
  const cudnnTensorDescriptor_t
                                      probsDesc,
   const void const int
                                       *probs,
                                       labels[],
   const int
                                      labelLengths[],
   const int
                                       inputLengths[],
   void
                                      *costs,
   const cudnnTensorDescriptor t
                                      gradientsDesc,
          void
                                      *gradients,
   const
                                       *workSpaceSizeInBytes,
   size t
   void
                                       *workspace)
```

This function returns the CTC costs and gradients, given the probabilities and labels. Many CTC API functions were updated in v8 with the v8 suffix to support CUDA graphs. Label and input data is now passed in GPU memory, and <u>cudnnCTCLossDescriptor</u> t should be set using cudnnSetCTCLossDescriptor v8().



Note: This function can have an inconsistent interface depending on the cudnnLossNormalizationMode t chosen (bound to the cudnnCTCLossDescriptor t with cudnnSetCTCLossDescriptorEx()). For the CUDNN LOSS NORMALIZATION NONE, this function has an inconsistent interface, for example, the probs input is probability normalized by softmax, but the gradients output is with respect to the unnormalized activation. However, for CUDNN LOSS NORMALIZATION SOFTMAX, the function has a consistent interface; all values are normalized by softmax.

#### **Parameters**

#### handle

Input. Handle to a previously created cuDNN context. For more information, see cudnnHandle t.

#### algo

Input. Enumerant that specifies the chosen CTC loss algorithm. For more information, see cudnnCTCLossAlgo t.

#### ctcLossDesc

Input. Handle to the previously initialized CTC loss descriptor. To use this v8 function, this descriptor must be set using <u>cudnnSetCTCLossDescriptor</u> v8(). For more information, see cudnnCTCLossDescriptor t.

## probsDesc

Input. Handle to the previously initialized probabilities tensor descriptor. For more information, see cudnnTensorDescriptor t.

## probs

Input. Pointer to a previously initialized probabilities tensor. These input probabilities are normalized by softmax.

#### labels

Input. Pointer to a previously initialized labels list, in GPU memory.

## labelLengths

Input. Pointer to a previously initialized lengths list in GPU memory, to walk the above labels list.

### inputLengths

Input. Pointer to a previously initialized list of the lengths of the timing steps in each batch, in GPU memory.

#### costs

Output. Pointer to the computed costs of CTC.

#### gradientsDesc

*Input.* Handle to a previously initialized gradient tensor descriptor.

## gradients

Output. Pointer to the computed gradients of CTC. These computed gradient outputs are with respect to the unnormalized activation.

#### workspace

Input. Pointer to GPU memory of a workspace needed to be able to execute the specified algorithm.

#### sizeInBytes

Input. Amount of GPU memory needed as a workspace to be able to execute the CTC loss computation with the specified algo.

#### Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ▶ The dimensions of probsDesc do not match the dimensions of gradientsDesc.
- ▶ The inputLengths do not agree with the first dimension of probsDesc.
- ▶ The workSpaceSizeInBytes is not sufficient.
- ▶ The labelLengths is greater than 256.

## CUDNN STATUS NOT SUPPORTED

A compute or data type other than FLOAT was chosen, or an unknown algorithm type was chosen.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## 8.2.5. cudnnDestroyCTCLossDescriptor()

```
cudnnStatus_t cudnnDestroyCTCLossDescriptor(
    cudnnCTCLossDescriptor_t ctcLossDesc)
```

This function destroys a CTC loss function descriptor object.

## **Parameters**

#### ctcLossDesc

Input. CTC loss function descriptor to be destroyed.

#### Returns

#### CUDNN STATUS SUCCESS

The function returned successfully.

## 8.2.6. cudnnFindRNNBackwardDataAlgorithmEx()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnFindRNNBackwardDataAlgorithmEx(
   cudnnHandle t
                                   handle,
   const cudnnRNNDescriptor t
                                    rnnDesc,
                                    seqLength,
   const int
   const cudnnTensorDescriptor t
                                    *yDesc,
   const void
                                     *y,
                                     *dyDesc,
   const cudnnTensorDescriptor t
                                    *dy,
   const void
   const cudnnTensorDescriptor t
                                    dhyDesc,
                                    *dhy,
   const void
   const cudnnTensorDescriptor t
                                    dcyDesc,
   const void
                                    *dcy,
   const cudnnFilterDescriptor t
                                    wDesc,
   const void
   const cudnnTensorDescriptor t
                                    hxDesc,
   const void
```

```
*CX,
const void
const cudnnTensorDescriptor t
                                   *dxDesc,
                                   *dx,
void
const cudnnTensorDescriptor t dhxDesc,
                                   *dhx,
const cudnnTensorDescriptor_t dcxDesc,
void
                                   *dcx,
                                  findIntensity,
const float
const int
int
cudnnAlgorithmPerformance_t
void

const int
requestedAlgoCount,
*returnedAlgoCount,
*perfResults,
*workspace,
size t
                                  workSpaceSizeInBytes,
const void
                                   *reserveSpace,
                                reserveSpaceSizeInBytes)
size t
```

This function attempts all available cuDNN algorithms for <u>cudnnRNNBackwardData()</u>, using user-allocated GPU memory. It outputs the parameters that influence the performance of the algorithm to a user-allocated array of <u>cudnnAlgorithmPerformance\_t</u>. These parameter metrics are written in sorted fashion where the first element has the lowest compute time.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### rnnDesc

Input. A previously initialized RNN descriptor.

## seqLength

*Input*. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <u>cudnnGetRNNWorkspaceSize()</u> function for querying the workspace size required to execute the RNN.

#### yDesc

Input. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in dyDesc.

У

Input. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

#### dyDesc

Input. An array of fully packed tensor descriptors describing the gradient at the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the second dimension of the tensor n in dxDesc.

## dу

*Input*. Data pointer to GPU memory associated with the tensor descriptors in the array dyDesc.

## dhyDesc

*Input*. A fully packed tensor descriptor describing the gradients at the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in dxDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

## dhy

*Input*. Data pointer to GPU memory associated with the tensor descriptor dhyDesc. If a NULL pointer is passed, the gradients at the final hidden state of the network will be initialized to zero.

## dcyDesc

*Input*. A fully packed tensor descriptor describing the gradients at the final cell state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in dxDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

## dcy

*Input*. Data pointer to GPU memory associated with the tensor descriptor dcyDesc. If a NULL pointer is passed, the gradients at the final cell state of the network will be initialized to zero.

#### wDesc

Input. Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

#### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in dxDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hх

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

## cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in dxDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### СX

Input. Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

#### dxDesc

Input. An array of fully packed tensor descriptors describing the gradient at the input of each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

#### dx

Output. Data pointer to GPU memory associated with the tensor descriptors in the array dxDesc.

#### dhxDesc

Input. A fully packed tensor descriptor describing the gradient at the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in dxDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### dhx

Output. Data pointer to GPU memory associated with the tensor descriptor dhxDesc. If a NULL pointer is passed, the gradient at the hidden input of the network will not be set.

### dcxDesc

Input. A fully packed tensor descriptor describing the gradient at the initial cell state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in dxDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### dcx

Output. Data pointer to GPU memory associated with the tensor descriptor dexDesc. If a NULL pointer is passed, the gradient at the cell input of the network will not be set.

## findIntensity

Input. This input was previously unused in versions prior to cuDNN 7.2.0. It is used in cuDNN 7.2.0 and later versions to control the overall runtime of the RNN find algorithms, by selecting the percentage of a large Cartesian product space to be searched.

- ▶ Setting findIntensity within the range (0,1.) will set a percentage of the entire RNN search space to search. When findIntensity is set to 1.0, a full search is performed over all RNN parameters.
- When findIntensity is set to 0.0f, a quick, minimal search is performed. This setting has the best runtime. However, in this case the parameters returned by this function will not correspond to the best performance of the algorithm; a longer search might discover better parameters. This option will execute up to three instances of the configured RNN problem. Runtime will vary proportionally to RNN problem size, as it will in the other cases, hence no guarantee of an explicit time bound can be given.
- Setting findIntensity within the range [-1.,0) sets a percentage of a reduced Cartesian product space to be searched. This reduced search space has been heuristically selected to have good performance. The setting of -1.0 represents a full search over this reduced search space.
- ▶ Values outside the range [-1,1] are truncated to the range [-1,1], and then interpreted as per the above.
- ▶ Setting findIntensity to 1.0 in cuDNN 7.2 and later versions is equivalent to the behavior of this function in versions prior to cuDNN 7.2.0.
- This function times the single RNN executions over large parameter spaces one execution per parameter combination. The times returned by this function are latencies.

### requestedAlgoCount

*Input*. The maximum number of elements to be stored in perfResults.

## returnedAlgoCount

Output. The number of output elements stored in perfResults.

## perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

## workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

#### workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workspace.

#### reserveSpace

Input/Output. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

## Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors dhxDesc, wDesc, hxDesc, cxDesc, dcxDesc, dhyDesc, dcyDesc or one of the descriptors in yDesc, dxdesc, dydesc is invalid.
- ► The descriptors in one of yDesc, dxDesc, dyDesc, dhxDesc, wDesc, hxDesc, cxDesc, dcxDesc, dhyDesc, dcyDesc has incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

## 8.2.7. cudnnFindRNNBackwardWeightsAlgorithmEx()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus_t cudnnFindRNNBackwardWeightsAlgorithmEx(
   cudnnHandle t
                                  handle,
   const cudnnRNNDescriptor t
                                  rnnDesc,
   const int
                                   seqLength,
                                   *xDesc,
   const cudnnTensorDescriptor t
                                    *x,
   const void
   const void
                                   *hx,
                                   *yDesc,
   const cudnnTensorDescriptor t
   const void
const float
                                   *y,
                                   findIntensity,
   const int
                                  requestedAlgoCount,
                                   *returnedAlgoCount,
   cudnnAlgorithmPerformance_t *perfResults,
const void *workspace,
   size t
                                  workSpaceSizeInBytes,
```

This function attempts all available cuDNN algorithms for <u>cudnnRNNBackwardWeights()</u>, using user-allocated GPU memory. It outputs the parameters that influence the performance of the algorithm to a user-allocated array of <u>cudnnAlgorithmPerformance\_t</u>. These parameter metrics are written in sorted fashion where the first element has the lowest compute time.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

#### rnnDesc

*Input*. A previously initialized RNN descriptor.

## seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <a href="mailto:cudnnGetRNNWorkspaceSize">cudnnGetRNNWorkspaceSize</a>[] function for querying the workspace size required to execute the RNN.

#### **x**Desc

Input. An array of fully packed tensor descriptors describing the input to each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

x

*Input.* Data pointer to GPU memory associated with the tensor descriptors in the array xDesc.

### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

## yDesc

*Input*. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in dyDesc.

У

Input. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

## findIntensity

*Input*. This input was previously unused in versions prior to cuDNN 7.2.0. It is used in cuDNN 7.2.0 and later versions to control the overall runtime of the RNN find algorithms, by selecting the percentage of a large Cartesian product space to be searched.

- Setting findIntensity within the range (0,1.) will set a percentage of the entire RNN search space to search. When findIntensity is set to 1.0, a full search is performed over all RNN parameters.
- When findIntensity is set to 0.0f, a quick, minimal search is performed. This setting has the best runtime. However, in this case the parameters returned by this function will not correspond to the best performance of the algorithm; a longer search might discover better parameters. This option will execute up to three instances of the configured RNN problem. Runtime will vary proportionally to RNN problem size, as it will in the other cases, hence no guarantee of an explicit time bound can be given.
- Setting findIntensity within the range [-1.,0] sets a percentage of a reduced Cartesian product space to be searched. This reduced search space has been heuristically selected to have good performance. The setting of -1.0 represents a full search over this reduced search space.
- ▶ Values outside the range [-1,1] are truncated to the range [-1,1], and then interpreted as per the above.
- Setting findIntensity to 1.0 in cuDNN 7.2 and later versions is equivalent to the behavior of this function in versions prior to cuDNN 7.2.0.
- ► This function times the single RNN executions over large parameter spaces one execution per parameter combination. The times returned by this function are latencies.

#### requestedAlgoCount

Input. The maximum number of elements to be stored in perfResults.

## returnedAlgoCount

Output. The number of output elements stored in perfResults.

## perfResults

Output. A user-allocated array to store performance metrics sorted ascending by compute time

#### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

### workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workspace.

#### dwDesc

*Input*. Handle to a previously initialized filter descriptor describing the gradients of the weights for the RNN.

#### dw

Input/Output. Data pointer to GPU memory associated with the filter descriptor dwDesc.

## reserveSpace

Input. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

#### Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

## CUDNN\_STATUS\_BAD\_PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors hxDesc, dwDesc or one of the descriptors in xDesc, yDesc is invalid.
- ► The descriptors in one of xDesc, hxDesc, yDesc, dwDesc have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

## 8.2.8. cudnnFindRNNForwardTrainingAlgorithmEx()

This function has been deprecated in cuDNN 8.0.

