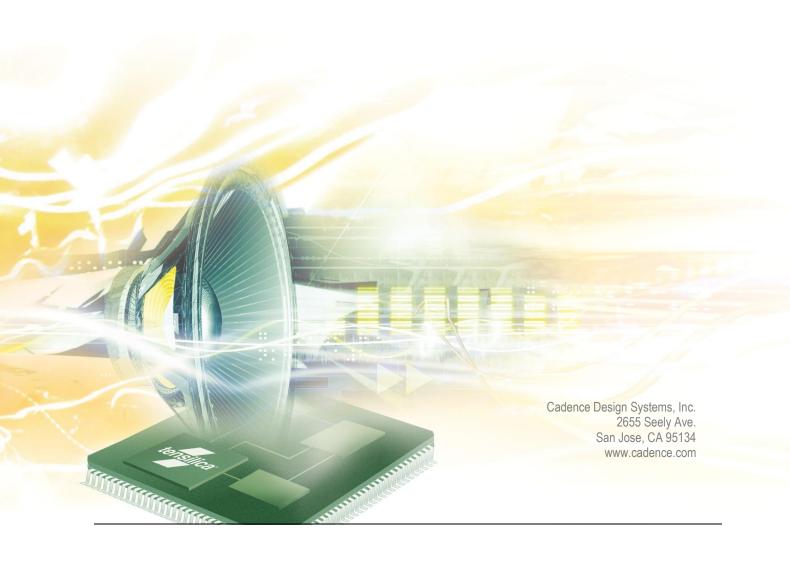


HiFi 5 Neural Network Library

Programmer's Guide

For HiFi DSPs





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Contents

| 1. | Intro | duction to the HiFi 5 NN Library | 1 |
|-----|----------------------------|---|------|
| 1.1 | ı C | Organization of the HiFi 5 NN Library Package | 1 |
| | 1.1.1 | Document Overview | 2 |
| 1.2 | 2 F | liFi 5 NN Library Specification | |
| | - 1.2.1 | Low Level Kernels | |
| | 1.2.1 | Layers | |
| | 1.2.3 | Support for TensorFlow Lite Micro Operators | |
| 2. | | eric HiFi NN Layer API | |
| 2.1 | | Shape | |
| 2.2 | | · | |
| | | Memory Management | |
| - | 2.2.1 | API Handle / Persistent Memory | |
| | 2.2.2 2.2.3 | Scratch MemoryWeights and Biases Memory | |
| | 2.2.3 2.2.4 | Input Buffer | |
| | 2.2. 4 2.2.5 | Output Buffer | |
| 2.3 | | Seneric API Errors | |
| | | | |
| - | 2.3.1 | Common API Errors | |
| 2.4 | | C Language API | |
| | 2.4.1 | Startup Functions | |
| | 2.4.2 | Query Functions | |
| | 2.4.3 | Initialization Functions | |
| | 2.4.4 | Execution Functions | |
| 3. | | 5 NN Library – Low-Level Kernels | |
| 3.1 | i N | Matrix X Vector Multiplication Kernels | |
| ; | 3.1.1 | Matrix X Vector Kernels | 11 |
| | 3.1.2 | Fused (Activation) Matrix X Vector Kernels | |
| | 3.1.3 | Matrix X Vector Batch Kernels | |
| | 3.1.4 | Matrix Multiplication Kernels | |
| ; | 3.1.5 | Matrix X Vector Kernels with Output Stride | |
| 3.2 | 2 C | Convolution Kernels | . 26 |
| | 3.2.1 | Standard 2D Convolution Kernel | |
| | 3.2.2 | | |
| | 3.2.3 | Depthwise Separable 2D Convolution Kernel | |
| | 3.2.3.1 | · | |
| | 3.2.3.2 | | |
| 3.3 | 3 A | activation Kernels | |
| | 3.3.1 | Sigmoid | |
| ; | 3.3.2 | Tanh | 45 |

| 3.3.3 | Rectifier Linear Unit (ReLU) | 47 |
|--------------------|---|-----|
| 3.3.4 | Softmax | 49 |
| 3.3.5 | Activation Min Max | 50 |
| 3.4 F | Pooling Kernels | 52 |
| 3.4.1 | Average Pool Kernel | 52 |
| 3.4.2 | Max Pool Kernel | 55 |
| 3.5 F | ully connected Layer | 58 |
| 3.5.1 | Fully Connected Kernel | 58 |
| 3.6 E | Basic Operations and Miscellaneous Kernels | 62 |
| 3.6.1 | Interpolation Kernel | 62 |
| 3.6.2 | Dot Product Kernels | 63 |
| 3.6.3 | Elementwise Quantize Kernel | 64 |
| 4. HiFi | 5 NN Library – Layers | 66 |
| 4.1 | GRU Layer | 66 |
| 4.1.1 | GRU Layer Specification | |
| 4.1.2 | Error Codes Specific to GRU | |
| 4.1.3 | API Functions Specific to GRU | |
| 4.1.3.1 | Query Functions | 68 |
| 4.1.3.2 | · · · · · · · · · · · · · · · · · · · | |
| 4.1.3.3 | S . | |
| 4.1.4 | Structures Specific to GRU | |
| 4.1.5 | Enums Specific to GRU | |
| | STM Layer | |
| 4.2.1 | LSTM Layer Specification | |
| 4.2.2 | Error Codes Specific to LSTM | |
| 4.2.3 | API Functions Specific to LSTM | |
| 4.2.3.1 4.2.3.2 | | |
| 4.2.3.2 | _ | |
| 4.2.4 | Structures Specific to LSTM | |
| 4.2.5 | Enums Specific to LSTM | |
| | CNN Layer | |
| 4.3.1 | CNN Layer Specification | |
| 4.3.2 | Error Codes Specific to CNN | |
| 4.3.3 | API Functions Specific to CNN | |
| 4.3.3.1 | | |
| 4.3.3.2 | 2 Initialization Stage | 93 |
| 4.3.3.3 | B Execution Stage | 95 |
| 4.3.4 | Structures Specific to CNN | |
| 4.3.5 | Enums Specific to CNN | 99 |
| 5. Intro | duction to the Example Testbench | 101 |
| 5.1 N | Making the Library | 101 |
| 5.2 N | Making the Executable | 101 |
| 5.3 S | Sample Testbench for Matrix X Vector Multiplication Kernels | 102 |

| 5.3.1 Usage | 102 |
|---|-----|
| 5.4 Sample Testbench for Convolution Kernels | 103 |
| 5.4.1 Usage | 103 |
| 5.5 Sample Testbench for Activation Kernels | 106 |
| 5.5.1 Usage | 106 |
| 5.6 Sample Testbench for Pooling Kernels | 107 |
| 5.6.1 Usage | 107 |
| 5.7 Sample Testbench for Basic Operations Kernels | 108 |
| 5.7.1 Usage | 108 |
| 5.8 Sample Testbench for GRU Layer | 110 |
| 5.8.1 Usage | 110 |
| 5.9 Sample Testbench for LSTM Layer | 111 |
| 5.9.1 Usage | 111 |
| 5.10 Sample Testbench for CNN Layer | 112 |
| 5.10.1 Usage | 112 |
| 5.11 Sample Testbenches for Neural Network Examples | 114 |
| 5.11.1 Usage | 115 |
| 6. References | 116 |

Figures

| Figure 2-1 HiFi NN Layer Interfaces | . 4 |
|--|-----|
| Figure 2-2 Matrix and Cube (SHAPE_CUBE_DWH_T) Shape Representation | . 5 |
| Figure 2-3 NN Layer Flow Overview | . 8 |

Tables

| Table 2-1 Library Identification Functions | 9 |
|--|----|
| Table 4-1 GRU Get Persistent Size Function | 68 |
| Table 4-2 GRU Get Scratch Size Function | 69 |
| Table 4-3 GRU Init Function | 70 |
| Table 4-4 GRU Execution Function | 71 |
| Table 4-5 GRU Set Parameter Function Details | |
| Table 4-6 GRU Get Parameter Function Details | 73 |
| Table 4-7 GRU Config Structure xa_nnlib_gru_init_config_t | 74 |
| Table 4-8 xa_nnlib_gru_weights_t Parameter Type | 74 |
| Table 4-9 xa_nnlib_gru_biases_t Parameter Type | 75 |
| Table 4-10 Enum xa_nnlib_gru_precision_t | 75 |
| Table 4-11 GRU Specific Parameters | 76 |
| Table 4-12 LSTM Get Persistent Size Function | 79 |
| Table 4-13 LSTM Get Scratch Size Function | 80 |
| Table 4-14 LSTM Init Function | |
| Table 4-15 LSTM Execution Function | |
| Table 4-16 LSTM Set Parameter Function Details | |
| Table 4-17 LSTM Get Parameter Function Details | 85 |
| Table 4-18 LSTM Config Structure xa_nnlib_lstm_init_config_t | |
| Table 4-19 xa_nnlib_lstm_weights_t Parameter Type | 86 |
| Table 4-20 xa_nnlib_lstm_biases_t Parameter Type | 87 |
| Table 4-21 Enum xa_nnlib_lstm_precision_t | 87 |
| Table 4-22 LSTM Specific Parameters | 88 |
| Table 4-23 CNN Get Persistent Size Function | 90 |
| Table 4-24 CNN Get Scratch Size Function | |
| Table 4-25 CNN Init Function | 93 |



| Table 4-26 | CNN Execution Function | 95 |
|------------|---|----|
| Table 4-27 | CNN Set Parameter Function Details | 96 |
| Table 4-28 | CNN Get Parameter Function Details | 97 |
| Table 4-29 | CNN Config Structure xa_nnlib_cnn_init_config_t | 98 |
| Table 4-30 | Enum xa_nnlib_cnn_precision_t | 99 |
| Table 4-31 | Enum xa_nnlib_cnn_algo_t | 99 |
| Table 4-32 | CNN Specific Parameters 1 | 00 |

Document Change History

| Version | Changes |
|---------|--|
| 1.0 | Initial version |
| 1.1 | Adding quantized 8 bit variants for depthwise convolution, fully connected and softmax |
| 1.2 | Adding quantized 8 bit kernels for SVDF support and for standard convolution, average pooling, and quantization. |

1.Introduction to the HiFi 5 NN Library

The HiFi 5 Neural Network (NN) Library is a HiFi-optimized implementation of various NN layers and low level NN kernels. The library is designed with speech and audio neural network domain focus. The low level NN kernels are HiFi-optimized building blocks for NN layer implementation with a generic and simple interface. The NN layers are built using low level kernels and accept input in the form of 'shapes' (up to four dimensions) and produce the output, also in the form of shapes. The layers use the weights or coefficients and biases stored 'externally' for their operation. The shape of the input, output, weights and biases are as per the layer's design.