```
cudnnStatus t cudnnFindRNNForwardTrainingAlgorithmEx(
   cudnnHandle t
                                   handle,
   const cudnnRNNDescriptor t
                                    rnnDesc
   const int
                                   seqLength,
   const cudnnTensorDescriptor t *xDesc,
   const void
   const cudnnTensorDescriptor t
                                   hxDesc,
   const void
                                   *hx,
   const cudnnTensorDescriptor t
                                   cxDesc.
                                   *cx,
   const void
   const cudnnFilterDescriptor t
                                   wDesc,
                                   *w,
   const void
   const cudnnTensorDescriptor t
                                   *yDesc,
   void
                                   *y,
   const cudnnTensorDescriptor t
                                  hyDesc,
                                   *hy,
   const cudnnTensorDescriptor t cyDesc,
                                   *cy,
   void
   const float
                                  findIntensity,
   const int
                                  requestedAlgoCount,
                                  *returnedAlgoCount,
   cudnnAlgorithmPerformance t
                                  *perfResults,
   void
                                  *workspace,
   size t
                                   workSpaceSizeInBytes,
   void
                                   *reserveSpace,
                                  reserveSpaceSizeInBytes)
```

This function attempts all available cuDNN algorithms for <u>cudnnRNNForwardTraining()</u>, using user-allocated GPU memory. It outputs the parameters that influence the performance of the algorithm to a user-allocated array of <u>cudnnAlgorithmPerformance\_t</u>. These parameter metrics are written in sorted fashion where the first element has the lowest compute time.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN context.

#### rnnDesc

*Input.* A previously initialized RNN descriptor.

#### xDesc

Input. An array of fully packed tensor descriptors describing the input to each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

## seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <u>cudnnGetRNNWorkspaceSize()</u> function for querying the workspace size required to execute the RNN.

x

*Input.* Data pointer to GPU memory associated with the tensor descriptors in the array xDesc.

#### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hx

*Input.* Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

## cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### СX

*Input*. Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

#### wDesc

Input. Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

## yDesc

*Input*. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in xDesc.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

## hyDesc

Input. A fully packed tensor descriptor describing the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hy

Output. Data pointer to GPU memory associated with the tensor descriptor hydesc. If a NULL pointer is passed, the final hidden state of the network will not be saved.

### cyDesc

*Input*. A fully packed tensor descriptor describing the final cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### су

Output. Data pointer to GPU memory associated with the tensor descriptor cyDesc. If a NULL pointer is passed, the final cell state of the network will not be saved.

#### findIntensity

*Input*. This input was previously unused in versions prior to cuDNN 7.2.0. It is used in cuDNN 7.2.0 and later versions to control the overall runtime of the RNN find algorithms, by selecting the percentage of a large Cartesian product space to be searched.

- ▶ Setting findIntensity within the range (0,1.) will set a percentage of the entire RNN search space to search. When findIntensity is set to 1.0, a full search is performed over all RNN parameters.
- When findIntensity is set to 0.0f, a quick, minimal search is performed. This setting has the best runtime. However, in this case the parameters returned by this function will not correspond to the best performance of the algorithm; a longer search might discover better parameters. This option will execute up to three instances of the configured RNN problem. Runtime will vary proportionally to RNN problem size, as it will in the other cases, hence no guarantee of an explicit time bound can be given.
- Setting findIntensity within the range [-1.,0] sets a percentage of a reduced Cartesian product space to be searched. This reduced search space has been heuristically selected to have good performance. The setting of -1.0 represents a full search over this reduced search space.
- ▶ Values outside the range [-1,1] are truncated to the range [-1,1], and then interpreted as per the above.
- Setting findIntensity to 1.0 in cuDNN 7.2 and later versions is equivalent to the behavior of this function in versions prior to cuDNN 7.2.0.
- This function times the single RNN executions over large parameter spaces one execution per parameter combination. The times returned by this function are latencies.

#### requestedAlgoCount

*Input*. The maximum number of elements to be stored in perfResults.

## returnedAlgoCount

*Output*. The number of output elements stored in perfResults.

#### perfResults

*Output*. A user-allocated array to store performance metrics sorted ascending by compute time.

#### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

#### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workspace.

## reserveSpace

Input/Output. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

## Returns

## CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors hxDesc, cxDesc, wDesc, hyDesc, cyDesc or one of the descriptors in xDesc, yDesc is invalid.
- ► The descriptors in one of xDesc, hxDesc, cxDesc, wDesc, yDesc, hyDesc, cyDesc have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

## 8.2.9. cudnnGetCTCLossDescriptor()

```
cudnnStatus_t cudnnGetCTCLossDescriptor(
    cudnnCTCLossDescriptor_t ctcLossDesc,
    cudnnDataType_t* compType)
```

This function returns the configuration of the passed CTC loss function descriptor.

#### **Parameters**

#### ctcLossDesc

Input. CTC loss function descriptor passed, from which to retrieve the configuration.

## compType

Output. Compute type associated with this CTC loss function descriptor.

## Returns

## CUDNN STATUS SUCCESS

The function returned successfully.

## CUDNN\_STATUS\_BAD\_PARAM

Input OpTensor descriptor passed is invalid.

## 8.2.10. cudnnGetCTCLossDescriptorEx()

```
cudnnStatus_t cudnnGetCTCLossDescriptorEx(
    cudnnCTCLossDescriptor_t ctcLossDesc,
    cudnnDataType_t *compType,
    cudnnLossNormalizationMode_t *normMode,
    cudnnNanPropagation_t *gradMode)
```

This function returns the configuration of the passed CTC loss function descriptor.

## **Parameters**

#### ctcLossDesc

Input. CTC loss function descriptor passed, from which to retrieve the configuration.

## compType

Output. Compute type associated with this CTC loss function descriptor.

## normMode

*Output*. Input normalization type for this CTC loss function descriptor. For more information, see <u>cudnnLossNormalizationMode\_t</u>.

#### gradMode

Output. NaN propagation type for this CTC loss function descriptor.

### Returns

## CUDNN STATUS SUCCESS

The function returned successfully.

## CUDNN STATUS BAD PARAM

Input OpTensor descriptor passed is invalid.

## 8.2.11. cudnnGetCTCLossDescriptor v8()

```
cudnnStatus_t cudnnGetCTCLossDescriptor_v8(
    cudnnCTCLossDescriptor_t ctcLossDesc,
    cudnnDataType_t *compType,
    cudnnLossNormalizationMode_t *normMode,
    cudnnNanPropagation_t *gradMode,
    int *maxLabelLength)
```

This function returns the configuration of the passed CTC loss function descriptor.

## **Parameters**

#### ctcLossDesc

Input. CTC loss function descriptor passed, from which to retrieve the configuration.

## compType

Output. Compute type associated with this CTC loss function descriptor.

#### normMode

*Output*. Input normalization type for this CTC loss function descriptor. For more information, see cudnnLossNormalizationMode t.

#### gradMode

Output. NaN propagation type for this CTC loss function descriptor.

## maxLabelLength

Output. The max label length for this CTC loss function descriptor.

#### Returns

## CUDNN STATUS SUCCESS

The function returned successfully.

## CUDNN STATUS BAD PARAM

Input OpTensor descriptor passed is invalid.

## 8.2.12. cudnnGetCTCLossWorkspaceSize()

```
cudnnStatus t cudnnGetCTCLossWorkspaceSize(
   cudnnHandle t
                                        handle,
   const cudnnTensorDescriptor t
                                      probsDesc,
gradientsDesc,
   const cudnnTensorDescriptor t
                                       *labels,
   const int
   const int
                                       *labelLengths,
                                       *inputLengths,
   cudnnCTCLossAlgo t
                                        algo,
   const cudnnCTCLossDescriptor_t
                                       ctcLossDesc,
                                      *sizeInBytes)
   size t
```

This function returns the amount of GPU memory workspace the user needs to allocate to be able to call <u>cudnnCTCLoss()</u> with the specified algorithm. The workspace allocated will then be passed to the routine cudnnCTCLoss().

## **Parameters**

## handle

*Input.* Handle to a previously created cuDNN context.

#### probsDesc

Input. Handle to the previously initialized probabilities tensor descriptor.

#### gradientsDesc

Input. Handle to a previously initialized gradient tensor descriptor.

#### labels

*Input*. Pointer to a previously initialized labels list.

## labelLengths

Input. Pointer to a previously initialized lengths list, to walk the above labels list.

#### inputLengths

Input. Pointer to a previously initialized list of the lengths of the timing steps in each batch.

## algo

Input. Enumerant that specifies the chosen CTC loss algorithm

#### ctcLossDesc

Input. Handle to the previously initialized CTC loss descriptor.

#### sizeInBytes

Output. Amount of GPU memory needed as workspace to be able to execute the CTC loss computation with the specified algo.

## Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- The dimensions of probsDesc do not match the dimensions of gradientsDesc.
- ▶ The inputLengths do not agree with the first dimension of probsDesc.
- ► The workSpaceSizeInBytes is not sufficient.
- ▶ The labelLengths is greater than 256.

## CUDNN STATUS NOT SUPPORTED

A compute or data type other than FLOAT was chosen, or an unknown algorithm type was chosen.

## 8.2.13. cudnnGetCTCLossWorkspaceSize\_v8()

```
cudnnStatus t cudnnGetCTCLossWorkspaceSize v8(
      cudnnHandle t
                                                                 handle,
     cudnnCTCLossAlgo t
                                                                 algo,
     const cudnnTensorDescriptor_t ctcLossDesc,
const cudnnTensorDescriptor_t probsDesc,
const cudnnTensorDescriptor_t gradientsDes
size_t *sizeInBytes*
                                                                 gradientsDesc,
```

This function returns the amount of GPU memory workspace the user needs to allocate to be able to call cudnnCTCLoss v8() with the specified algorithm. The workspace allocated will then be passed to the routine <u>cudnnCTCLoss v8()</u>.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

## algo

*Input*. Enumerant that specifies the chosen CTC loss algorithm.

#### ctcLossDesc

*Input.* Handle to the previously initialized CTC loss descriptor.

## probsDesc

*Input.* Handle to the previously initialized probabilities tensor descriptor.

## gradientsDesc

*Input.* Handle to a previously initialized gradient tensor descriptor.

## sizeInBytes

Output. Amount of GPU memory needed as workspace to be able to execute the CTC loss computation with the specified algo.

## Returns

#### CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

The dimensions of probsDesc do not match the dimensions of gradientsDesc.

## CUDNN STATUS NOT SUPPORTED

A compute or data type other than FLOAT was chosen, or an unknown algorithm type was chosen.

## 8.2.14. cudnnGetRNNTrainingReserveSize()

This function has been deprecated in cuDNN 8.0. Use cudnnGetRNNTempSpaceSizes() instead Of cudnnGetRNNWorkspaceSize().

```
cudnnStatus t cudnnGetRNNTrainingReserveSize(
   cudnnHandle t
                                    handle,
   const cudnnRNNDescriptor_t
                                   rnnDesc,
seqLength,
   const int
   const cudnnTensorDescriptor_t *xDesc,
                                   *sizeInBytes)
   size t
```

This function is used to query the amount of reserved space required for training the RNN described by rnnDesc with input dimensions defined by xDesc. The same reserved space buffer must be passed to <a href="mailto:cudnnRNNForwardTraining">cudnnRNNBackwardData()</a>, and cudnnRNNBackwardWeights(). Each of these calls overwrites the contents of the reserved space, however it can safely be backed up and restored between calls if reuse of the memory is desired.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN library descriptor.

#### rnnDesc

Input. A previously initialized RNN descriptor.

## seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in cudnnGetRNNWorkspaceSize() function for querying the workspace size required to execute the RNN.

#### xDesc

Input. An array of tensor descriptors describing the input to each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

#### sizeInBytes

Output. Minimum amount of GPU memory needed as reserve space to be able to train an RNN with the specified descriptor and input tensors.

### Returns

## CUDNN STATUS SUCCESS

The query was successful.

## CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors in xDesc is invalid.
- The descriptors in xDesc have inconsistent second dimensions, strides or data types.
- The descriptors in xDesc have increasing first dimensions.
- ► The descriptors in xDesc are not fully packed.

## CUDNN STATUS NOT SUPPORTED

The data types in tensors described by xDesc are not supported.

## 8.2.15. cudnnMultiHeadAttnBackwardData()

```
cudnnStatus t cudnnMultiHeadAttnBackwardData(
cudnnHandle t handle,
const cudnnAttnDescriptor t attnDesc,
const int loWinIdx[],
const int hiWinIdx[],
const int devSeqLengthsDQDO[],
const int devSeqLengthsDKDV[],
const cudnnSeqDataDescriptor t doDesc,
const void *dout,
const cudnnSeqDataDescriptor t dqDesc,
void *dqueries,
const void *queries,
const cudnnSeqDataDescriptor t dkDesc,
void *dkeys,
const void *keys,
const cudnnSeqDataDescriptor t dvDesc,
void *dvalues,
const void *values,
size_t weightSizeInBytes,
const void *weights,
size t workSpaceSizeInBytes,
void *workSpace,
size t reserveSpaceSizeInBytes,
void *reserveSpace);
```

This function computes exact, first-order derivatives of the multi-head attention block with respect to its inputs:  $\mathbf{Q}$ ,  $\mathbf{K}$ ,  $\mathbf{V}$ . If  $\mathbf{y} = F(\mathbf{x})$  is a vector-valued function that represents the multihead attention layer and it takes some vector  $x \in \mathbb{R}^n$  as an input (with all other parameters and inputs constant), and outputs vector  $y \in \mathbb{R}^m$ , then cudnnMultiHeadAttnBackwardData() computes the result of  $(\partial y_i/\partial x_j)^T \delta_{\text{out}}$  where  $\delta_{\text{out}}$  is the m×1 gradient of the loss function with respect to multi-head attention outputs. The  $\delta_{
m out}$  gradient is back propagated through prior layers of the deep learning model.  $\partial y_i/\partial x_i$  is the m×n Jacobian matrix of  $F(\mathbf{x})$ . The input is supplied via the dout argument and gradient results for Q, K, V are written to the dqueries, dkeys, and dvalues buffers.

The cudnnMultiHeadAttnBackwardData() function does not output partial derivatives for residual connections because this result is equal to  $\delta_{
m out}$ . If the multi-head attention model enables residual connections sourced directly from  $\mathbf{Q}$ , then the dout tensor needs to be added to agueries to obtain the correct result of the latter. This operation is demonstrated in the cuDNN multiHeadAttention sample code.

The cudnnMultiHeadAttnBackwardData() function must be invoked after cudnnMultiHeadAttnForward(). The lowinIdx[], hiwinIdx[], queries, keys, values, weights, and reserveSpace arguments should be the same as in the cudnnMultiHeadAttnForward() call. devSeqLengthsDQDO[] and devSeqLengthsDKDV[] device arrays should contain the same start and end attention window indices as  ${ t devSeqLengthsQO[]}$  and  ${ t devSeqLengthsKV[]}$  arrays in the forward function invocation.



Note: cudnnMultiHeadAttnBackwardData() does not verify that sequence lengths stored in  ${\tt devSeqLengthsDQDO[]}$  and  ${\tt devSeqLengthsDKDV[]}$  contain the same settings as seqLengthArray[] in the corresponding sequence data descriptor.

#### **Parameters**

## handle

Input. The current context handle.

#### attnDesc

*Input.* A previously initialized attention descriptor.

#### loWinIdx[], hiWinIdx[]

*Input*. Two host integer arrays specifying the start and end indices of the attention window for each **Q** time-step. The start index in **K**, **V** sets is inclusive, and the end index is exclusive.

## devSeqLengthsDQDO[]

*Input.* Device array containing a copy of the sequence length array from the dqDesc or doDesc sequence data descriptor.

### devSeqLengthsDKDV[]

*Input.* Device array containing a copy of the sequence length array from the dkDesc or dvDesc sequence data descriptor.

#### doDesc

Input. Descriptor for the  $\delta_{out}$  gradients (vectors of partial derivatives of the loss function with respect to the multi-head attention outputs).

#### dout

Pointer to  $\delta_{
m out}$  gradient data in the device memory.

#### dqDesc

*Input.* Descriptor for gueries and dqueries sequence data.

### dqueries

Output. Device pointer to gradients of the loss function computed with respect to queries

#### queries

*Input.* Pointer to queries data in the device memory. This is the same input as in cudnnMultiHeadAttnForward().

#### dkDesc

*Input.* Descriptor for keys and dkeys sequence data.

## dkeys

*Output*. Device pointer to gradients of the loss function computed with respect to keys vectors.

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#### kevs

Input. Pointer to keys data in the device memory. This is the same input as in cudnnMultiHeadAttnForward().

#### dvDesc

Input. Descriptor for values and dvalues sequence data.

#### dvalues

Output. Device pointer to gradients of the loss function computed with respect to values vectors.

#### values

Input. Pointer to values data in the device memory. This is the same input as in cudnnMultiHeadAttnForward().

#### weightSizeInBytes

Input. Size of the weight buffer in bytes where all multi-head attention trainable parameters are stored.

## weights

Input. Address of the weight buffer in the device memory.

## workSpaceSizeInBytes

*Input.* Size of the work-space buffer in bytes used for temporary API storage.

## workSpace

*Input/Output*. Address of the work-space buffer in the device memory.

#### reserveSpaceSizeInBytes

Input. Size of the reserve-space buffer in bytes used for data exchange between forward and backward (gradient) API calls.

## reserveSpace

*Input/Output*. Address to the reserve-space buffer in the device memory.

## Returns

## CUDNN STATUS SUCCESS

No errors were detected while processing API input arguments and launching GPU kernels.

## CUDNN STATUS BAD PARAM

An invalid or incompatible input argument was encountered.

## CUDNN\_STATUS\_EXECUTION\_FAILED

The process of launching a GPU kernel returned an error, or an earlier kernel did not complete successfully.

## CUDNN STATUS INTERNAL ERROR

An inconsistent internal state was encountered.

## CUDNN\_STATUS\_NOT\_SUPPORTED

A requested option or a combination of input arguments is not supported.

## CUDNN STATUS ALLOC FAILED

Insufficient amount of shared memory to launch a GPU kernel.

## 8.2.16. cudnnMultiHeadAttnBackwardWeights()

```
cudnnStatus_t cudnnMultiHeadAttnBackwardWeights(
cudnnHandle t handle,
const cudnnAttnDescriptor t attnDesc,
cudnnWgradMode t addGrad,
const cudnnSeqDataDescriptor t qDesc,
const void *queries,
const cudnnSeqDataDescriptor t kDesc,
const void *keys,
const cudnnSeqDataDescriptor t vDesc,
const void *values,
const cudnnSeqDataDescriptor t doDesc,
const void *dout,
size t weightSizeInBytes,
const void *weights,
void *dweights,
size_t workSpaceSizeInBytes,
void *workSpace,
size t reserveSpaceSizeInBytes,
void *reserveSpace);
```

This function computes exact, first-order derivatives of the multi-head attention block with respect to its trainable parameters: projection weights and projection biases. If  $\mathbf{y} = F(\mathbf{w})$  is a vector-valued function that represents the multi-head attention layer and it takes some vector  $x \in \mathbb{R}^n$  of flatten weights or biases as an input (with all other parameters and inputs fixed), and outputs vector  $y \in \mathbb{R}^m$ , then cudnnMultiHeadAttnBackwardWeights () computes the result of  $\left(\partial y_i / \partial x_j\right)^T \delta_{\text{out}}$  where  $\delta_{\text{out}}$  is the  $\mathbf{m} \times \mathbf{1}$  gradient of the loss function with respect to multi-head attention outputs. The  $\delta_{\text{out}}$  gradient is back propagated through prior layers of the deep learning model.  $\partial y_i / \partial x_j$  is the  $\mathbf{m} \times \mathbf{n}$  Jacobian matrix of  $F(\mathbf{w})$ . The  $\delta_{\text{out}}$  input is supplied via the dout argument.

All gradient results with respect to weights and biases are written to the dweights buffer. The size and the organization of the dweights buffer is the same as the weights buffer that holds multi-head attention weights and biases. The cuDNN multiHeadAttention sample code demonstrates how to access those weights.

Gradient of the loss function with respect to weights or biases is typically computed over multiple batches. In such a case, partial results computed for each batch should be summed together. The addGrad argument specifies if the gradients from the current batch should be added to previously computed results or the dweights buffer should be overwritten with the new results.

The cudnnMultiHeadAttnBackwardWeights() function should be invoked after <a href="mailto:cudnnMultiHeadAttnBackwardData">cudnnMultiHeadAttnBackwardData</a>(). The queries, keys, values, weights, and reserveSpace arguments should be the same as in cudnnMultiHeadAttnForward() and

cudnnMultiHeadAttnBackwardData() calls. The dout argument should be the same as in cudnnMultiHeadAttnBackwardData().

## **Parameters**

#### handle

*Input.* The current context handle.

#### attnDesc

*Input.* A previously initialized attention descriptor.

#### addGrad

Input. Weight gradient output mode.

#### qDesc

*Input*. Descriptor for the guery sequence data.

#### queries

Input. Pointer to queries sequence data in the device memory.

#### kDesc

Input. Descriptor for the keys sequence data.

*Input*. Pointer to keys sequence data in the device memory.

### vDesc

Input. Descriptor for the values sequence data.

## values

Input. Pointer to values sequence data in the device memory.

## doDesc

Input. Descriptor for the  $\delta_{
m out}$  gradients (vectors of partial derivatives of the loss function with respect to the multi-head attention outputs).

#### dout

*Input.* Pointer to  $\delta_{\rm out}$  gradient data in the device memory.

## weightSizeInBytes

Input. Size of the weights and dweights buffers in bytes.

## weights

*Input*. Address of the weight buffer in the device memory.

#### dweights

*Output.* Address of the weight gradient buffer in the device memory.

#### workSpaceSizeInBytes

*Input.* Size of the work-space buffer in bytes used for temporary API storage.

#### workSpace

*Input/Output*. Address of the work-space buffer in the device memory.

## reserveSpaceSizeInBytes

Input. Size of the reserve-space buffer in bytes used for data exchange between forward and backward (gradient) API calls.

#### reserveSpace

*Input/Output*. Address to the reserve-space buffer in the device memory.

## Returns

## CUDNN STATUS SUCCESS

No errors were detected while processing API input arguments and launching GPU kernels.

## CUDNN STATUS BAD PARAM

An invalid or incompatible input argument was encountered.

## CUDNN STATUS EXECUTION FAILED

The process of launching a GPU kernel returned an error, or an earlier kernel did not complete successfully.

## CUDNN STATUS INTERNAL ERROR

An inconsistent internal state was encountered.

## CUDNN STATUS NOT SUPPORTED

A requested option or a combination of input arguments is not supported.

#### 8.2.17. cudnnRNNBackwardData()

This function has been deprecated in cuDNN 8.0. Use <u>cudn</u>nRNNBackwardData v8() instead of cudnnRNNBackwardData().