This guide refers to the HiFi 5 NN Library as HiFi NN Library, NN layers simply as layers and low level NN kernels as low-level kernels. The current version of the library implements GRU, LSTM (forward path), and CNN layers. It also implements matrix vector multiply, activation, pooling, and convolution functions as low-level kernels.

Note

This version of the library supports HiFi 5 DSPs with the NN Extension enabled. The SP-VFPU (Single Precision Vector Floating Point Unit) is optional. The library can be compiled for HiFi 5 DSPs with or without the SP-VFPU enabled.

1.1 Organization of the HiFi 5 NN Library Package

The HiFi NN Library package includes the HiFi NN library containing all layers and low-level kernels implementations, and a set of sample test applications (for layers and low-level kernels).

The HiFi NN library implements a set of NN layers. The application can instantiate these layers and connect inputs and outputs across the layers to form a Neural Network system.

The HiFi NN library also provides a set of low level NN kernels. The application can use these kernels to implement or optimize performance of other NN layers.

The sample test applications implement a file-based application to test an instance of a layer or low level NN kernels for the given specification using pre-generated input, weight or coefficients and bias shapes stored in files in raw binary format.

25 () 2 () 2 () 2 ()

¹ Refer to Section 2.1 Shape

² Refer to Section 2.2.3 Weights and Biases Memory

1.1.1 Document Overview

This document covers all the information required to integrate the HiFi NN Library into a Neural Network system. All the layers implement "HiFi NN layer APIs", which is generic and explained in Section 2. The low level NN kernels are explained in Section 3. The APIs for each layer are described in Section 3.6.2. Section 5 provides details about available sample testbenches. References are listed in Section 6.

1.2 HiFi 5 NN Library Specification

The current version of the HiFi NN Library provides the following HiFi-optimized low-level kernels and layer implementations.

1.2.1 Low Level Kernels

- Matrix-vector multiplication kernels
- Convolution kernels
- Activation kernels
- Pooling kernels
- Basic operations kernels

These kernels support fixed point 8 bit, 16 bit, and single precision floating point data types for weights or coefficients, biases, input, and output. Refer to Section 3 for details.

Additionally, 8-bit and 16-bit quantized datatypes as defined in TensorFlow (TF), TensorFlow Lite for Microcontrolllers (TFLM) are also supported for select kernels [3]. These datatypes use 8-bit/16-bit quantized values (asym8u – asymmetric 8-bit unsigned, asym8s – asymmetric 8-bit signed, sym8s – symmetric 8-bit signed) for weights or coefficients, input, and output. Biases are 32-bit quantized values.

8-bit quantized types are either unsigned (0, 255) or signed (-128, 127) 8-bit integer with 3 additional parameters.

Three numbers are associated with a quantized 8-bit value that can be used to convert the 8-bit integer to the real value and vice versa. These numbers are:

- Shift: an integer value indicating the amount of shift. If the value is positive, it is left shift and if negative, it is right shift
- Multiplier: a 32 bit (Q31) fixed point value greater than zero.
- Zero point: a 32 bit integer, in range [0, 255] for unsigned type, in range [-128, 127] for signed type.

The formula is:

```
real_value = (quantized_value - zero_point) * 2^(shift) * multiplier
```

The 'sym8s' type is symmetrical around 0, this means that quantized values are between -127 to 127 and zero point is 0, so all the calculation required due to zero point is avoided.



To match the asym8u/asym8s/sym8s APIs with Tensorflow, we define zero point as zero_bias in the NN library APIs. The zero_bias is an integer value having range asym8u - [0, 255], asym8s – [-128, 127] (or asym8u - [-255, 0], asym8s – [-127, 128] in case of the reverse operation depending on the corresponding Tensorflow kernel).

In addition to the quantized 8-bit datatypes, a similar 16-bit quantized datatype (asym16s) is used for few kernels. The zero bias for asym16s datatype is an integer value having range – [-32768, 32767].

1.2.2 Layers

- GRU layer (8x16, 16x16 precision)
- LSTM (forward path) layer (8x16, 16x16 precision)
- CNN layer (8x8, 8x16, 16x16, and float32xfloat32 precision)

Note: MxN precision above denotes (weights or coefficients) x (input, output, bias) precision. Refer to Section 3.6.2 for details.

1.2.3 Support for TensorFlow Lite Micro Operators

The HiFi 5 NN Library low level kernels can be used to implement the following operators of TensorFlow Lite Micro:

| | | | Uint8 (asymmetric quantized uint8) | Int8 (quantized int8) Datatype Support |
|-----|-------------------|--------------------------|------------------------------------|--|
| No. | Operator | Float32 Datatype Support | Datatype Support | |
| 1 | FULLY_CONNECTED | | Yes | Yes |
| 2 | MAX_POOL_2D | Yes | | |
| 3 | SOFTMAX | | Yes | Yes |
| 4 | LOGISTIC | Yes | | |
| 5 | SVDF | | | Yes |
| 6 | CONV_2D | Yes | Yes | |
| 7 | DEPTHWISE_CONV_2D | Yes | Yes | Yes |
| 8 | AVERAGE_POOL_2D | Yes | Yes | |
| 9 | FLOOR | | | |
| 10 | RELU | Yes | Yes | Yes |
| 11 | RELU6 | Yes | Yes | Yes |
| 12 | ADD | | | |
| 13 | MUL | | | |
| 14 | QUANTIZE | | | Yes |



2. Generic HiFi NN Layer API

Note This section explains an API standard that is evolving. The APIs may undergo some changes in future versions.

This section describes the API that is common to all the HiFi NN layers. The API facilitates any layer instance that works in the overall method shown in Figure 2-1.

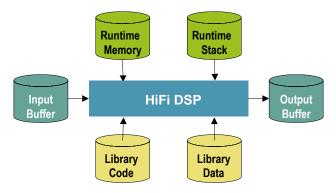


Figure 2-1 HiFi NN Layer Interfaces

All the buffers, input, output, weights and biases are described as shapes. Section 2.1 explains the shape structure.

Section 2.2 discusses all the types of runtime memory required by the layer instances. There is no state information held in static memory, therefore a single thread can perform time division processing of multiple layer instances. Additionally, multiple threads can perform concurrent layer instance processing.

The output from one instance can be fed as input to the next instance if the precision and the dimension matches.

The data types, structures, and error codes explained in this section are declared/defined in $xa_nnlib_standard.h$. By default, the API header file of each layer will include this header file. The application need not include this file.

2.1 Shape

The shapes are used to describe any buffer used in the NN library. The structure xa_nnlib_shape_t is defined in xa_nnlib_standard.h. The shape can be vector, matrix, or cube.

- Vector is a one-dimensional shape specified by length.
- Matrix is a two-dimensional shape specified by rows, columns, and row_offset. This assumes that the elements in a row are stored at consecutive addresses in memory.



- Cube is a three-dimensional shape specified by height, width, depth, height_offset, width_offset, and depth offset. Cube supports the following shape types:
 - SHAPE_CUBE_DWH_T

This assumes that elements are stored in depth, width, and height order; that is, elements with the same height and width indices are stored consecutively.

SHAPE_CUBE_WHD_T

This assumes that elements are stored in width, height, and depth order; that is, elements with the same height and depth are stored consecutively.

Figure 2-2 shows the dimension variables of matrix and cube shapes.

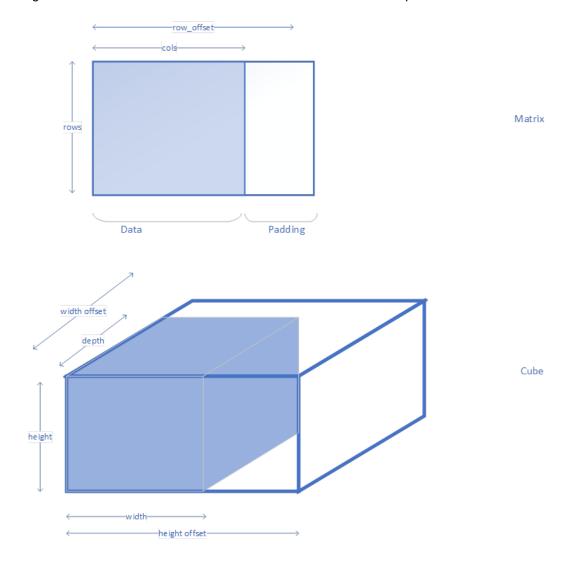


Figure 2-2 Matrix and Cube (SHAPE_CUBE_DWH_T) Shape Representation



2.2 Memory Management

The HiFi NN layer API supports a flexible memory scheme and a simple interface that eases the integration into the final application. The API allows the layers to request the required memory for their operations during runtime.

The runtime memory requirement consists primarily of the scratch and persistent memory. The components also require an input buffer and output buffer for the passing of data into and out of the layer.

2.2.1 API Handle / Persistent Memory

The layer API stores persistent state information in a structure that is referenced via an opaque handle. The handle is passed by the application for each API call. This object contains all state and history information that is maintained from one-layer frame invocation to the next within the same thread or instance. The layers expect that the contents of the persistent memory be unchanged by the system apart from the layer itself for the complete lifetime of the layer.

2.2.2 Scratch Memory

This is the temporary buffer used by the layer during a single frame processing call. The contents of this memory region should not be changed if the actual layer execution process is active; that is, if the thread running the layer is inside any API call. This region can be used freely by the system between successive calls to the layer.

2.2.3 Weights and Biases Memory

The weights or coefficients and biases should be managed by the application, and memory should not be requested by the API. If the design requires DMA access from or to the internal memory for better performance, a ping-pong or circular buffer is allocated as part of the scratch into which the weights, biases, input, and output are copied using DMA. If required, these memories can also be persistent.

2.2.4 Input Buffer

This is the buffer from which the layer reads the input. This buffer must be made available for the layer before its execution call. The input buffer should have an associated shape information to describe the input data format. The input buffer pointer can be changed by the application between calls to the layer, but shape information cannot be changed. This allows the layer to read directly from the output of another layer.

2.2.5 Output Buffer

This is the buffer to which the layer writes the output. This buffer must be made available for the layer before its execution call. The output buffer should have an associated shape information to which the layer can describe the output data format. The output buffer pointer can be changed by the application between calls to the layer. This allows the layer to write directly to the input of another layer.



2.3 Generic API Errors

Layer API functions return an error code of type Int32, which is of type signed int. The format of the error codes is defined in the following table.

| 31 | 30 - 27 | 26-12 | 11 - 7 | 6 - 0 |
|-------|---------|----------|-----------|----------|
| Fatal | Class | Reserved | Component | Sub code |

The errors that can be returned from the API are subdivided into those that are fatal, which require resetting the layer; and those that are nonfatal and are provided for information to the application.

The class of an error can be API, Config, or Execution. The API category errors are concerned with the incorrect use of the API. The Config errors are produced when the layer parameters are incorrect or outside the supported usage. The Execution errors are returned after a call to the main process and indicate situations that have arisen due to the input data.