```
cudnnStatus t cudnnRNNBackwardData(
   cudnnHandle t
                               handle,
   const cudnnRNNDescriptor t
                              rnnDesc,
  const int
                               seqLength,
   const cudnnTensorDescriptor t *yDesc,
   const void
   *dy,
   const void
   const cudnnTensorDescriptor t dhyDesc,
                               *dhy,
   const void
   const cudnnTensorDescriptor t
                               dcyDesc,
   const void
                               *dcy,
                               wDesc,
   const cudnnFilterDescriptor t
   const void
                               *w,
   const cudnnTensorDescriptor_t hxDesc,
                               *hx,
   const void
   const cudnnTensorDescriptor t cxDesc,
```

```
const void
const cudnnTensorDescriptor t *dxDesc,
                               *dx,
const cudnnTensorDescriptor_t dhxDesc,
                              *dhx,
const cudnnTensorDescriptor t dcxDesc,
                              *dcx,
void
void
                              *workspace,
size t
                               workSpaceSizeInBytes,
const void
                              *reserveSpace,
                             reserveSpaceSizeInBytes)
size t
```

This routine executes the recurrent neural network described by rnnDesc with output gradients dy, dhy, and dhc, weights w and input gradients dx, dhx, and dcx. workspace is required for intermediate storage. The data in reserveSpace must have previously been generated by <a href="mailto:cudnnRNNForwardTraining">cudnnRNNForwardTraining()</a>. The same reserveSpace data must be used for future calls to <a href="mailto:cudnnRNNBackwardWeights()">cudnnRNNBackwardWeights()</a> if they execute on the same input data.

## **Parameters**

#### handle

Input. Handle to a previously created cuDNN context. For more information , see  $\underline{\text{cudnnHandle }t}$ .

#### rnnDesc

*Input*. A previously initialized RNN descriptor. For more information, see cudnnRNNDescriptor t.

#### seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in the <u>cudnnGetRNNWorkspaceSize()</u> function for querying the workspace size required to execute the RNN.

#### yDesc

Input. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). For more information, see <a href="cudnnTensorDescriptor">cudnnTensorDescriptor</a> t. The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in dyDesc.

У

Input. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

### dyDesc

Input. An array of fully packed tensor descriptors describing the gradient at the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in dxDesc.

## dy

Input. Data pointer to GPU memory associated with the tensor descriptors in the array dvDesc.

## dhyDesc

Input. A fully packed tensor descriptor describing the gradients at the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

## dhy

Input. Data pointer to GPU memory associated with the tensor descriptor dhyDesc. If a NULL pointer is passed, the gradients at the final hidden state of the network will be initialized to zero.

## dcyDesc

Input. A fully packed tensor descriptor describing the gradients at the final cell state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN UNIDIRECTIONAL the first dimension should match the numLayers argument.
- ▶ If direction is CUDNN BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

## dcy

*Input*. Data pointer to GPU memory associated with the tensor descriptor dcyDesc. If a NULL pointer is passed, the gradients at the final cell state of the network will be initialized to zero.

#### wDesc

*Input.* Handle to a previously initialized filter descriptor describing the weights for the RNN. For more information, see cudnnFilterDescriptor t.

w

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the second dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### hx

*Input.* Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

### cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the second dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### СX

Input. Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

### dxDesc

Input. An array of fully packed tensor descriptors describing the gradient at the input of each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

### dx

Output. Data pointer to GPU memory associated with the tensor descriptors in the array dxDesc.

### dhxDesc

Input. A fully packed tensor descriptor describing the gradient at the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### dhx

Output. Data pointer to GPU memory associated with the tensor descriptor dhxDesc. If a NULL pointer is passed, the gradient at the hidden input of the network will not be set.

## dcxDesc

*Input*. A fully packed tensor descriptor describing the gradient at the initial cell state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### dcx

Output. Data pointer to GPU memory associated with the tensor descriptor dexDesc. If a NULL pointer is passed, the gradient at the cell input of the network will not be set.

# workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workspace.

### reserveSpace

Input/Output. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

## Returns

# CUDNN STATUS\_SUCCESS

The function launched successfully.

# CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- The descriptor rnnDesc is invalid.
- At least one of the descriptors dhxDesc, wDesc, hxDesc, cxDesc, dcxDesc, dhyDesc, dcyDesc or one of the descriptors in yDesc, dxdesc, dydesc is invalid.
- The descriptors in one of yDesc, dxDesc, dyDesc, dhxDesc, wDesc, hxDesc, cxDesc, dcxDesc, dhyDesc, dcyDesc has incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

# 8.2.18. cudnnRNNBackwardData\_v8()

```
cudnnStatus_t cudnnRNNBackwardData_v8(
    cudnnHandle_t handle,
    cudnnRNNDescriptor_t rnnDesc,
    const int32_t devSeqLengths[],
    cudnnRNNDataDescriptor_t yDesc,
```

```
const void *y,
 const void *dy,
 cudnnRNNDataDescriptor t xDesc,
 void *dx,
cudnnTensorDescriptor_t hDesc,
const void *hx,
const void *dhy,
void *dhx,
 cudnnTensorDescriptor t cDesc,
 const void *cx,
const void *dcy,
void *dcx,
size_t weightSpaceSize,
 const void *weightSpace,
 size t workSpaceSize,
 void *workSpace,
 size t reserveSpaceSize,
 void *reserveSpace);
```

This function computes exact, first-order derivatives of the RNN model with respect to its inputs: x, hx and for the LSTM cell typealsocx. If  $\mathbf{o} = [\mathbf{y}, \mathbf{hy}, \mathbf{cy}] = F(\mathbf{x}, \mathbf{hx}, \mathbf{cx}) = F(\mathbf{z})$  is a vector-valued function that represents the entire RNN model and it takes vectors  $\mathbf{x}$  (for all time-steps) and vectors  $\mathbf{hx}$ ,  $\mathbf{cx}$  (for all layers) as inputs, concatenated into  $\mathbf{z} \in \mathbb{R}^n$  (network weights and biases are assumed constant), and outputs vectors  $\mathbf{y}$ ,  $\mathbf{hy}$ ,  $\mathbf{cy}$  concatenated into a vector  $\mathbf{o} \in \mathbb{R}^m$ , then cudnnRNNBackwardData\_v8 () computes the result of  $\left(\partial o_i/\partial z_j\right)^T \delta_{\text{out}}$  where  $\delta_{\text{out}}$  is the  $\mathbf{m} \times \mathbf{1}$  gradient of the loss function with respect to all RNN outputs. The  $\delta_{\text{out}}$  gradient is back propagated through prior layers of the deep learning model, starting from the model output.  $\partial o_i/\partial z_j$  is the  $\mathbf{m} \times \mathbf{n}$  Jacobian matrix of  $F(\mathbf{z})$ . The  $\delta_{\text{out}}$  input is supplied via the dy, dhy, and dcy arguments and gradient results  $\left(\partial o_i/\partial z_j\right)^T \delta_{\text{out}}$  are written to the dx, dhx, and dcx buffers.

Locations of x, y, hx, cx, hy, cy, dx, dy, dhx, dcx, dhy, and dcy signals a multi-layer RNN model are shown in the Figure below. Note that internal RNN signals (between time-steps and between layers) are not exposed by the  $cudnnRNNBackwardData\ v8$  () function.

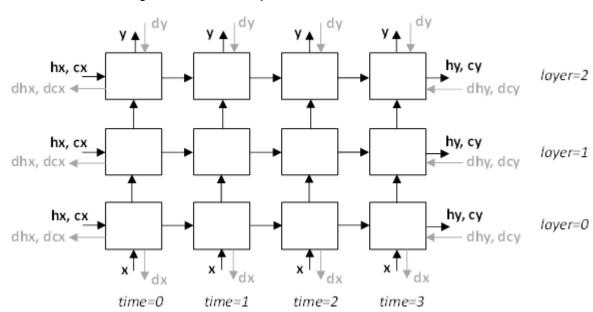


Figure 3. Locations of x, y, hx, cx, hy, cy, dx, dy, dhx, dcx, dhy, and dcy signals a multi-layer RNN model.

Memory addresses to the primary RNN output y, the initial hidden state hx, and the initial cell state cx (for LSTM only) should point to the same data as in the preceding cudnnRNNForward () call. The dy and dx pointers cannot be NULL.

The cudnnRNNBackwardData\_v8() function accepts any combination of dhy, dhx, dcy, dcx buffer addresses being NULL. When dhy or dcy are NULL, it is assumed that those inputs are zero. When dhx or dcx pointers are NULL then the corresponding results are not written by cudnnRNNBackwardData v8().

When all hx, dhy, dhx pointers are NULL, then the corresponding tensor descriptor hDesc can be NULL too. The same rule applies to the cx, dcy, dcx pointers and the cDesc tensor descriptor.

The cudnnRNNBackwardData\_v8 () function allows the user to use padded layouts for inputs y, dy, and output dx. In padded or unpacked layouts (CUDNN\_RNN\_DATA\_LAYOUT\_SEQ\_MAJOR\_UNPACKED, CUDNN\_RNN\_DATA\_LAYOUT\_BATCH\_MAJOR\_UNPACKED) each sequence of vectors in a mini-batch has a fixed length defined by the maxSeqLength argument in the cudnnSetRNNDataDescriptor() function. The term "unpacked" refers here to the presence of padding vectors, and not unused address ranges between contiguous vectors.

Each padded, fixed-length sequence starts from a segment of valid vectors. The valid vector count is stored in seqLengthArray passed to <a href="mailto:cudnnSetRNNDataDescriptor()">cudnnSetRNNDataDescriptor()</a>, such that 0 < seqLengthArray[i] <= <a href="maxSeqLength">maxSeqLength</a> for all sequences in a mini-batch, i.e., for i=0..batchSize-1. The remaining padding vectors make the combined sequence length equal to <a href="maxSeqLength">maxSeqLength</a>. Both sequence-major and batch-major padded layouts are supported.

In addition, a packed sequence-major layout: CUDNN\_RNN\_DATA\_LAYOUT\_SEQ\_MAJOR\_PACKED can be selected by the user. In the latter layout, sequences of vectors in a mini-batch are sorted in the descending order according to the sequence lengths. First, all vectors for time

step zero are stored. They are followed by vectors for time step one, and so on. This layout uses no padding vectors.

The same layout type must be specified in xDesc and yDesc descriptors.

Two host arrays named seqLengthArray in xDesc and yDesc RNN data descriptors must be the same. In addition, a copy of seqLengthArray in the device memory must be passed via the devSeqLengths argument. This array is supplied directly to GPU kernels. The cudnnRNNBackwardData\_v8() function does not verify that sequence lengths stored in devSeqLengths in GPU memory are the same as in xDesc and yDesc descriptors in CPU memory. Sequence length arrays from xDesc and yDesc descriptors are checked for consistency, however.

The cudnnRNNBackwardData\_v8() function must be called after <u>cudnnRNNForward()</u>. The <u>cudnnRNNForward()</u> function should be invoked with the <u>fwdMode</u> argument of type <u>cudnnRNNForward()</u> set to CUDNN FWD MODE TRAINING.

# **Parameters**

### handle

Input. The current cuDNN context handle.

### rnnDesc

Input. A previously initialized RNN descriptor.

## devSeqLengths

Input. A copy of seqLengthArray from xDesc or yDesc RNN data descriptors. The devSeqLengths array must be stored in GPU memory as it is accessed asynchronously by GPU kernels, possibly after the cudnnRNNBackwardData\_v8() function exists. This argument cannot be NULL.

### vDesc

Input. A previously initialized descriptor corresponding to the RNN model primary output. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray need to match that of xDesc.

### y, dy

Input. Data pointers to GPU buffers holding the RNN model primary output and gradient deltas (gradient of the loss function with respect to y). The y output should be produced by the preceding <u>cudnnRNNForward()</u> call. The y and dy vectors are expected to be laid out in memory according to the layout specified by yDesc. The elements in the tensor (including elements in padding vectors) must be densely packed. The y and dy arguments cannot be NILLL.

### xDesc

Input. A previously initialized RNN data descriptor corresponding to the gradient of the loss function with respect to the RNN primary model input. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray must match that of yDesc.

The parameter vectorSize must match the inputSize argument passed to the <u>cudnnSetRNNDescriptor\_v8()</u> function.

### dx

Output. Data pointer to GPU memory where backpropagated gradients of the loss function with respect to the RNN primary input x should be stored. The vectors are expected to be arranged in memory according to the layout specified by xDesc. The elements in the tensor (including padding vectors) must be densely packed. This argument cannot be NULL.

# hDesc

Input. A tensor descriptor describing the initial RNN hidden state hx and gradients of the loss function with respect to the initial of final hidden state. Hidden state data and the corresponding gradients are fully packed. The first dimension of the tensor depends on the dirMode argument passed to the <a href="mailto:cudnnSetRNNDescriptor">cudnnSetRNNDescriptor</a> v8() function.

- If dirMode is CUDNN\_UNIDIRECTIONAL, then the first dimension should match the numLayers argument passed to <u>cudnnSetRNNDescriptor v8()</u>.
- If dirMode is CUDNN\_BIDIRECTIONAL, then the first dimension should be double the numLayers argument passed to <u>cudnnSetRNNDescriptor v8()</u>.

The second dimension must match the batchSize parameter described in xDesc. The third dimension depends on whether RNN mode is CUDNN\_LSTM and whether the LSTM projection is enabled. Specifically:

- If RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the third dimension must match the projSize argument passed to the <u>cudnnSetRNNDescriptor\_v8()</u> call.
- Otherwise, the third dimension must match the hiddenSize argument passed to the cudnnSetRNNDescriptor v8() call used to initialize rnnDesc.

# hx, dhy

Input. Addresses of GPU buffers with the RNN initial hidden state hx and gradient deltas dhy. Data dimensions are described by the hDesc tensor descriptor. If a NULL pointer is passed in hx or dhy arguments, the corresponding buffer is assumed to contain all zeros.

### dhx

Output. Pointer to the GPU buffer where first-order derivatives corresponding to initial hidden state variables should be stored. Data dimensions are described by the hDesc tensor descriptor. If a NULL pointer is assigned to dhx, the backpropagated derivatives are not saved.

## cDesc

Input. For LSTM networks only. A tensor descriptor describing the initial cell state cx and gradients of the loss function with respect to the initial of final cell state. Cell state data are fully packed. The first dimension of the tensor depends on the dirMode argument passed to the cudnnSetRNNDescriptor v8() call.

- If dirMode is CUDNN\_UNIDIRECTIONAL, then the first dimension should match the numLayers argument passed to <u>cudnnSetRNNDescriptor\_v8()</u>.
- If dirMode is CUDNN\_BIDIRECTIONAL, then the first dimension should be double the numLayers argument passed to <u>cudnnSetRNNDescriptor v8()</u>.

The second tensor dimension must match the batchSize parameter in xDesc. The third dimension must match the hiddenSize argument passed to the cudnnSetRNNDescriptor v8() call.

### cx, dcy

Input. For LSTM networks only. Addresses of GPU buffers with the initial LSTM state data and gradient deltas dcy. Data dimensions are described by the cDesc tensor descriptor. If a NULL pointer is passed in cx or dcy arguments, the corresponding buffer is assumed to contain all zeros.

### dcx

Output. For LSTM networks only. Pointer to the GPU buffer where first-order derivatives corresponding to initial LSTM state variables should be stored. Data dimensions are described by the cDesc tensor descriptor. If a NULL pointer is assigned to dcx, the backpropagated derivatives are not saved.

### weightSpaceSize

*Input.* Specifies the size in bytes of the provided weight-space buffer.

### weightSpace

Input. Address of the weight space buffer in GPU memory.

# workSpaceSize

*Input*. Specifies the size in bytes of the provided workspace buffer.

### workSpace

Input/Output. Address of the workspace buffer in GPU memory to store temporary data.

# ${\tt reserveSpaceSize}$

*Input.* Specifies the size in bytes of the reserve-space buffer.

### reserveSpace

*Input/Output.* Address of the reserve-space buffer in GPU memory.

### Returns

### CUDNN STATUS SUCCESS

No errors were detected while processing API input arguments and launching GPU kernels.

# CUDNN STATUS NOT SUPPORTED

At least one of the following conditions are met:

- variable sequence length input is passed while CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN RNN ALGO PERSIST DYNAMIC is specified
- CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC is requested on pre-Pascal devices
- the 'double' floating point type is used for input/output and the CUDNN RNN ALGO PERSIST STATIC algo

# CUDNN\_STATUS\_BAD\_PARAM

An invalid or incompatible input argument was encountered. For example:

- some input descriptors are NULL
- settings in rnnDesc, xDesc, yDesc, hDesc, or cDesc descriptors are invalid
- weightSpaceSize, workSpaceSize, or reserveSpaceSize is too small

# CUDNN\_STATUS\_EXECUTION\_FAILED

The process of launching a GPU kernel returned an error, or an earlier kernel did not complete successfully.

# CUDNN\_STATUS\_ALLOC\_FAILED

The function was unable to allocate CPU memory.

# 8.2.19. cudnnRNNBackwardDataEx()

This function has been deprecated in cuDNN 8.0. Use <u>cudnnRNNBackwardData\_v8</u> instead of cudnnRNNBackwardDataEx().