2.3.1 Common API Errors

The following errors are fatal and should not be encountered during normal application operation. They signal that a serious error has occurred in the application that is calling the layer.

- XA_NNLIB_FATAL_MEM_ALLOC
 At least one of the pointers passed into the API function is NULL.
- XA_NNLIB_FATAL_MEM_ALIGN
 At least one of the pointers passed into the API function is not properly aligned.
- XA_NNLIB_FATAL_INVALID_SHAPE
 At least one of the shapes passed to the API function is invalid.

2.4 C Language API

An overview of the NN layer flow is shown in Figure 2-3. The NN layer API consists of query, initialization, and execution functions.

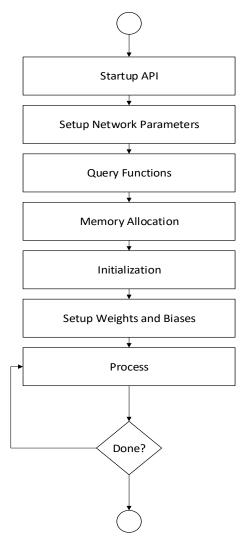


Figure 2-3 NN Layer Flow Overview



2.4.1 Startup Functions

The API startup functions shown in Table 2-1 get the various identification strings from the component library. They are for information only and their usage is optional. These functions do not take any input arguments and return const char *.

Table 2-1 Library Identification Functions

| Function | Description |
|-------------------------------------|---------------------------------|
| xa_nnlib_get_lib_name_string | Get the name of the library. |
| xa_nnlib_get_lib_version_string | Get the version of the library. |
| xa_nnlib_get_lib_api_version_string | Get the version of the API. |

Example

```
const char *name = xa_nnlib_get_lib_name_string();
const char *ver = xa_nnlib_get_lib_version_string();
const char *aver = xa_nnlib_get_lib_api_version_string();
```

Errors

None



2.4.2 Query Functions

The query functions are used in the startup and the memory allocation stages to obtain information about the memory requirements of the library.

Following is the naming convention for query functions:

```
xa_nnlib_<layer>_get_{persistent | scratch}_<placement>
```

Where:

<layer> indicates the module name (such as gru).

<placement> specifies fast or slow.

2.4.3 Initialization Functions

The initialization functions are used to reset the layer to its initial state. Because the layers are fully reentrant, the application can initialize the layer multiple times.

Following is the naming convention for initialization functions:

2.4.4 Execution Functions

The execution functions are used to generate the output shape by processing one input shape.

Following is the naming convention for execution functions:

```
xa_nnlib_<layer>_process
```



3. HiFi 5 NN Library – Low-Level Kernels

This section explains the low-level kernels provided in the NN library. All the low-level kernels have a generic, simple interface.

The NN library is a single archive containing all low-level kernels and layers implementations. The following sections explain each low-level kernel in detail.

3.1 Matrix X Vector Multiplication Kernels

3.1.1 Matrix X Vector Kernels

Description

These kernels perform the dual matXvec operation with bias addition; that is, z = mat1*vec1 + mat2*vec2 + bias. The column dimension of mat1 must match the row dimension of vec1 and similarly for mat2, vec2. Bias and resulting output vector z have as many rows as mat1 and mat2.

bias_shift and acc_shift arguments are provided in the kernel API to adjust Q format of bias and output, respectively. Both bias_shift and acc_shift can be either positive or negative, where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as matXvec multiplication – accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note, acc_shift and bias_shift arguments are not relevant in case of floating-point kernels and quantized 8-bit kernels.

row_stride1 and row_stride2 arguments are provided in kernel API for row offsets of mat1 and mat2, respectively. Note, input matrices are expected to be appropriately padded in case of row_stride > cols.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

The arguments, mat1_zero_bias, mat2_zero_bias, vec1_zero_bias, vec2_zero_bias, are provided to convert the quantized 8-bit inputs into their real values and perform matXvec operation. The out_zero_bias, out_multiplier and out_shift values are used to quantize real values of output back to 8-bit.

Function variants available are xa_nn_matXvec_[p]x[q]_[r], where:

- [p]: Matrix precision in bits
- [q]: Vector precision in bits



[r]: Output precision in bits

Precision

There are twelve variants available:

| Туре | Description | |
|----------------------|--|--|
| 16x16_16 | 16-bit matrix inputs, 16-bit vector inputs, 16-bit output | |
| 16x16_32 | 16-bit matrix inputs, 16-bit vector inputs, 32-bit output | |
| 16x16_64 | 16-bit matrix inputs, 16-bit vector inputs, 64-bit output | |
| 8x16_16 | 8-bit matrix inputs, 16-bit vector inputs, 16-bit output | |
| 8x16_32 | 8-bit matrix inputs, 16-bit vector inputs, 32-bit output | |
| 8x16_64 | 8-bit matrix inputs, 16-bit vector inputs, 64-bit output | |
| 8x8_8 | 8-bit matrix inputs, 8-bit vector inputs, 8-bit output | |
| 8x8_16 | 8-bit matrix inputs, 8-bit vector inputs, 16-bit output | |
| 8x8_32 | 8-bit matrix inputs, 8-bit vector inputs, 32-bit output | |
| f32xf32_f32 | float32 matrix inputs, float32 vector inputs, float32 output | |
| asym8uxasym8u_asym8u | asym8u matrix inputs, asym8u vector inputs, asym8u output | |
| sym8sxasym8s_asym8s | sym8s matrix inputs, asym8s vector inputs, asym8s output | |

Algorithm

$$z_n = 2^{acc\text{-}shift} \left(\sum_{m=0}^{cols1-1} mat1_{n,m} \cdot vec1_m + \sum_{m=0}^{cols2-1} mat2_{n,m} \cdot vec2_m + 2^{bias\text{-}shift}bias_n \right)$$

For floating-point and quantized 8-bit routines, acc_shift=0 and bias_shift=0.

Thus, $2^{acc-shift} = 2^{bias-shift} = 1$

Prototype

```
WORD32 xa_nn_matXvec_16x16_16
(WORD16 * p_out, WORD16 * p_mat1, WORD16 * p_mat2,
WORD16 * p_vec1, WORD16 * p_vec2, WORD16 * p_bias,
WORD32 rows,
                            WORD32 cols1,
                                                          WORD32 cols2,
WORD32 row_stride1, WORD32 row_stride2,
WORD32 acc_shift, WORD32 bias_shift);
WORD32 xa_nn_matXvec_16x16_32
WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift);
WORD32 xa_nn_matXvec_16x16_64
(WORD64 * p_out, WORD16 * p_mat1, WORD16 * p_mat2,
WORD16 * p_vec1, WORD16 * p_vec2, WORD16 * p_bias,
WORD32 rows, WORD32 cols1, WORD32 cols2,
WORD32 row_stride1, WORD32 row_stride2,
WORD32 acc_shift, WORD32 bias_shift);
WORD32 xa_nn_matXvec_8x16_16
(WORD16 * p_out,
                            WORD8 * p_mat1,
                                                          WORD8 * p_mat2,
```



```
WORD16 * p_vec1, WORD16 * p_vec2, WORD32 rows, WORD32 cols1,
                                                          WORD16 * p_bias,
                                                          WORD32 cols2,
                         WORD32 row_stride2,
WORD32 bias_shift);
WORD32 row_stride1,
WORD32 acc_shift,
WORD32 xa_nn_matXvec_8x16_32
(WORD32 * p_out, WORD8 * p_mat1,
                                                        WORD8 * p_mat2,
WORD16 * p_vec1, WORD16 * p_vec2, WORD32 rows, WORD32 cols1,
                                                       WORD16 * p_bias,
                                                         WORD32 cols2,
WORD32 row_stride1, WORD32 row_stride2,
WORD32 acc_shift, WORD32 bias_shift);
WORD32 xa_nn_matXvec_8x16_64
(WORD64 * p_out, WORD8 * p_mat1,
                                                        WORD8 * p_mat2,
WORD16 * p_vec1, WORD16 * p_vec2, WORD32 rows, WORD32 cols1, WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift);
                                                         WORD16 * p bias,
                                                      WORD32 cols2,
WORD32 xa_nn_matXvec_8x8_8
(WORD8 * p_out, WORD8 * p_mat1,
WORD8 * p_vec1, WORD8 * p_vec2,
WORD32 rows, WORD32 cols1,
WORD32 row_stride1, WORD32 row_stride2,
WORD32 acc_shift, WORD32 bias_shift);
                                                        WORD8 * p_mat2,
                                                      WORD8 * p_bias.
                                                        WORD32 cols2,
WORD32 xa_nn_matXvec_8x8_16
(WORD16 * p_out, WORD8 * p_mat1,
                                                        WORD8 * p_mat2,
WORD8 * p_vec1,
WORD32 rows,
                           WORD8 * p_vec2,
                                                        WORD8 * p_bias,
                           WORD32 cols1,
                                                        WORD32 cols2,
WORD32 row_stride1, WORD32 row_stride2,
WORD32 acc_shift, WORD32 bias_shift);
WORD32 xa_nn_matXvec_8x8_32
(WORD32 * p_out, WORD8 * p_mat1,
                                                       WORD8 * p_mat2,
WORD8 * p_vec1,
                           WORD8 * p_vec2,
                                                         WORD8 * p_bias,
WORD32 rows,
                             WORD32 cols1,
                                                         WORD32 cols2,
WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift);
WORD32 xa_nn_matXvec_f32xf32_f32
(FLOAT32 * p_out, const FLOAT32 * p_mat1, const FLOAT32 * p_mat2,
Const FLOAT32 * p_vec1, const FLOAT32 * p_vec2, const FLOAT32 * p_bias,
WORD32 rows, WORD32 cols1, WORD32 row_stride1, WORD32 row_stride2);
                                                          WORD32 cols2,
WORD32 xa nn matXvec asym8uxasym8u asym8u
(UWORD8 * p_out, const UWORD8 * p_mat1, const UWORD8 * p_mat2,
const UWORD8 * p_vec1, const UWORD8 * p_vec2, const WORD32 * p_bias,
WORD32 rows, WORD32 cols1, WORD32 cols2, WORD32 row_stride1, WORD32 row_stride2, WORD32 mat1_zero_bias, WORD32 wec1_zero_bias, WORD32 vec2_zero_bias,
WORD32 out_multiplier, WORD32 out_shift, WORD32 out_zero_bias);
WORD32 xa_nn_matXvec_sym8sxasym8s_asym8s
(WORD8 * p_out, const WORD8 * p_mat1, const WORD8 * p_mat2,
const WORD8 * p_vec1, const WORD8 * p_vec2, const WORD32 * p_bias,
WORD32 rows, WORD32 cols1, WORD32 cols2, WORD32 row_stride1, WORD32 row_stride2, WORD32 vec1_zero_bias,
WORD32 vec2 zero bias, WORD32 out multiplier, WORD32 out_shift,
WORD32 out zero bias);
```