```
cudnnStatus t cudnnRNNBackwardDataEx(
                                    handle,
   cudnnHandle t
   const cudnnRNNDescriptor t
                                    rnnDesc,
   const cudnnRNNDataDescriptor t
                                    yDesc,
   const void
                                     *y,
   const cudnnRNNDataDescriptor t
                                     dyDesc,
   const void
                                     *dy,
   const cudnnRNNDataDescriptor t dcDesc,
   const void
                                    *dcAttn,
   const cudnnTensorDescriptor t
                                    dhyDesc,
                                     *dhy,
   const void
   const cudnnTensorDescriptor t
                                   dcyDesc,
   const void
                                    *dcy,
   const cudnnFilterDescriptor t
                                    wDesc,
                                     *w,
   const void
   const cudnnTensorDescriptor t
                                    hxDesc,
   const void
                                     *hx,
   const cudnnTensorDescriptor t
                                    cxDesc,
   const void
                                    *cx,
   const cudnnRNNDataDescriptor t
                                    dxDesc,
                                     *dx,
   const cudnnTensorDescriptor t
                                    dhxDesc,
   void
                                     *dhx,
   const cudnnTensorDescriptor t
                                    dcxDesc,
                                     *dcx.
   const cudnnRNNDataDescriptor t
                                    dkDesc,
   void
                                     *dkeys,
   void
                                     *workSpace,
```

size t	workSpaceSizeInBytes,
void	*reserveSpace,
size_t	reserveSpaceSizeInBytes)

This routine is the extended version of the function  $\underline{\text{cudnnRNNBackwardData()}}$ . This function  $\underline{\text{cudnnRNNBackwardDataEx ()}}$  allows the user to use unpacked (padded) layout for input  $\underline{y}$  and output  $\underline{dx}$ .

In the unpacked layout, each sequence in the mini-batch is considered to be of fixed length, specified by maxSeqLength in its corresponding RNNDataDescriptor. Each fixed-length sequence, for example, the nth sequence in the mini-batch, is composed of a valid segment specified by the seqLengthArray[n] in its corresponding RNNDataDescriptor; and a padding segment to make the combined sequence length equal to maxSeqLength.

With the unpacked layout, both sequence major (meaning, time major) and batch major are supported. For backward compatibility, the packed sequence major layout is supported. However, similar to the non-extended function <a href="mailto:cudnnRNNBackwardData">cudnnRNNBackwardData</a>), the sequences in the mini-batch need to be sorted in descending order according to length.

## **Parameters**

### handle

*Input.* Handle to a previously created This function is deprecated starting in cuDNN 8.0.0. context.

### rnnDesc

Input. A previously initialized RNN descriptor.

### yDesc

*Input.* A previously initialized RNN data descriptor. Must match or be the exact same descriptor previously passed into cudnnRNNForwardTrainingEx().

## У

Input. Data pointer to the GPU memory associated with the RNN data descriptor yDesc. The vectors are expected to be laid out in memory according to the layout specified by yDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported. Must contain the exact same data previously produced by  $\underline{\text{cudnnRNNForwardTrainingEx()}}$ .

## dyDesc

Input. A previously initialized RNN data descriptor. The dataType, layout, maxSeqLength, batchSize, vectorSize, and seqLengthArray need to match the yDesc previously passed to cudnnRNNForwardTrainingEx().

### dy

Input. Data pointer to the GPU memory associated with the RNN data descriptor dyDesc. The vectors are expected to be laid out in memory according to the layout specified by dyDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

# dhyDesc

*Input*. A fully packed tensor descriptor describing the gradients at the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc. Additionally:

- ▶ If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the batchSize parameter in xDesc. The third dimension depends on whether the RNN mode is CUDNN\_LSTM and whether LSTM projection is enabled. Additionally:

- ► If the RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the third dimension must match the recProjSize argument passed to <u>cudnnSetRNNProjectionLayers()</u> call used to set rnnDesc.
- Otherwise, the third dimension must match the hiddenSize argument used to initialize rnnDesc.

### dhy

*Input*. Data pointer to GPU memory associated with the tensor descriptor dhyDesc. If a NULL pointer is passed, the gradients at the final hidden state of the network will be initialized to zero.

## dcyDesc

*Input*. A fully packed tensor descriptor describing the gradients at the final cell state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc. Additionally:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

## dcy

Input. Data pointer to GPU memory associated with the tensor descriptor dcyDesc. If a NULL pointer is passed, the gradients at the final cell state of the network will be initialized to zero.

# wDesc

Input. Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

### hxDesc

*Input*. A fully packed tensor descriptor describing the initial hidden state of the RNN. Must match or be the exact same descriptor previously passed into <u>cudnnRNNForwardTrainingEx()</u>.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero. Must contain the exact same data previously passed into  $\underline{\text{cudnnRNNForwardTrainingEx()}}$ , or be NULL if NULL was previously passed to  $\underline{\text{cudnnRNNForwardTrainingEx()}}$ .

### cxDesc

*Input*. A fully packed tensor descriptor describing the initial cell state for LSTM networks. Must match or be the exact same descriptor previously passed into <u>cudnnRNNForwardTrainingEx()</u>.

#### СX

Input. Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero. Must contain the exact same data previously passed into  $\underline{\texttt{cudnnRNNForwardTrainingEx()}}$ , or be NULL if NULL was previously passed to  $\underline{\texttt{cudnnRNNForwardTrainingEx()}}$ .

### dxDesc

Input. A previously initialized RNN data descriptor. The dataType, layout, maxSeqLength, batchSize, vectorSize and seqLengthArray need to match that of xDesc previously passed to <a href="mailto:cudnnRNNForwardTrainingEx(">cudnnRNNForwardTrainingEx()</a>.

### dx

Output. Data pointer to the GPU memory associated with the RNN data descriptor dxDesc. The vectors are expected to be laid out in memory according to the layout specified by dxDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

### dhxDesc

*Input.* A fully packed tensor descriptor describing the gradient at the initial hidden state of the RNN. The descriptor must be set exactly the same way as dhydesc.

### dhx

Output. Data pointer to GPU memory associated with the tensor descriptor dhxDesc. If a NULL pointer is passed, the gradient at the hidden input of the network will not be set.

### dcxDesc

*Input*. A fully packed tensor descriptor describing the gradient at the initial cell state of the RNN. The descriptor must be set exactly the same way as dcyDesc.

### dcx

Output. Data pointer to GPU memory associated with the tensor descriptor dexDesc. If a NULL pointer is passed, the gradient at the cell input of the network will not be set.

### dkDesc

Reserved. User may pass in NULL.

### dkeys

Reserved. User may pass in NULL.

### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

## workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workspace.

### reserveSpace

Input/Output. Data pointer to GPU memory to be used as a reserve space for this call.

# reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

## Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN\_STATUS\_NOT\_SUPPORTED

At least one of the following conditions are met:

- ▶ Variable sequence length input is passed in while CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN RNN ALGO PERSIST DYNAMIC is used.
- CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC is used on pre-Pascal devices.
- ▶ Double input/output is used for CUDNN RNN ALGO PERSIST STATIC.

### CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors yDesc, dxdesc, dydesc, dhxDesc, wDesc, hxDesc, cxDesc, dcxDesc, dcyDesc, dcyDesc is invalid or has incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

## CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

# 8.2.20. cudnnRNNBackwardWeights()

This function has been deprecated in cuDNN 8.0. Use <a href="cudnnRNNBackwardWeights\_v8()">cudnnRNNBackwardWeights\_v8()</a> instead of <a href="cudnnRNNBackwardWeights">cudnnRNNBackwardWeights</a> ().

```
cudnnStatus t cudnnRNNBackwardWeights(
   cudnnHandle t
                               handle,
                              rnnDesc,
   const cudnnRNNDescriptor t
  const int
                               seaLenath,
  const cudnnTensorDescriptor_t *xDesc,
  const void
                               *x,
  const void
  const cudnnTensorDescriptor t *yDesc,
                              *y,
  const void
   const void
                              *workspace,
                               workSpaceSizeInBytes,
   size t
   const cudnnFilterDescriptor t dwDesc,
                              *dw,
   const void
                              *reserveSpace,
                             reserveSpaceSizeInBytes)
  size t
```

This routine accumulates weight gradients dw from the recurrent neural network described by rnnDesc with inputs x, hx and outputs y. The mode of operation in this case is additive, the weight gradients calculated will be added to those already existing in dw. workspace is required for intermediate storage. The data in reserveSpace must have previously been generated by cudnnRNNBackwardData().

# **Parameters**

### handle

*Input*. Handle to a previously created cuDNN context.

### rnnDesc

Input. A previously initialized RNN descriptor.

### seqLength

Input. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <a href="mailto:cudnnGetRNNWorkspaceSize">cudnnGetRNNWorkspaceSize</a>() function for querying the workspace size required to execute the RNN.

### xDesc

Input. An array of fully packed tensor descriptors describing the input to each recurrent iteration (one descriptor per iteration). The first dimension (batch size) of the tensors may decrease from element n to element n+1 but may not increase. Each tensor descriptor must have the same second dimension (vector length).

x

*Input.* Data pointer to GPU memory associated with the tensor descriptors in the array xDesc.

### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

# yDesc

*Input*. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- ▶ If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor  $\tt n$  must match the first dimension of the tensor  $\tt n$  in  $\tt dyDesc.$ 

У

Input. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

### workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

# workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workspace.

### dwDesc

*Input.* Handle to a previously initialized filter descriptor describing the gradients of the weights for the RNN.

### dw

Input/Output. Data pointer to GPU memory associated with the filter descriptor dwDesc.

# reserveSpace

Input. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

## CUDNN STATUS NOT SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors hxDesc, dwDesc or one of the descriptors in xDesc, yDesc is invalid.
- ► The descriptors in one of xDesc, hxDesc, yDesc, dwDesc have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

# 8.2.21. cudnnRNNBackwardWeights v8()

```
cudnnStatus_t cudnnRNNBackwardWeights_v8(
    cudnnHandle_t handle,
    cudnnRNNDescriptor_t rnnDesc,
    cudnnWgradMode_t addGrad,
    const int32_t devSeqLengths[],
    cudnnRNNDataDescriptor_t xDesc,
    const void *x,
    cudnnTensorDescriptor_t hDesc,
    const void *hx,
    cudnnRNNDataDescriptor_t yDesc,
    const void *y,
    size_t weightSpaceSize,
    void *dweightSpace,
    size_t workSpaceSize,
    void *workSpace,
```

```
size_t reserveSpaceSize,
void *reserveSpace);
```

This function computes exact, first-order derivatives of the RNN model with respect to all trainable parameters: weights and biases. If  $\mathbf{o} = [\mathbf{y}, \mathbf{h}\mathbf{y}, \mathbf{c}\mathbf{y}] = F(\mathbf{w})$  is a vector-valued function that represents the multi-layer RNN model and it takes some vector  $\mathbf{w} \in \mathbb{R}^n$  of "flatten" weights or biases as input (with all other data inputs constant), and outputs vector  $\mathbf{o} \in \mathbb{R}^m$ , then cudnnRNNBackwardWeights\_v8() computes the result of  $\left(\partial o_i/\partial w_j\right)^T \delta_{\text{out}}$  where  $\delta_{\text{out}}$  is the  $\mathbf{m} \times \mathbf{1}$  gradient of the loss function with respect to all RNN outputs. The  $\delta_{\text{out}}$  gradient is back propagated through prior layers of the deep learning model, starting from the model output.  $\partial o_i/\partial w_j$  is the  $\mathbf{m} \times \mathbf{n}$  Jacobian matrix of  $F(\mathbf{w})$ . The  $\delta_{\text{out}}$  input is supplied via the dy, dhy, and dcy arguments in the cudnnRNNBackwardData v8() function.

All gradient results  $(\partial o_i/\partial w_j)^T \delta_{\text{out}}$  with respect to weights and biases are written to the dweightSpace buffer. The size and the organization of the dweightSpace buffer is the same as the weightSpace buffer that holds RNN weights and biases.

Gradient of the loss function with respect to weights and biases is typically computed over multiple mini-batches. In such a case, partial results computed for each mini-batch should be aggregated. The addGrad argument specifies if gradients from the current mini-batch should be added to previously computed results (CUDNN\_WGRAD\_MODE\_ADD) or the dweightSpace buffer should be overwritten with the new results (CUDNN\_WGRAD\_MODE\_SET). Currently, the cudnnRNNBackwardWeights\_v8() function supports the CUDNN\_WGRAD\_MODE\_ADD mode only so the dweightSpace buffer should be zeroed by the user before invoking the routine for the first time.

The same sequence lengths must be specified in the xDesc descriptor and in the device array devSeqLengths. The cudnnRNNBackwardWeights\_v8() function should be invoked after cudnnRNNBackwardData().

## **Parameters**

### handle

*Input*. The current cuDNN context handle.

## rnnDesc

Input. A previously initialized RNN descriptor.

### addGrad

Input. Weight gradient output mode. For more details, see the description of the <a href="mailto:cudnnWgradMode\_t">cudnnWgradMode\_t</a> enumerated type. Currently, only the <a href="mailto:cudnnRNNBackwardWeights\_v8">cudnnRNNBackwardWeights\_v8</a> () function.

### devSeqLengths

Input. A copy of seqLengthArray from the xDesc RNN data descriptor. The devSeqLengths array must be stored in GPU memory as it is accessed asynchronously by GPU kernels, possibly after the cudnnRNNBackwardWeights v8() function exists.

### xDesc

Input. A previously initialized descriptor corresponding to the RNN model input data. This is the same RNN data descriptor as used in the preceding <a href="mailto:cudnnRNNBackwardData">cudnnRNNBackwardData</a> v8() calls.

X

Input. Pointer to the GPU buffer with the primary RNN input. The same buffer address x should be provided in prior cudnnRNNForward() and cudnnRNNBackwardData v8() calls.

#### hDesc

Input. A tensor descriptor describing the initial RNN hidden state. Hidden state data are fully packed. This is the same tensor descriptor as used in prior <u>cudnnRNNForward()</u> and cudnnRNNBackwardData v8() calls.

### hx

Input. Pointer to the GPU buffer with the RNN initial hidden state. The same buffer address hx should be provided in prior  $\underline{cudnnRNNForward()}$  and  $\underline{cudnnRNNBackwardData\_v8()}$  calls.

# yDesc

Input. A previously initialized descriptor corresponding to the RNN model output data. This is the same RNN data descriptor as used in prior <u>cudnnRNNForward()</u> and <u>cudnnRNNBackwardData</u> v8() calls.

У

Output. Pointer to the GPU buffer with the primary RNN output as generated by the prior  $\underline{\text{cudnnRNNForward}()}$  call. Data in the  $\underline{y}$  buffer are described by the  $\underline{y}$ Desc descriptor. Elements in the  $\underline{y}$  tensor (including elements in padding vectors) must be densely packed.

# weightSpaceSize

*Input.* Specifies the size in bytes of the provided weight-space buffer.

# dweightSpace

Output. Address of the weight space buffer in GPU memory.

# workSpaceSize

*Input.* Specifies the size in bytes of the provided workspace buffer.

### workSpace

Input/Output. Address of the workspace buffer in GPU memory to store temporary data.

# reserveSpaceSize

*Input.* Specifies the size in bytes of the reserve-space buffer.

### reserveSpace

*Input/Output*. Address of the reserve-space buffer in GPU memory.

# Returns

# CUDNN STATUS SUCCESS

No errors were detected while processing API input arguments and launching GPU kernels.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

An invalid or incompatible input argument was encountered. For example:

- ► some input descriptors are NULL
- settings in rnnDesc, xDesc, yDesc, or hDesc descriptors are invalid
- weightSpaceSize, workSpaceSize, or reserveSpaceSize values are too small
- the addGrad argument is not equal to CUDNN WGRAD MODE ADD

# CUDNN STATUS EXECUTION FAILED

The process of launching a GPU kernel returned an error, or an earlier kernel did not complete successfully.

# CUDNN\_STATUS\_ALLOC\_FAILED

The function was unable to allocate CPU memory.

# 8.2.22. cudnnRNNBackwardWeightsEx()

This function has been deprecated in cuDNN 8.0. Use <a href="cudnnRNNBackwardWeights\_v8(">cudnnRNNBackwardWeights\_v8()</a> instead of <a href="cudnnRNNBackwardWeightsEX">cudnnRNNBackwardWeights\_EX</a> ().

```
cudnnStatus t cudnnRNNBackwardWeightsEx(
   const cudnnRNNDescriptor t rnnDescriptor t
   cudnnHandle t
   const cudnnRNNDescriptor_t
const cudnnRNNDataDescriptor_t
const void
rnnDesc,
xDesc,
*x,
   const void
   const void
                                    *hx,
   const cudnnRNNDataDescriptor_t yDesc,
   const void
                                   *workSpace,
   void
                                    workSpaceSizeInBytes,
   const cudnnFilterDescriptor_t dwDesc,
   void
                                     *dw,
                                     *reserveSpace,
   void
   size t
                                   reserveSpaceSizeInBytes)
```

This routine is the extended version of the function  $\underline{\text{cudnnRNNBackwardWeights[)}}$ . This function  $\underline{\text{cudnnRNNBackwardWeightsEx}}$  () allows the user to use an unpacked (padded) layout for input x and output dw.

In the unpacked layout, each sequence in the mini-batch is considered to be of fixed length, specified by maxSeqLength in its corresponding RNNDataDescriptor. Each fixed-length sequence, for example, the nth sequence in the mini-batch, is composed of a valid segment

specified by the seqLengthArray[n] in its corresponding RNNDataDescriptor; and a padding segment to make the combined sequence length equal to maxSeqLength.

With the unpacked layout, both sequence major (meaning, time major) and batch major are supported. For backward compatibility, the packed sequence major layout is supported. However, similar to the non-extended function <a href="mailto:cudnnRNNBackwardWeights">cudnnRNNBackwardWeights</a>(), the sequences in the mini-batch need to be sorted in descending order according to length.

# **Parameters**

#### handle

*Input*. Handle to a previously created cuDNN context.

### rnnDesc

Input. A previously initialized RNN descriptor.

### **x**Desc

*Input.* A previously initialized RNN data descriptor. Must match or be the exact same descriptor previously passed into <u>cudnnRNNForwardTrainingEx()</u>.

x

Input. Data pointer to GPU memory associated with the tensor descriptors in the array xDesc. Must contain the exact same data previously passed into cudnnRNNForwardTrainingEx().

## hxDesc

*Input*. A fully packed tensor descriptor describing the initial hidden state of the RNN. Must match or be the exact same descriptor previously passed into cudnnRNNForwardTrainingEx().

## hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero. Must contain the exact same data previously passed into  $\underline{\text{cudnnRNNForwardTrainingEx()}}$ , or be NULL if NULL was previously passed to  $\underline{\text{cudnnRNNForwardTrainingEx()}}$ .

# yDesc

Input. A previously initialized RNN data descriptor. Must match or be the exact same descriptor previously passed into  $\underline{\operatorname{cudnnRNNForwardTrainingEx()}}$ .

У

Input. Data pointer to GPU memory associated with the output tensor descriptor yDesc. Must contain the exact same data previously produced by  $\underline{cudnnRNNForwardTrainingEx[]}$ .

## workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

### workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workspace.

# dwDesc

*Input*. Handle to a previously initialized filter descriptor describing the gradients of the weights for the RNN.

### dw

Input/Output. Data pointer to GPU memory associated with the filter descriptor dwDesc.

### reserveSpace

Input. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

## Returns

# CUDNN\_STATUS\_SUCCESS

The function launched successfully.

# CUDNN\_STATUS\_NOT\_SUPPORTED

The function does not support the provided configuration.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors xDesc, yDesc, hxDesc, dwDesc is invalid, or has incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

# 8.2.23. cudnnRNNForwardTraining()

This function is deprecated starting in cuDNN 8.0.0.

Use cudnnRNNForward() instead of cudnnRNNForwardTraining().

```
cudnnStatus_t cudnnRNNForwardTraining(
    cudnnHandle_t handle,
    const cudnnRNNDescriptor_t rnnDesc,
    const int seqLength,
    const cudnnTensorDescriptor t *xDesc,
```

```
const void
                               hxDesc,
const cudnnTensorDescriptor t
const void
                                *hx,
const cudnnTensorDescriptor t
                                cxDesc,
const void
                                *CX,
const cudnnFilterDescriptor t
                               wDesc.
const void
                                *w,
const cudnnTensorDescriptor t
                               *yDesc,
void
                                *У,
const cudnnTensorDescriptor t hyDesc,
                               *hy,
const cudnnTensorDescriptor t
                               cyDesc,
                                *cy,
void
void
                                *workspace,
                                workSpaceSizeInBytes,
size t
                               *reserveSpace,
void
size t
                               reserveSpaceSizeInBytes)
```

This routine executes the recurrent neural network described by rnnDesc with inputs x, hx, and cx, weights w and outputs y, hy, and cy. workspace is required for intermediate storage. reserveSpace stores data required for training. The same reserveSpace data must be used for future calls to  $\underline{cudnnRNNBackwardData()}$  and  $\underline{cudnnRNNBackwardWeights()}$  if these execute on the same input data.

## **Parameters**

#### handle

*Input.* Handle to a previously created cuDNN context.

### rnnDesc

*Input.* A previously initialized RNN descriptor.

### seqLength

*Input*. Number of iterations to unroll over. The value of this seqLength must not exceed the value that was used in <u>cudnnGetRNNWorkspaceSize()</u> function for querying the workspace size required to execute the RNN.

## xDesc

Input. An array of seqLength fully packed tensor descriptors. Each descriptor in the array should have three dimensions that describe the input data format to one recurrent iteration (one descriptor per RNN time-step). The first dimension (batch size) of the tensors may decrease from iteration element n to iteration element n+1 but may not increase. Each tensor descriptor must have the same second dimension (RNN input vector length, inputSize). The third dimension of each tensor should be 1. Input vectors are expected to be arranged in the column-major order so strides in xDesc should be set as follows: strideA[0]=inputSize, strideA[1]=1, strideA[2]=1

x

Input. Data pointer to GPU memory associated with the array of tensor descriptors xDesc. The input vectors are expected to be packed contiguously with the first vector of iterations (time-step) n+1 following directly the last vector of iteration n. In other words, input vectors

for all RNN time-steps should be packed in the contiguous block of GPU memory with no gaps between the vectors.

### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

### cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### СX

Input. Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

### wDesc

*Input*. Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

### yDesc

Input. An array of fully packed tensor descriptors describing the output from each recurrent iteration (one descriptor per iteration). The second dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the second dimension should match the hiddenSize argument.
- If direction is CUDNN\_BIDIRECTIONAL the second dimension should match double the hiddenSize argument.

The first dimension of the tensor n must match the first dimension of the tensor n in xDesc.

У

Output. Data pointer to GPU memory associated with the output tensor descriptor yDesc.

# hyDesc

*Input*. A fully packed tensor descriptor describing the final hidden state of the RNN. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### hy

Output. Data pointer to GPU memory associated with the tensor descriptor hydesc. If a NULL pointer is passed, the final hidden state of the network will not be saved.

# cyDesc

Input. A fully packed tensor descriptor describing the final cell state for LSTM networks. The first dimension of the tensor depends on the direction argument used to initialize rnnDesc:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### су

Output. Data pointer to GPU memory associated with the tensor descriptor cyDesc. If a NULL pointer is passed, the final cell state of the network will not be saved.

# workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

### workSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided workspace.

### reserveSpace

Input/Output. Data pointer to GPU memory to be used as a reserve space for this call.

## reserveSpaceSizeInBytes

*Input.* Specifies the size in bytes of the provided reserveSpace.

## Returns

# CUDNN\_STATUS\_SUCCESS

The function launched successfully.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

- ► The descriptor rnnDesc is invalid.
- At least one of the descriptors hxDesc, cxDesc, wDesc, hyDesc, cyDesc or one of the descriptors in xDesc, yDesc is invalid.
- The descriptors in one of xDesc, hxDesc, cxDesc, wDesc, yDesc, hyDesc, cyDesc have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

# CUDNN\_STATUS\_ALLOC\_FAILED

The function was unable to allocate memory.

# 8.2.24. cudnnRNNForwardTrainingEx()

This function has been deprecated starting in cuDNN 8.0. Use <a href="mailto:cudnnRNNForward(">cudnnRNNForward()</a> instead of cudnnRNNForwardTrainingEx ().