Arguments

| Туре | Name | Size | Description |
|---|----------------|------------|---|
| Input | | | |
| WORD16 *, WORD8 *, const FLOAT32 * const UWORD8 *, | p_mat1 | rows*cols1 | Input matrix 1, fixed, floating point, asym8u or sym8s |
| const WORD8 * | | | |
| WORD16 *, WORD8 *, const FLOAT32 * const UWORD8 *, const WORD8 * | p_mat2 | rows*cols2 | Input matrix 2, fixed, floating point, asym8u or sym8s |
| WORD16 *, WORD8 *, const FLOAT32 * const UWORD8 *, const WORD8 * | p_vec1 | cols1*1 | Input vector 1, fixed, floating point, asym8u or asym8s |
| WORD16 *, WORD8 *, const FLOAT32 * const UWORD8 *, const WORD8 * | p_vec2 | cols2*1 | Input vector 2, fixed, floating point, asym8u or asym8s |
| WORD16 *, WORD8 *, const WORD32 *, const FLOAT32 * | p_bias | rows*1 | Bias vector, fixed or floating point |
| WORD32 | rows | | Number of rows in matrix 1, 2 and bias |
| WORD32 | cols1 | | Number of columns in matrix 1 and rows in vector 1 |
| WORD32 | cols2 | | Number of columns in matrix 2 and rows in vector 2 |
| WORD32 | row_stride1 | | Row offset of matrix 1 |
| WORD32 | row_stride2 | | Row offset of matrix 2 |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | mat1_zero_bias | | Zero offset of matrix 1 |
| WORD32 | mat2_zero_bias | | Zero offset of matrix 2 |
| WORD32 | vec1_zero_bias | | Zero offset of vector 1 |
| WORD32 | vec2_zero_bias | | Zero offset of vector 2 |
| WORD32 | out_multiplier | | Multiplier value of output |
| WORD32 | out_shift | | Shift value of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| Output | | | |



| Туре | Name | Size | Description |
|-----------------------|-------|--------|--------------------------------|
| WORD8 *, UWORD8 *, | p_out | rows*1 | Output, fixed, floating point, |
| WORD16 *, | | | asym8u or asym8s. |
| WORD32 *, | | | |
| WORD64 *, | | | |
| FLOAT32 * | | | |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|---------------------------|---|
| row_stride1, row_stride2, | row_stride1 >= cols1 |
| cols1, cols2 | row_stride2 >= cols2 |
| p_mat1, p_mat2, p_vec1, | Aligned on <size element="" of="" one=""> boundary</size> |
| p_vec2, p_bias, p_out | Should not overlap |
| p_mat1, p_vec1, p_out | Cannot be NULL |
| acc_shift, bias_shift, | {-31,, 31} |
| out_shift | , |
| mat1_zero_bias, | {-255, 0} for asym8u, |
| mat2_zero_bias, | {-127, 128} for asym8s |
| vec1_zero_bias, | (127, 120) for adjiniou |
| vec2_zero_bias | |
| out_multiplier | Greater than 0 |
| out_zero_bias | {0,,255} if out type is asym8u, |
| | {-128,127} if out type is asym8s |

3.1.2 Fused (Activation) Matrix X Vector Kernels

Description

These kernels perform the fused dual matXvec operation with an activation function i.e. z = activation (mat1*vec1 + mat2*vec2 + bias). The column dimension of mat1 must match the row dimension of vec1 and similarly for mat2, vec2. Bias and resulting output vector z have as many rows as mat1 and mat2.

Intermediate output of (mat1*vec1 + mat2*vec2 + bias) is stored in temporary memory provided by the p_scratch argument to kernel API. Activation function is applied on this intermediate output to get final output. Note, for fixed point kernels, the activation function always takes input in Q6.25 format.

bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and intermediate output respectively. Both bias_shift and acc_shift can be either positive or negative, where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as matXvec multiplication – accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the intermediate output in Q6.25 format.



Note: acc_shift and bias_shift are not relevant in case of floating point kernels.

row_stride1 and row_stride2 arguments are provided in kernel API for row offsets of mat1 and mat2 respectively. Note, input matrices are expected to be appropriately padded in case of row_stride > cols.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

Function variants available are $xa_nn_matXvec_[p]x[q]_[r]_<activation>$, where:

- [p]: Matrix precision in bits
- [q]: Vector precision in bits
- [r]: Output precision in bits
- <activation>: activation tag 'tanh' or 'sigmoid'

Precision

There are eight variants available:

| Туре | Description | |
|---------------------|---|--|
| 16x16_16_tanh | 16-bit matrix inputs, 16-bit vector inputs, 16-bit output with | |
| | tanh activation function | |
| 16x16_16_sigmoid | 16-bit matrix inputs, 16-bit vector inputs, 16-bit output with | |
| | sigmoid activation function | |
| 8x16_16_tanh | 8-bit matrix inputs, 16-bit vector inputs, 16-bit output with tanh | |
| | activation function | |
| 8x16_16_sigmoid | 8-bit matrix inputs, 16-bit vector inputs, 16-bit output with | |
| | sigmoid activation function | |
| 8x8_8_tanh | 8-bit matrix inputs, 8-bit vector inputs, 8-bit output with tanh | |
| | activation | |
| 8x8_8_sigmoid | 8-bit matrix inputs, 8-bit vector inputs, 8-bit output with sigmoid | |
| | activation | |
| f32xf32_f32_tanh | float32 matrix inputs, float32 vector inputs, float32 output with | |
| | tanh activation | |
| f32xf32_f32_sigmoid | float32 matrix inputs, float32 vector inputs, float32 output with | |
| | sigmoid activation | |

Algorithm

$$\begin{split} z_n &= activation \left(2^{acc\text{-}shift} \left(\sum_{m=0}^{cols1-1} mat1_{n,m} \cdot vec1_m \right. + \left. \sum_{m=0}^{cols2-1} mat2_{n,m} \cdot vec2_m \right. \\ &\left. + 2^{bias\text{-}shift} bias_n \right) \right), \qquad n = 0, \dots, \overline{rows-1} \end{split}$$

In case of floating point routine, acc_shift=0 and bias_shift=0.

Thus,
$$2^{acc\text{-}shift} = 2^{bias\text{-}shift} = 1$$



activation is tanh or sigmoid

Prototype

```
WORD32 xa_nn_matXvec_16x16_16_tanh
                                                        WORD16 * p_mat2,
(WORD16 * p_out, WORD16 * p_mat1,
                           WORD16 * p_vec2,
WORD16 * p_vec1,
                                                        VOID * p_bias,
                             WORD32 cols1,
WORD32 rows,
                                                          WORD32 cols2,
WORD32 rows, WORD32 cols1, WORD32 cols2, WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift, WORD32 bias_precision, VOID * p_scratch);
WORD32 xa_nn_matXvec_16x16_16_sigmoid
                                                      WORD16 * p_mat2,
(WORD16 * p_out, WORD16 * p_mat1,
WORD16 * p_vec1,
                           WORD16 * p_vec2,
WORD32 cols1,
                                                        VOID * p_bias,
WORD32 cols2,
WORD32 rows,
                         WORD32 COISI, WORD32 COISI, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_precision, VOID * p_scratch);
WORD32 row_stride1,
WORD32 bias_shift,
WORD32 xa_nn_matXvec_8x16_16_tanh
WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift, WORD32 bias_precision, VOID * p_scratch);
WORD32 xa_nn_matXvec_8x16_16_sigmoid
(WORD16 * p_out, WORD8 * p_mat1, WORD8 * p_mat2, WORD16 * p_vec1, WORD16 * p_vec2, VOID * p_bias, WORD32 rows, WORD32 cols1, WORD32 cols2,
WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift,
WORD32 bias_shift,
                            WORD32 bias_precision, VOID * p_scratch);
WORD32 xa_nn_matXvec_8x8_8_tanh
                           WORD8 * p_mat1, WORD8 * p_mat2, WORD8 * p_vec2, VOID * p_bias, WORD32 cols1, WORD32
(WORD8 * p_out, WORD8 * p_mat1,
WORD8 * p_vec1,
WORD32 rows,
WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift, WORD32 bias_precision, VOID * p_scratch);
WORD32 xa_nn_matXvec_8x8_8_sigmoid
(WORD8 * p_out, WORD8 * p_mat1,
                                                        WORD8 * p_mat2,
WORD8 * p_vec1, WORD8 * p_vec2, VOID * p_bias, WORD32 rows, WORD32 cols1, WORD32 cols2, WORD32 row_stride1, WORD32 row_stride2, WORD32 acc_shift, WORD32 bias_shift, WORD32 bias_precision, VOID * p_scratch);
FLOAT32 * p_mat2,
                                                        FLOAT32 * p_bias,
FLOAT32 * p_vec1, FLOAT32 * p_vec2, WORD32 rows, WORD32 cols1, WORD32 row_stride1, WORD32 row_stride2
                                                        WORD32 cols2,
                                                        FLOAT32 * p_scratch);
WORD32 xa_nn_matXvec_f32xf32_f32_sigmoid
(FLOAT32 * p_out, FLOAT32 * p_mat1,
                                                        FLOAT32 * p_mat2,
                            FLOAT32 * p_vec2,
FLOAT32 * p_vec1,
                                                        FLOAT32 * p_bias,
WORD32 rows,
                            WORD32 cols1,
                                                        WORD32 cols2,
WORD32 row_stride1,
                            WORD32 row_stride2
                                                        FLOAT32 * p_scratch);
```



Arguments

| Туре | Name | Size | Description |
|------------------------------------|----------------|------------|--|
| Input | | • | |
| WORD16 *, WORD8 *, FLOAT32 * | p_mat1 | rows*cols1 | Input matrix 1, fixed or floating point |
| WORD16 *, WORD8 *, FLOAT32 * | p_mat2 | rows*cols2 | Input matrix 2, fixed or floating point |
| WORD16 *, WORD8 *, FLOAT32 * | p_vec1 | cols1*1 | Input vector 1, fixed or floating point |
| WORD16 *, WORD8 *, FLOAT32 * | p_vec2 | cols2*1 | Input vector 2, fixed or floating point |
| VOID *, FLOAT32 * | p_bias | rows*1 | Bias vector, fixed or floating point |
| WORD32 | rows | | Number of rows in matrix 1,2, bias and output |
| WORD32 | cols1 | | Number of columns in matrix 1 and rows in vector 1 |
| WORD32 | cols2 | | Number of columns in matrix 2 and rows in vector 2 |
| WORD32 | row_stride1 | | Row offset of matrix 1 |
| WORD32 | row_stride2 | | Row offset of matrix 2 |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | bias_precision | | Precision of bias in bytes |
| Output | | | • |
| WORD8 *, WORD16 *, FLOAT32 * | p_out | rows*1 | Output, fixed (Q7, Q15) or floating point |
| Temporary | | | |
| VOID *, FLOAT32 * | p_scratch | rows*4 | Scratch (temporary) memory pointer |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|---|--|
| <pre>row_stride1, row_stride2, cols1, cols2</pre> | Multiples of 4 (2 in case of floating point) |
| p_mat1, p_mat2, p_vec1, | Aligned on 16-byte boundary |
| p_vec2, p_bias, p_out | Should not overlap |
| p_mat1, p_vec1, p_bias, | Cannot be NULL |
| p_out | |
| acc_shift, bias_shift | {-31,, 31} |
| bias_precision | {-1, 8, 16, 32, 64} (-1 in case of floating point) |



3.1.3 Matrix X Vector Batch Kernels

Description

These kernels perform the operation of multiplication of a single matrix with a series of vectors along with bias addition; that is, zi = mat1*vec1i + bias. These kernels can also be viewed as matrix X matrix-transpose multiplication kernels. The column dimension of mat1 must match the row dimension of vectors in vec1. Bias and resulting output vector sequence z have as many numbers of rows as mat1. vec1 is a sequence of vec_count number of input vectors and bias is added to each resulting vector after multiplication with mat1. Thus, output z has dimensions $rows*vec_count$. vec_count number of input vectors and output vectors are provided as array of pointers arguments to kernel API.

bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output respectively. Both bias_shift and acc_shift can be either positive or negative where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as matXvec multiplication – accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note: acc_shift and bias_shift are not relevant in case of floating point kernels.

The row_stride1 argument is provided in kernel API for row offset of mat1. Note, input matrix is expected to be appropriately padded in case of row_stride1 > cols1.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

Function variants available are xa_nn_matXvec_batch_[p]x[q]_[r], where:

- [p]: Matrix precision in bits
- [q]: Vector precision in bits
- [r]: Output precision in bits

Precision

There are four variants available:

| Туре | Description |
|-------------|---|
| 16x16_64 | 16-bit matrix inputs, 16-bit vector inputs, 64-bit output vectors |
| 8x16_64 | 8-bit matrix inputs, 16-bit vector inputs, 64-bit output vectors |
| 8x8_32 | 8-bit matrix inputs, 8-bit vector inputs, 32-bit output vectors |
| f32xf32_f32 | float32 matrix inputs, float32 vector inputs, float32 output |



Algorithm

$$z_{n,i} = 2^{acc\text{-}shift} \left(\sum_{m=0}^{cols1-1} mat1_{n,m} \cdot vec1_{m,i} + 2^{bias\text{-}shift}bias_n \right),$$

$$n = 0, \dots, \overline{rows - 1} \quad ; \quad i = 0, \dots, \overline{vec\text{-}count - 1}$$

In case of floating point routine, acc_shift=0 and bias_shift=0.

Thus,
$$2^{acc\text{-}shift} = 2^{bias\text{-}shift} = 1$$

Prototype

```
WORD32 xa_nn_matXvec_batch_16x16_64
(WORD64 ** p_out, WORD16 * p_mat1, WORD16 ** p_vec1, WORD16 * p_bias, WORD32 rows, WORD32 cols1, WORD32 row_stride1, WORD32 acc_shift, WORD32 bias_shift
                                                                      WORD32 bias_shift,
 WORD32 vec_count);
WORD32 xa_nn_matXvec_batch_8x16_64
(WORD64 ** p_out, WORD8 * p_mat1,
WORD16 * p_bias, WORD32 rows,
WORD32 row_stride1, WORD32 acc_shift,
                                                                     WORD16 ** p_vec1,
                                                                      WORD32 cols1,
                                                                      WORD32 bias_shift,
 WORD32 vec_count);
WORD32 xa_nn_matXvec_batch_8x8_32
(WORD32 ** p_out, WORD8 * p_mat1, WORD8 ** p_vec1, WORD8 * p_bias, WORD32 rows, WORD32 cols1, WORD32 row_stride1, WORD32 acc_shift, WORD32 bias_shift
                                                                      WORD32 bias_shift,
WORD32 vec_count);
WORD32 xa_nn_matXvec_batch_f32xf32_f32
(FLOAT32 ** p_out, FLOAT32 * p_mat1, FLOAT32 * p_bias, WORD32 rows, WORD32 row_stride1, WORD32 vec_count);
                                                                      FLOAT32 ** p_vec1,
                                                                      WORD32 cols1,
```

Arguments

| Туре | Name | Size | Description |
|---------------------------------------|-------------|---------------------|--|
| Input | | | |
| WORD16 *, WORD8 *, FLOAT32 * | p_mat1 | rows*cols1 | Input matrix, fixed or floating point |
| WORD16 **, WORD8 **, FLOAT32 ** | p_vec1 | cols1*vec_co unt | Input vector pointers, fixed or floating point |
| WORD16 *, WORD8 *, FLOAT32 * | p_bias | rows*1 | Bias vector, fixed or floating point |
| WORD32 | rows | | Number of rows in input matrix, bias and output |
| WORD32 | cols1 | | Number of columns in input matrix and rows in input vector |
| WORD32 | row_stride1 | | Row offset of input matrix |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | vec_count | | Number of input vectors |



| Туре | Name | Size | Description |
|--|-------|--------------------|---|
| Output | | | |
| WORD32 **, WORD64 **, FLOAT32 ** | p_out | rows*vec_cou nt | Output vector pointers, fixed or floating point |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions | |
|--|---|--|
| row_stride1, cols1 | Multiples of 4 (2 in case of floating point) | |
| <pre>p_mat1, p_vec1, p_bias, p_out</pre> | Aligned on 16-byte boundary Should not overlap Cannot be NULL | |
| acc_shift, bias_shift | {-31,, 31} | |

3.1.4 Matrix Multiplication Kernels

Description

These kernels perform the operation of multiplication of a matrix mat1 with another matrix mat2 along with bias addition; that is, z = mat1 * mat2 + bias. The first matrix should be stored in row major order and the second matrix should be stored in column major order. The first matrix is of dimensions $rows \times cols$. The second matrix mat2 is of dimensions $cols \times vec_count$. These kernels can also be viewed as a modification of the Matrix X Vector Batch kernels. The column dimension of mat1 matches the row dimension of mat2 i.e. the length of each vector in p_mat2 . Bias and resulting output vector sequence z have as many numbers of rows as mat1. mat2 is a sequence of vec_count number of input vectors and bias is added to each resulting vector after multiplication with mat1. Thus, output z has dimensions $rows * vec_count$. The arguments vec_offset and out_offset are offsets to the next vector and output addresses. The argument out_stride defines the row offset for the output matrix. For standard matrix multiplication, vec_offset should be equal to cols, out_offset equal to 1 and out_stride should be equal to vec_count i.e. columns of mat2.

The bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output respectively. Both bias_shift and acc_shift can be either positive or negative where positive value denotes a left shift and negative value denotes a right shift.

The bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as multiplication – accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note, the acc_shift and bias_shift arguments are not relevant in case of quantized 8-bit kernels.

The row_stride argument indicates the offset to next row of mat1.



The vec offset argument refers to the column offset of mat2.

Similarly, the <code>out_offset</code> and <code>out_stride</code> arguments refer to the column offset and row offset of the output matrix rows * vec count respectively.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

The arguments, mat1_zero_bias, mat2_zero_bias, are provided to convert the asym8 inputs into their real values and perform matXvec batch operation. The out_zero_bias, out_multiplier and out shift values are used to quantize real values of output back to asym8u.

Function variants available are xa_nn_matmul_[p]x[q]_[r], where:

- [p]: Matrix 1 precision in bits
- [q]: Matrix 2 precision in bits
- [r]: Output precision in bits

Precision

There are two variants available:

| Туре | Description |
|----------------------|---|
| 8x8_8 | 8-bit matrix inputs, 8-bit vector inputs, 8-bit output vectors |
| asym8uxasym8u_asym8u | asym8u matrix inputs, asym8u vector inputs, asym8u output vectors |

Algorithm

$$z_{n,i} = 2^{acc\text{-}shift} \left(\sum_{m=0}^{cols1-1} mat1_{n,m} \cdot mat2_{m,i} + 2^{bias\text{-}shift}bias_n \right),$$

$$n = 0, \dots, \overline{rows-1} \; ; \quad i = 0, \dots, \overline{vec\text{-}count-1}$$

In case asym8u routine, acc_shift=0 and bias_shift=0.

Thus,
$$2^{acc\text{-}shift} = 2^{bias\text{-}shift} = 1$$

Prototype

```
WORD32 xa_nn_matmul_8x8_8

(WORD8 * p_out, WORD8 * p_mat1, WORD8 * p_mat2, WORD8 * p_bias, WORD32 rows, WORD32 cols, WORD32 row_stride, WORD32 acc_shift, WORD32 bias_shift, WORD32 vec_count, WORD32 vec_offset, WORD32 out_offset, WORD32 out_stride);

WORD32 xa_nn_matmul_asym8uxasym8u_asym8u

(UWORD8 * p_out, UWORD8 * p_mat1, UWORD8 * p_mat2, WORD32 * p_bias, WORD32 rows, WORD32 cols,
```



```
WORD32 row_stride, WORD32 vec_count, WORD32 vec_offset, WORD32 out_offset, WORD32 out_stride, WORD32 mat1_zero_bias, WORD32 out_zero_bias); WORD32 out_multiplier, WORD32 out_shift,
```

Arguments

| Туре | Name | Size | Description |
|----------------------|----------------|--------------------|--|
| Input | | • | |
| WORD8 *, UWORD8 * | p_mat1 | rows*cols | Input matrix, fixed point or asym8u |
| WORD8 *, UWORD8 * | p_mat2 | cols * vec_count | Input matrix, fixed or floating point |
| WORD8 *, WORD32 * | p_bias | rows*1 | Bias vector, fixed or floating point |
| WORD32 | rows | | Number of rows in input matrix, bias and output |
| WORD32 | cols | | Number of columns in input matrix and rows in input vector |
| WORD32 | row_stride | | Row offset of input matrix |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | vec_count | | Number of vectors (columns) in matrix 2 |
| WORD32 | vec_offset | | Offset to the next vector address |
| WORD32 | out_offset | | Offset to the next output address |
| WORD32 | out_stride | | Row offset of output matrix |
| WORD32 | mat1_zero_bias | | Zero offset of matrix 1 |
| WORD32 | vec1_zero_bias | | Zero offset of matrix 2 |
| WORD32 | out_multiplier | | Multiplier value of output |
| WORD32 | out_shift | | Shift value of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| Output | | | |
| WORD8 *, UWORD8 * | p_out | rows*vec_ count | Output matrix, fixed-point, floating point or asym8u |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|---|--|
| p_mat1, p_mat2, p_out | Aligned on (size of one element)-byte boundary Cannot be NULL Should not overlap |
| p_bias | Aligned on (size of one element)-byte boundary |
| <pre>acc_shift, bias_shift, out shift</pre> | {-31,, 31} |



| vec_count | Greater than 0 |
|---|-----------------|
| <pre>vec_offset, out_offset, out_stride</pre> | Should not be 0 |
| <pre>mat1_zero_bias, vec1 zero bias</pre> | {-255,, 0} |
| out_multiplier | Greater than 0 |
| out_zero_bias | {0,, 255} |

3.1.5 Matrix X Vector Kernels with Output Stride

Description

These kernels perform a single matXvec operation with bias addition; that is, z = mat1*vec1 + bias. The column dimension of mat1 must match the row dimension of vec1. Bias and resulting output vector z have as many rows as mat1.

row_stride1 is provided in kernel API for row offsets of mat1. Note, input matrices are expected to be appropriately padded in case of row_stride > cols.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

The argument out stride is helpful in storing the output at a given offset.