```
const cudnnTensorDescriptor t
                                   hxDesc,
const void
                                     *hx.
const cudnnTensorDescriptor t
                                     cxDesc,
const void
                                      *cx,
const cudnnFilterDescriptor t
                                    wDesc.
const void
const cudnnRNNDataDescriptor t
                                    yDesc,
                                      *У,
                                     hyDesc,
const cudnnTensorDescriptor t
                                     *hy,
void
const cudnnTensorDescriptor t
                                     cyDesc,
void
                                     *су,
const cudnnRNNDataDescriptor t
                                     kDesc,
const void
                                     *kevs,
const cudnnRNNDataDescriptor t
                                     cDesc,
                                     *cAttn,
const cudnnRNNDataDescriptor t
                                    iDesc,
                                     *iAttn,
const cudnnRNNDataDescriptor t
                                     qDesc,
                                      *queries,
void
                                     *workSpace,
void
size t
                                     workSpaceSizeInBytes,
                                     *reserveSpace,
void
size t
                                     reserveSpaceSizeInBytes);
```

This routine is the extended version of the  $\underline{\text{cudnnRNNForwardTraining()}}$  function. The  $\underline{\text{cudnnRNNForwardTrainingEx ()}}$  allows the user to use unpacked (padded) layout for input x and output y.

In the unpacked layout, each sequence in the mini-batch is considered to be of fixed length, specified by maxSeqLength in its corresponding RNNDataDescriptor. Each fixed-length sequence, for example, the nth sequence in the mini-batch, is composed of a valid segment specified by the seqLengthArray[n] in its corresponding RNNDataDescriptor; and a padding segment to make the combined sequence length equal to maxSeqLength.

With the unpacked layout, both sequence major (meaning, time major) and batch major are supported. For backward compatibility, the packed sequence major layout is supported. However, similar to the non-extended function <a href="mailto:cudnnRNNForwardTraining()">cudnnRNNForwardTraining()</a>, the sequences in the mini-batch need to be sorted in descending order according to length.

# **Parameters**

### handle

*Input.* Handle to a previously created cuDNN context.

## rnnDesc

*Input.* A previously initialized RNN descriptor.

### xDesc

Input. A previously initialized RNN Data descriptor. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray need to match that of yDesc.

x

Input. Data pointer to the GPU memory associated with the RNN data descriptor xDesc. The input vectors are expected to be laid out in memory according to the layout specified

by xDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

### hxDesc

Input. A fully packed tensor descriptor describing the initial hidden state of the RNN.

The first dimension of the tensor depends on the direction argument used to initialize rnnDesc. Moreover:

- If direction is CUDNN\_UNIDIRECTIONAL then the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL then the first dimension should match double the numLayers argument.

The second dimension must match the batchSize parameter in xDesc. The third dimension depends on whether RNN mode is CUDNN\_LSTM and whether LSTM projection is enabled. Additionally:

- ▶ If RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the third dimension must match the recProjSize argument passed to <u>cudnnSetRNNProjectionLayers()</u> call used to set rnnDesc.
- Otherwise, the third dimension must match the hiddenSize argument used to initialize rnnDesc.

#### hx

Input. Data pointer to GPU memory associated with the tensor descriptor hxDesc. If a NULL pointer is passed, the initial hidden state of the network will be initialized to zero.

# cxDesc

Input. A fully packed tensor descriptor describing the initial cell state for LSTM networks.

The first dimension of the tensor depends on the direction argument used to initialize rnnDesc. Additionally:

- If direction is CUDNN\_UNIDIRECTIONAL the first dimension should match the numLayers argument.
- If direction is CUDNN\_BIDIRECTIONAL the first dimension should match double the numLayers argument.

The second dimension must match the first dimension of the tensors described in xDesc. The third dimension must match the hiddenSize argument used to initialize rnnDesc. The tensor must be fully packed.

### СX

*Input.* Data pointer to GPU memory associated with the tensor descriptor cxDesc. If a NULL pointer is passed, the initial cell state of the network will be initialized to zero.

### wDesc

*Input.* Handle to a previously initialized filter descriptor describing the weights for the RNN.

W

Input. Data pointer to GPU memory associated with the filter descriptor wDesc.

## yDesc

Input. A previously initialized RNN data descriptor. The dataType, layout, maxSeqLength, batchSize, and seqLengthArray need to match that of dyDesc and dxDesc. The parameter vectorSize depends on whether the RNN mode is CUDNN\_LSTM and whether LSTM projection is enabled and whether the network is bidirectional. Specifically:

- For unidirectional network, if the RNN mode is CUDNN\_LSTM and LSTM projection is enabled, the parameter vectorSize must match the recProjSize argument passed to <a href="mailto:cudnnSetRNNProjectionLayers">cudnnSetRNNProjectionLayers</a>() call used to set rnnDesc. If the network is bidirectional, then multiply the value by 2.
- ▶ Otherwise, for unidirectional network, the parameter vectorSize must match the hiddenSize argument used to initialize rnnDesc. If the network is bidirectional, then multiply the value by 2.

У

Output. Data pointer to GPU memory associated with the RNN data descriptor yDesc. The input vectors are expected to be laid out in memory according to the layout specified by yDesc. The elements in the tensor (including elements in the padding vector) must be densely packed, and no strides are supported.

## hyDesc

*Input.* A fully packed tensor descriptor describing the final hidden state of the RNN. The descriptor must be set exactly the same as hxDesc.

# hу

Output. Data pointer to GPU memory associated with the tensor descriptor hydesc. If a NULL pointer is passed, the final hidden state of the network will not be saved.

### cyDesc

*Input*. A fully packed tensor descriptor describing the final cell state for LSTM networks. The descriptor must be set exactly the same as cxDesc.

### су

Output. Data pointer to GPU memory associated with the tensor descriptor cyDesc. If a NULL pointer is passed, the final cell state of the network will not be saved.

### kDesc

Reserved. Users may pass in NULL.

### keys

Reserved. Users may pass in NULL.

### cDesc

Reserved. Users may pass in NULL.

### cAttn

Reserved. Users may pass in NULL.

### iDesc

Reserved. Users may pass in NULL.

### iAttn

Reserved. Users may pass in NULL.

## qDesc

Reserved. Users may pass in NULL.

### queries

Reserved. Users may pass in NULL.

# workspace

Input. Data pointer to GPU memory to be used as a workspace for this call.

## workSpaceSizeInBytes

Input. Specifies the size in bytes of the provided workspace.

### reserveSpace

Input/Output. Data pointer to GPU memory to be used as a reserve space for this call.

# ${\tt reserveSpaceSizeInBytes}$

*Input.* Specifies the size in bytes of the provided reserveSpace.

# Returns

# CUDNN STATUS SUCCESS

The function launched successfully.

# CUDNN STATUS NOT SUPPORTED

At least one of the following conditions are met:

- ▶ Variable sequence length input is passed in while CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN RNN ALGO PERSIST DYNAMIC is used.
- CUDNN\_RNN\_ALGO\_PERSIST\_STATIC or CUDNN\_RNN\_ALGO\_PERSIST\_DYNAMIC is used on pre-Pascal devices.
- ▶ Double input/output is used for CUDNN\_RNN\_ALGO\_PERSIST\_STATIC.

# CUDNN STATUS BAD PARAM

At least one of the following conditions are met:

► The descriptor rnnDesc is invalid.

- At least one of the descriptors xDesc, yDesc, hxDesc, cxDesc, wDesc, hyDesc, and cyDesc is invalid, or have incorrect strides or dimensions.
- workSpaceSizeInBytes is too small.
- reserveSpaceSizeInBytes is too small.

# CUDNN STATUS EXECUTION FAILED

The function failed to launch on the GPU.

## CUDNN STATUS ALLOC FAILED

The function was unable to allocate memory.

# 8.2.25. cudnnSetCTCLossDescriptor()

```
cudnnStatus_t cudnnSetCTCLossDescriptor(
    cudnnCTCLossDescriptor_t ctcLossDesc,
    cudnnDataType_t compType)
```

This function sets a CTC loss function descriptor. See also the extended version cudnnSetCTCLossDescriptorEx() to set the input normalization mode.

When the extended version <a href="mailto:cudnnSetCTCLossDescriptorEx">cudnnSetCTCLossDescriptorEx</a>() is used with normMode set to CUDNN\_NOT\_PROPAGATE\_NAN, then it is the same as the current function cudnnSetCTCLossDescriptor(), meaning: cudnnSetCtcLossDescriptor(\*) = cudnnSetCtcLossDescriptorEx(\*, normMode=CUDNN\_LOSS\_NORMALIZATION\_NONE, gradMode=CUDNN\_NOT\_PROPAGATE\_NAN)

# **Parameters**

### ctcLossDesc

Output. CTC loss descriptor to be set.

## compType

*Input*. Compute type for this CTC loss function.

### Returns

# CUDNN STATUS SUCCESS

The function returned successfully.

# CUDNN STATUS BAD PARAM

At least one of input parameters passed is invalid.

# 8.2.26. cudnnSetCTCLossDescriptorEx()

```
cudnnStatus_t cudnnSetCTCLossDescriptorEx(
    cudnnCTCLossDescriptor_t ctcLossDesc,
    cudnnDataType_t compType,
    cudnnLossNormalizationMode_t normMode,
    cudnnNanPropagation_t gradMode)
```

This function is an extension of <u>cudnnSetCTCLossDescriptor()</u>. This function provides an additional interface normMode to set the input normalization mode for the CTC loss function, and gradMode to control the NaN propagation type.

When this function cudnnSetCTCLossDescriptorEx() is used with normMode set to CUDNN\_LOSS\_NORMALIZATION\_NONE and the gradMode set to CUDNN\_NOT\_PROPAGATE\_NAN, then it is the same as cudnnSetCTCLossDescriptor(), meaning:

```
cudnnSetCtcLossDescriptor(*) = cudnnSetCtcLossDescriptorEx(*,
normMode=CUDNN LOSS NORMALIZATION NONE, gradMode=CUDNN NOT PROPAGATE NAN)
```

## **Parameters**

### ctcLossDesc

Output. CTC loss descriptor to be set.

## compType

*Input*. Compute type for this CTC loss function.

### normMode

*Input*. Input normalization type for this CTC loss function. For more information, see cudnnLossNormalizationMode t.

## gradMode

Input. NaN propagation type for this CTC loss function. For  $\mathtt{L}$  the sequence length,  $\mathtt{R}$  the number of repeated letters in the sequence, and  $\mathtt{T}$  the length of sequential data, the following applies: when a sample with  $\mathtt{L}+\mathtt{R} > \mathtt{T}$  is encountered during the gradient calculation, if  $\mathtt{gradMode}$  is set to  $\mathtt{CUDNN\_PROPAGATE\_NAN}$  (see  $\mathtt{cudnnNanPropagation\_t}$ ), then the CTC loss function does not write to the gradient buffer for that sample. Instead, the current values, even not finite, are retained. If  $\mathtt{gradMode}$  is set to  $\mathtt{CUDNN\_NOT\_PROPAGATE\_NAN}$ , then the gradient for that sample is set to zero. This guarantees finite gradient.

## Returns

### CUDNN STATUS SUCCESS

The function returned successfully.

## CUDNN\_STATUS\_BAD\_PARAM

At least one of input parameters passed is invalid.

# 8.2.27. cudnnSetCTCLossDescriptor\_v8()

```
cudnnStatus_t cudnnSetCTCLossDescriptorEx(
    cudnnCTCLossDescriptor_t ctcLossDesc,
    cudnnDataType_t compType,
    cudnnLossNormalizationMode_t normMode,
    cudnnNanPropagation_t gradMode,
    int maxLabelLength)
```

Many CTC API functions are updated in cuDNN version 8.0.0 to support CUDA graphs. In order to do so, a new parameter is needed, maxLabelLength. Now that label and input data are assumed to be in GPU memory, this information is not otherwise readily available.

# **Parameters**

### ctcLossDesc

Output. CTC loss descriptor to be set.

## compType

*Input*. Compute type for this CTC loss function.

### normMode

*Input*. Input normalization type for this CTC loss function. For more information, see <u>cudnnLossNormalizationMode\_t</u>.

## gradMode

Input. NaN propagation type for this CTC loss function. For  $\mathtt{L}$  the sequence length,  $\mathtt{R}$  the number of repeated letters in the sequence, and  $\mathtt{T}$  the length of sequential data, the following applies: when a sample with  $\mathtt{L}+\mathtt{R} > \mathtt{T}$  is encountered during the gradient calculation, if  $\mathtt{gradMode}$  is set to  $\mathtt{CUDNN\_PROPAGATE\_NAN}$  (see  $\mathtt{cudnnNanPropagation\_t}$ ), then the CTC loss function does not write to the gradient buffer for that sample. Instead, the current values, even not finite, are retained. If  $\mathtt{gradMode}$  is set to  $\mathtt{CUDNN\_NOT\_PROPAGATE\_NAN}$ , then the gradient for that sample is set to zero. This guarantees finite gradient.

### maxLabelLength

*Input.* The maximum label length from the labels data.

### Returns

### CUDNN STATUS SUCCESS

The function returned successfully.

# CUDNN\_STATUS\_BAD\_PARAM

At least one of input parameters passed is invalid.

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