The argument $vec1_zero_bias$ is provided to convert the quantized 8-bit inputs into their real values and perform matXvec operation. The out_multiplier and out_shift values are used to convert real values of output to 16-bit.

Function variants available are xa_nn_matXvec_[p]x[q]_[r], where:

- [p]: Matrix precision in bits
- [q]: Vector precision in bits
- [r]: Output precision in bits

Precision

There is one variant available:

| Туре | Description | |
|-----------------|--|--|
| sym8sxasym8s_16 | sym8s matrix inputs, asym8s vector inputs, asym8s output | |

Algorithm

$$z_n = \left(\sum_{m=0}^{cols1-1} mat1_{n,m} \cdot vec1_m + bias_n\right)$$



Prototype

```
WORD32 xa_nn_matXvec_out_stride_sym8sxasym8s_16
(WORD16 * p_out, const WORD8 * p_mat1, const WORD8 * p_vec1,
const WORD32 * p_bias, WORD32 rows, WORD32 cols1,
WORD32 row_stride1, WORD32 out_stride, WORD32 vec1_zero_bias,
WORD32 out_multiplier, WORD32 out_shift);
```

Arguments

| Туре | Name | Size | Description | | | |
|-------------------|----------------|------------|---|--|--|--|
| Input | | | | | | |
| const WORD8 * | p_mat1 | rows*cols1 | Input matrix, sym8s | | | |
| const WORD8 * | p_vec1 | cols1*1 | Input vector, asym8s | | | |
| const WORD32 * | p_bias | rows*1 | Bias vector | | | |
| WORD32 | rows | | Number of rows in matrix and number of elements in bias | | | |
| WORD32 | cols1 | | Number of columns in matrix and elements in vector | | | |
| WORD32 | row_stride1 | | Row offset of matrix | | | |
| WORD32 | out_stride | | Row offset of output | | | |
| WORD32 | vec1_zero_bias | | Zero offset of vector | | | |
| WORD32 | out_multiplier | | Multiplier value of output | | | |
| WORD32 | out_shift | | Shift value of output | | | |
| Output | | | | | | |
| WORD16 * | p_out | rows*1 | Output, 16-bit | | | |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|-------------------------|---|
| row_stride1, cols1 | row_stride1 >= cols1 |
| | |
| p_mat1, p_vec1, p_bias, | Aligned on <size element="" of="" one=""> boundary</size> |
| p_out | Should not overlap |
| p_mat1, p_vec1, p_out | Cannot be NULL |
| out_shift | {-31,, 31} |
| vec1_zero_bias | {-127, 128} for asym8s |
| out_multiplier | Greater than 0 |

3.2 Convolution Kernels

3.2.1 Standard 2D Convolution Kernel

Description

These kernels perform the 2D convolution operation as z = inp(*) kernel + bias. A 3D input cube (input_height x input_width x input_channels), is convolved with a 3D kernel cube (kernel_height x kernel_width x input_channels) to produce a 2D convolution output plane (out_height x out_width). With out_channels number of such 3D kernels, output cube (out_height x out_width x out_channels) is produced. The bias having dimension (out_channels) is added after the convolution (one bias value is added to each output channel) to produce the final output.

Note: The depth or channels dimension (input_channels) of input and kernel must be identical for 2D convolution.

bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output, respectively. Both bias_shift and acc_shift can be either positive or negative where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as convolution - accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note: acc_shift and bias_shift are not relevant in case of floating point kernels and quantized 8-bit kernels.

The x_stride and y_stride arguments in kernel API define the step size of the kernel when traversing the input in width and height dimensions respectively.

The $x_{padding}$ argument defines padding to the left of the input in the width dimension and the $y_{padding}$ argument defines padding to the top of the input in the height dimension.

```
The right padding is calculated based on out_width as right_paddding = kernel_width + (out_width - 1) * x_stride - (x_padding + input_width).
```

The bottom padding is calculated based on out_height as bottom_paddding = kernel_height + (out_height - 1) * y_stride - (y_padding + input_height).

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

The kernel is expected to be padded in the depth or channels dimension if the number of input_channels is not a multiple of 4 in case of fixed point variants other than the 8x8 and asym8uxasym8u variant, and 2 in case of floating point variant. No padding is needed for 8x8 and asym8uxasym8u variant.



These kernels require temporary buffer for convolution computation. This temporary buffer is provided by p_scratch argument of kernel API. The size of temporary buffer should be queried using xa_nn_conv2d_std_getsize() helper API.

These kernels expect input and kernel cubes in SHAPE_CUBE_DWH_T shape type and can produce output cube in either SHAPE_CUBE_DWH_T or SHAPE_CUBE_WHD_T shape type. The out_data_format argument to kernel API controls the output cube shape type.

Function variants available are xa_nn_conv2d_std_[p]x[q], where:

- [p]: Kernel precision in bits
- [q]: Input precision in bits

Precision

There are five variants available.

| Туре | Description | |
|---------------|---|--|
| 16x16 | 16-bit kernel, 16-bit input, 16-bit output | |
| 8x16 | 8-bit kernel, 16-bit input, 16-bit output | |
| 8x8 | 8-bit kernel, 8-bit input, 8-bit output | |
| f32 | float32 kernel, float32 input, float32 output | |
| asym8uxasym8u | asym8u kernel, asym8u input, asym8u output | |

Algorithm

$$\begin{split} z_{h,w,d} &= 2^{acc\text{-}shift} \left(\sum_{i=0}^{K_H-1} \sum_{j=0}^{K_W-1} \sum_{k=0}^{I_C-1} in_{pad}{}_{(h*y\text{-}stride+i),(w*x\text{-}stride+j),k} \cdot ker_{pad}{}_{d,i,j,k} \right. \\ &+ 2^{bias\text{-}shift} b_d \left. \right) \\ h &= 0, \dots, \overline{out\text{-}height-1}, w = 0, \dots, \overline{out\text{-}width-1}, \\ d &= 0, \dots, \overline{out\text{-}channels-1} \end{split}$$

In case of floating-point kernels and quantized 8-bit kernels, acc_shift=0 and bias_shift=0.

Thus,
$$2^{acc\text{-}shift} = 2^{bias\text{-}shift} = 1$$

 in_{pad} , ker_{pad} denote the padded p_inp and padded p_ker shapes, respectively.

 K_H , K_W , I_C denote kernel_height, kernel_width, and input_channels, respectively.

b denotes the bias shape.

Prototype

WORD32 xa_nn_conv2d_std_getsize



```
WORD32 input_channels, WORD32 kernel_height,
(WORD32 input_height,
WORD32 kernel_width,
                               WORD32 y_stride, WORD32 y_padding,
WORD32 out_height,
                               WORD32 input_precision);
WORD32 xa_nn_conv2d_std_16x16
(WORD16 * p_out, WORD16 * p_inp,
                                                             WORD16 * p_ker,
WORD16 * p_bias,
                               WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width ,
WORD32 out_channels, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 bias_shift, WORD32 acc_shift,
WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_std_8x16
(WORD16 * p_out, WORD16 * p_inp,
                                                             WORD8 * p_ker,
WORD16 * p_bias,
                               WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 out_channels, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 bias_shift, WORD32 acc_shift,
WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_std_8x8
(WORD8 * p_out, WORD8 * p_inp,
                                                           WORD8 * p_ker,
WORD8 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 out_channels, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 bias_shift, WORD32 acc_shift,
WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_std_f32
(FLOAT32 * p_out, FLOAT32 * p_inp,
                                                            FLOAT32 * p_ker,
FLOAT32 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 out_channels, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_std_asym8uxasym8u
(UWORD8 * p_out, const UWORD8 * p_inp, const UWORD8 * p_ker, WORD32 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 out_channels, WORD32 x_stride, WORD32 y_stride,
WORD32 x_padding, WORD32 y_padding, WORD32 out_height,
WORD32 out_width, WORD32 input_zero_bias, WORD32 out_shift, WORD32 out_zero_bias,
WORD32 out_shift, WORD32 out_zero_bias,
WORD32 out_data_format, VOID * p_scratch);
```

Arguments

| Туре | Name | Size | Description |
|-------------------------------------|-------|--|--|
| Input | | | |
| WORD16 *, WORD8 *, const FLOAT32 *, | p_inp | <pre>input_height* input width* input_channels</pre> | Input cube, fixed, floating point or asym8u, in SHAPE_CUBE_DWH_T |
| const | | | |



| WORD16 *, | p_ker | out_channels* | Kernel cube, fixed, |
|------------------------|------------------|-----------------|----------------------------|
| WORD8 *, | r=···· | (kernel_height | floating point or asym8u, |
| const | | * | in |
| FLOAT32 *, | | kernel width* | SHAPE_CUBE_DWH_T |
| UWORD8 * | | input_channels | OTAL E_CODE_DWILL |
| WORD16 *, | p_bias | out channels | Bias vector, fixed or |
| WORD8 *, | p_0140 | 040_01141111020 | floating point |
| FLOAT32 *, | | | noating point |
| WORD32 * WORD32 | input_height | | Input height |
| WORD32 | input_width | | Input width |
| WORD32 | input_channels | | Number of input |
| | inpac_enamicis | | channels |
| WORD32 | kernel_height | | Kernel height |
| WORD32 | kernel_width | | Kernel width |
| WORD32 | out_channels | | Number of output |
| | Out_Chaimers | | channels |
| WORD32 | x_stride | | Horizontal stride over |
| | x_stride | | input |
| WORD32 | y_stride | | Vertical stride over input |
| WORD32 | x_padding | | Left padding width on |
| | x_padding | | input |
| WORD32 | y_padding | | Top padding height on |
| ordol | y_padding | | input |
| WORD32 | out_height | | Output height |
| WORD32 | out_width | | Output width |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | acc_shift | | Shift applied to |
| | | | accumulator |
| WORD32 | input_zero_bias | | Zero offset of input |
| WORD32 | kernel_zero_bias | | Zero offset of kernel |
| WORD32 | out_multiplier | | Multiplier value of output |
| WORD32 | out_shift | | Shift value of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| WORD32 | out_data_format | | Output data format |
| | | | 0:SHAPE_CUBE_DWH_ |
| | | | T |
| | | | 1:SHAPE_CUBE_WHD_ |
| | | | T |
| VOID * | p_scratch | xa_nn_conv2d_s | Scratch memory pointer |
| | | td_getsize() | - 7 F |
| Output | | | |
| WORD16 *, | p_out | (out_height* | Output cube, fixed, |
| WORD8 *, FLOAT32 *, | | out_width) * | floating point or asym8u, |
| UWORD8 * | | out_channels | as per the |
| | | | out_data_format |
| | | | argument. |

Returns

- 0: no error
- -1: error, invalid parameters



Restrictions

| Arguments | Restrictions | |
|--|--|--|
| p_out, p_inp, p_ker, p_bias, | Cannot be NULL | |
| p_scratch | Should not overlap | |
| | Aligned on 16-byte boundary except for asym8u | |
| | kernel where only p_scratch is required to be 16- byte aligned. | |
| | For p_scratch - memory size >= size returned by | |
| | xa_nn_conv2d_std_getsize() | |
| <pre>input_height, input_width, input_channels</pre> | Greater than or equal to 1 | |
| kernel_height | {1, 2,, input_height} | |
| kernel_width | {1, 2,, input_width} | |
| out_channels | Greater than or equal to 1 | |
| x_stride | {1, 2,, kernel_width} | |
| y_stride | Greater than or equal to 1 | |
| x_padding, y_padding | Greater than or equal to 0 | |
| out_height, out_width | Greater than or equal to 1 | |
| <pre>acc_shift, bias_shift, out_shift</pre> | {-31 31} for fixed point and quantized 8-bit APIs | |
| input_zero_bias | {-255,, 0} for asym8u input, {-127, 128} for | |
| | asym8s input | |
| kernel_zero_bias | {-255, 0} for asym8u kernel | |
| out_zero_bias | {0,,255} for asym8u output, {-128, 127} for | |
| | asym8s output | |
| out_multiplier | Greater than 0 | |
| out_data_format | Can be 0: SHAPE_CUBE_DWH_T or | |
| | 1: SHAPE_CUBE_WHD_T | |

3.2.2 Standard 1D Convolution Kernel

Description

These kernels perform the 1D convolution operation as z = inp(*) kernel + bias. A 3D input cube (input_height x input_width x input_channels) is convolved with a 3D kernel cube (kernel_height x input_width x input_channels) to produce a 1D convolution output vector (out_height). With out_channels number of such 3D kernels, output matrix (out_height x out_channels) is produced. The bias having dimension (out_channels) is added after the convolution (one bias value is added to each output column) to produce the final output.

Note: The depth or channels dimension (input_channels) of input and kernel must be identical, and width dimension (input_width) of input and kernel also must be identical for 1D convolution.

bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output, respectively. Both bias_shift and acc_shift can be either positive or negative, where positive value denotes a left shift and negative value denotes a right shift.



bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as convolution - accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note: acc_shift and bias_shift are not relevant in case of floating point kernels.

The y_stride argument to kernel API defines the step size of the kernel when traversing the input in height dimension.

The y_padding argument defines padding to the top of the input in the height dimension.

The bottom padding is calculated based on out_height as bottom_paddding = kernel_height + (out_height - 1) * y_stride - (y_padding + input_height).

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

The kernel is expected to be padded if the product input_channels*input_width is not a multiple of 4 in case of fixed point variants, and 2 in case of floating point variant.

These kernels require temporary buffer for convolution computation. This temporary buffer is provided by p_scratch argument of kernel API. The size of temporary buffer should be queried using xa_nn_conv1d_std_getsize() helper API.

These kernels expect input and kernel cubes in SHAPE_CUBE_DWH_T shape type and can produce output matrix with either (out_height \times out_channels) or (out_channels \times out_height) dimensions. The out_data_format argument to kernel API controls the output matrix height and width order.

Function variants available are xa_nn_conv1d_std_[p], where:

[p]: precision in bits

Precision

There are four variants available:

| Туре | Description |
|-------|---|
| 16x16 | 16-bit kernel, 16-bit input, 16-bit output |
| 8x16 | 8-bit kernel, 16-bit input, 16-bit output |
| 8x8 | 8-bit kernel, 8-bit input, 8-bit output |
| f32 | float32 kernel, float32 input, float32 output |



Algorithm

$$\begin{split} z_{h,d} &= 2^{acc\text{-}shift} \left(\sum_{i=0}^{K_H-1} \sum_{j=0}^{I_W-1} \sum_{k=0}^{I_C-1} in_{pad}{}_{(h*y\text{-}stride+i),j,k} \cdot ker_{pad}{}_{d,i,j,k} \right. \\ &+ 2^{bias\text{-}shift} b_d \right) \\ h &= 0, \dots, \overline{out\text{-}height} - 1, d = 0, \dots, \overline{out\text{-}channels} - 1 \end{split}$$

In case of floating point kernel, acc_shift=0 and bias_shift=0.

Thus,
$$2^{acc-shift} = 2^{bias-shift} = 1$$

 n_{pad} , ker_{pad} denote the padded p_inp and padded p_ker shapes, respectively.

 K_H , I_W , I_C denote kernel_height, input_width, and input_channels, respectively.

b denotes the bias shape.

```
WORD32 xa_nn_conv1d_std_getsize
(WORD32 kernel_height, WORD32 input_width, WORD32 input_channels,
WORD32 input_precision);
WORD32 xa_nn_conv1d_std_16x16
(WORD16 * p_out, WORD16 * p_inp, WORD16 * p_ker, WORD16 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 out_channels,
WORD32 y_stride, WORD32 y_padding, WORD32 out_height, WORD32 bias_shift, WORD32 acc_shift, WORD32 out_data_format,
VOID * p_scratch);
WORD32 xa_nn_conv1d_std_8x16
(WORD16 * p_out, WORD16 * p_inp, WORD8 * p_ker, WORD16 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 out_channels,
WORD32 y_stride, WORD32 y_padding, WORD32 out_height, WORD32 bias_shift, WORD32 acc_shift, WORD32 out_data_format,
VOID * p_scratch);
WORD32 xa_nn_conv1d_std_8x8
(WORD8 * p_out, WORD8 * p_inp, WORD8 * p_ker, WORD8 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 out_channels,
WORD32 y_stride, WORD32 y_padding, WORD32 out_height, WORD32 bias_shift, WORD32 acc_shift, WORD32 out_data_format,
VOID * p_scratch);
WORD32 xa_nn_conv1d_std_f32
(FLOAT32 * p_out, FLOAT32 * p_inp, FLOAT32 * p_ker, FLOAT32 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 out_channels,
WORD32 y_stride, WORD32 y_padding,
                                                           WORD32 out_height,
WORD32 out_data_format, VOID * p_scratch);
```



Arguments

| Туре | Name | Size | Description |
|-------------------------------------|-----------------|---|---|
| Input | • | • | |
| WORD16 *, WORD8 *, FLOAT32 *, | p_inp | input_height* input width* input_channels | Input cube, fixed or floating point, in SHAPE_CUBE_DWH_T |
| WORD16 *, WORD8 *, FLOAT32 *, | p_ker | <pre>out_channels* (kernel_height* input width* input_channels)</pre> | Kernel cube, fixed or floating point, in SHAPE_CUBE_DWH_T |
| WORD16 *, WORD8 *, FLOAT32 *, | p_bias | out_channels | Bias vector, fixed or floating point |
| WORD32 | input_height | | Input height |
| WORD32 | input_width | | Input width |
| WORD32 | input_channels | | Number of input channels |
| WORD32 | kernel_height | | Kernel height |
| WORD32 | out_channels | | Number of output channels |
| WORD32 | y_stride | | Vertical stride over input |
| WORD32 | y_padding | | Top padding height on input |
| WORD32 | out_height | | Output height |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | out_data_format | | Output matrix order 0: out_height x out_channels 1: out_channels x out_height |
| VOID * | p_scratch | <pre>xa_nn_conv1d_st d_getsize()</pre> | Scratch memory pointer |
| Output | | | |
| WORD16 *, WORD8 *, FLOAT32 *, | p_out | out_height* out_channels | Output matrix, fixed or floating point, as per the out_data_format argument. |

Returns

- 0: no error
- -1: error, invalid parameters



Restrictions

| Arguments | Restrictions | |
|-----------------------|---------------------------------------|--|
| p_out, p_inp, p_ker, | Cannot be NULL | |
| p_bias, p_scratch | Should not overlap | |
| | Aligned on 16-byte boundary | |
| | For p_scratch - memory size >= size | |
| | returned by | |
| | <pre>xa_nn_conv1d_std_getsize()</pre> | |
| input_height, | Greater than or equal to 1 | |
| input_width, | | |
| input_channels | | |
| kernel_height | {1, 2,, input_height} | |
| out_channels | Greater than or equal to 1 | |
| y_stride | {1, 2,, kernel_height} | |
| y_padding | Greater than or equal to 0 | |
| out_height | Greater than or equal to 1 | |
| acc_shift, bias_shift | {-31 31} for fixed point APIs | |
| out_data_format | Can be 0: out_height x | |
| | out_channels or | |
| | 1:out_channels x out_height | |

3.2.3 Depthwise Separable 2D Convolution Kernel

Depthwise Separable 2D Convolution is computed in two steps using following two low level kernels:

First step: xa_nn_conv2d_depthwise_xx() low level kernel

These kernels convolve each input 2D plane (input_height x input_width) from input cube (input_height x input_width x input_channels) with channels_multiplier number of 2D kernels (kernel_height x kernel_width) to produce channels_multiplier number of 2D output planes (out_height x out_width). Thus, with kernel cube of dimension (kernel_height x kernel_width x (channels_multiplier * input_channels)), output cube of dimension (out_height x out_width x (channels_multiplier * input_channels)) is produced. Bias is added to the convolution output. There is one bias value for each output 2D plane; that is, bias is a vector of dimension (channels_multiplier * input_channels).

Second step: xa_nn_conv2d_pointwise_xx()low level kernel

These kernels take output cube (out_height x out_width x (channels_multiplier * input_channels)) of first step as input and perform pointwise multiplication with kernel vector (channels_multiplier * input_channels) in depth dimension to produce output 2D plane (out_height x out_width). Thus, with out_channels kernel vectors, output cube of dimension (out_height x out_width x out_channels) is produced. Bias is added to the pointwise multiplication output. There is one bias value for each output 2D plane; that is, bias is a vector of dimension out_channels.



Note: For depthwise separable 2D convolution, (channels_multiplier * input_channels) must be multiple of 4 (see Section 3.2.3.2 for details).

Following are the descriptions for these two low level kernels.

3.2.3.1 Depthwise 2D Convolution Kernel

Description

These kernels perform the 2D depthwise convolution operation as z=inp (*) kernel + bias. These kernels convolve each input 2D plane (input_height x input_width) from input cube (input_height x input_width x input_channels) with channels_multiplier number of 2D kernels (kernel_height x kernel_width) to produce channels_multiplier number of 2D output planes (out_height x out_width). Thus, with kernel cube of dimension (kernel_height x kernel_width x (channels_multiplier * input_channels)), output cube of dimension (out_height x out_width x (channels_multiplier * input_channels)) is produced. Bias is added to the convolution output. There is one bias value for each output 2D plane; that is, bias is a vector of dimension (channels_multiplier * input_channels).

bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output respectively. Both bias_shift and acc_shift can be either positive or negative where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as convolution - accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note: acc_shift and bias_shift are not relevant in case of floating point kernels and quantized 8-bit kernels.

The x_stride and y_stride arguments in kernel API define the step size of the kernel when traversing the input in width and height dimensions, respectively.

The x_padding argument defines padding to the left of the input in the width dimension, and y_padding argument defines padding to the top of the input in the height dimension.

```
The right padding is calculated based on out_width as right_paddding = kernel_width + (out_width - 1) * x_stride - (x_padding + input_width).
```

The bottom padding is calculated based on out_height as bottom_paddding = kernel_height + (out_height - 1) * y_stride - (y_padding + input_height).

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

These kernels require a temporary buffer for convolution computation. This temporary buffer is provided by the p_scratch argument of kernel API. The size of temporary buffer should be queried using xa_nn_conv2d_depthwise_getsize() helper API.



The arguments <code>input_zero_bias</code>, <code>kernel_zero_bias</code> are provided to convert the quantized 8-bit inputs into their real values and perform Depthwise 2D Convolution operation. The <code>out_zero_bias</code>, <code>out_multiplier</code> and <code>out_shift</code> values are used to quantize real values of output back to 8-bit.

The depthwise kernels expect input cube in SHAPE_CUBE_DWH_T and SHAPE_CUBE_WHD_T shape type and produce output cube in SHAPE_CUBE_DWH_T shape type respectively. The inp data format argument to the kernel API can be 0 or 1 to indicate input cube shape respectively.

The out_data_format argument to the kernel API must be 0 for all the kernels to indicate output cube shape.

Function variants available are xa_nn_conv2d_depthwise_[p], where:

[p]: precision in bits

Precision

There are six variants available:

| Туре | Description | |
|---------------------------|---|--|
| 16x16 | 16-bit kernel, 16-bit input, 16-bit output | |
| 8x16 | 8-bit kernel, 16-bit input, 16-bit output | |
| 8x8 | 8-bit kernel, 8-bit input, 8-bit output | |
| f32 | float32 kernel, float32 input, float32 output | |
| asym8uxasym8u | asym8u kernel, asym8u input, asym8u output | |
| per_chan_sym8s xasym8s | per channel quantized sym8s kernel, asym8s input, asym8s output | |

Algorithm

$$\begin{split} z_{h,w,d*C_M+m} &= 2^{acc\text{-}shift} \, \left(\sum_{i=0}^{K_H-1} \sum_{j=0}^{K_W-1} in_{pad}_{(h*y\text{-}stride+i),(w*x\text{-}stride+j),d} \right. \\ & \cdot \, ker_{pad}_{i,j,(d*C_M+m)} \, + 2^{bias\text{-}shift} \, b_{0,0,d*C_M+m} \, \right) \\ h &= 0, \dots, \overline{out\text{-}height-1}, w = 0, \dots, \overline{out\text{-}width-1} \, , \\ d &= 0, \dots, \overline{input\text{-}channels-1}, \\ m &= 0, \dots, \overline{channels\text{-}multiplier-1} \end{split}$$

In case of floating-point kernel and quantized 8-bit kernels, acc_shift=0 and bias_shift=0.

Thus,
$$2^{acc-shift} = 2^{bias-shift} = 1$$

inpad, kerpad denote the padded p_inp and padded p_ker shapes, respectively.

 K_H , K_W , C_M denote kernel_height, kernel_width, and channels_multiplier, respectively.

b denotes the bias shape.



```
WORD32 xa nn conv2d depthwise getsize
WORD32 xa_nn_conv2d_deptnwise_getsize
(WORD32 input_height, WORD32 input_width WORD32 input_channels,
WORD32 kernel_height, WORD32 kernel_width, WORD32 channels_multiplier,
WORD32 x stride, WORD32 y_stride, WORD32 x_padding,
 WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 output_height, WORD32 output_width,
 WORD32 circ buf precision, WORD32 inp data format);
WORD32 xa_nn_conv2d_depthwise_16x16
(WORD16 * p_out, WORD16 * p_ker, WORD16 * p_inp,
WORD16 * p_bias, WORD32 input_height, WORD32 input_width,
 WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
 WORD32 input_channels, WORD32 Kerner_nerght, ......
WORD32 channels_multiplier, WORD32 x_stride, WORD32 y_stride,
WORD32 ...padding WORD32 y_padding, WORD32 out_height,
WORD32 x_padding, WORD32 y_padding,
                                       WORD32 acc_shift, WORD32 bias_shift,
 WORD32 out_width,
 WORD32 inp_data_format, WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_depthwise_8x16
(WORD16 * p_out, WORD8 * p_ker, WORD16 * p_inp,
WORD16 * p_bias, WORD32 input_height, WORD32 input_wi
WORD16 * p_bias, WORD32 input_height, WORD32 input_width, WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 x_padding, WORD32 y_padding,
                                     WORD32 y_padding, WORD32 Out_Height, WORD32 acc_shift, WORD32 bias_shift,
 WORD32 out_width,
 WORD32 inp_data_format, WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_depthwise_8x8
(WORD8 * p_out, WORD8 * p_ker, WORD8 * p_inp,
WORD8 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 input_channels, WORD32 kernet_nerg..., ...
WORD32 channels_multiplier, WORD32 x_stride, WORD32 y_stride, WORD32 out_height,
WORD32 x_padding, WORD32 y_padding,
                                     WORD32 acc_shift, WORD32 bias_shift,
WORD32 out_width,
WORD32 inp_data_format, WORD32 out_data_format, VOID * p_scratch);
WORD32 xa_nn_conv2d_depthwise_f32
(FLOAT32 * p_out, FLOAT32 * p_ker, FLOAT32 * p_inp,
FLOAT32 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 channels_multiplier, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height,
                                       WORD32 inp_data_format, WORD32 out_data_format,
 WORD32 out_width,
VOID * p_scratch);
WORD32 xa nn_conv2d_depthwise_asym8uxasym8u
(pUWORD8 p_out, const UWORD8 * p_kernel, const UWORD8 * p_inp, const WORD32 * p_bias, WORD32 input_height, WORD32 input_width, WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width,
WORD32 channels_multiplier, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 input_zero_bias, WORD32 kernel_zero_bias,
 WORD32 out_multiplier, WORD32 out_shift, WORD32 out_zero_bias, WORD32 inp_data_format, WORD32 out_data_format, pVOID p_scratch);
WORD32 xa nn conv2d_depthwise_per_chan_sym8sxasym8s
(pWORD8 p_out, const WORD8 * p_kernel, const WORD8 ^ p_inp const WORD32 * p_bias, WORD32 input_height, WORD32 input_channels, WORD32 kernel_height, WORD32 kernel_width, WORD32 y stride.
                              const WORD8 * p_kernel, const WORD8 * p inp,
WORD32 channels, WORD32 kernel_height, WORD32 kernel_widt WORD32 channels_multiplier,WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 input zero biol
                                                                            WORD32 kernel width,
 WORD32 out width,
                                       WORD32 input_zero_bias, const WORD32 * p_out_multiplier,
 const WORD32 * p out shift, WORD32 out_zero_bias,
                                                                             WORD32 inp data format,
 WORD32 out data format, pVOID p scratch);
```



Arguments

| Туре | Name | Size | Description |
|---|-------------------------|--|--|
| Input | | | |
| WORD16 *, WORD8 *, FLOAT32 *, const UWORD8 *, const WORD8 * | p_ker | kernel_height* kernel width* input_channels* channels_multiplier | Kernel cube, fixed, floating point, asym8u or sym8s, in SHAPE_CUBE_D WH or SHAPE_CUBE_W HD_T |
| WORD16 *, WORD8 *, FLOAT32 *, const UWORD8 *, const WORD8 * | p_inp | input_height* input width* input_channels | Input cube, fixed, floating point, asym8u or asym8s in SHAPE_CUBE_D WH or SHAPE_CUBE_W HD_T |
| WORD16 *, WORD8 *, FLOAT32 *, const WORD32 * | p_bias | input_channels*chann els_multiplier | Bias vector, fixed or floating point |
| WORD32 | input_height | | Input height |
| WORD32 | input_width | | Input width |
| WORD32 | input_channels | | Number of input channels |
| WORD32 | kernel_height | | Kernel height |
| WORD32 | kernel_width | | Kernel width |
| WORD32 | channels_multipl ier | | Multiplier value for each input channel |
| WORD32 | x_stride | | Horizontal stride over input |
| WORD32 | y_stride | | Vertical stride over input |
| WORD32 | x_padding | | Left padding width on input |
| WORD32 | y_padding | | Right padding height on input |
| WORD32 | out_height | | Output height |
| WORD32 | out_width | | Output width |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | input_zero_bias | | Zero offset of input |
| WORD32 | kernel_zero_bias | | Zero offset of kernel |
| WORD32 | out_multiplier | | Multiplier value of output |



| Туре | Name | Size | Description |
|---|------------------|--|---|
| WORD32 | out_shift | | Shift value of output |
| WORD32 * | p_out_multiplier | input_channels*chann els_multiplier | Array of multiplier values of output |
| WORD32 * | p_out_shift | input_channels*chann els_multiplier | Array of shift values of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| WORD32 | inp_data_format | | Input and Kernel data format 0:SHAPE_CUBE_ DWH_T 1:SHAPE_CUBE_ WHD_T |
| WORD32 | out_data_format | | Output data format 0:SHAPE_CUBE_ DWH_T |
| VOID * | p_scratch | xa_nn_conv2d_depthwi se_getsize() | Scratch memory pointer |
| Output | | | |
| WORD16 *, WORD8 *, UWORD8 * FLOAT32 *, | p_out | out_height* out width* input_channels* channels_multiplier | Output cube, fixed, floating point, asym8u or asym8s, in SHAPE_CUBE_D WH_T |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions | |
|------------------------------|---|--|
| p_out, p_ker, p_inp, p_bias, | Cannot be NULL | |
| | Should not overlap | |
| | Aligned on <size element="" of="" one=""> boundary</size> | |
| p_scratch | Cannot be NULL | |
| | Should not overlap with other buffers | |
| | Aligned on 16-byte boundary | |
| | For p_scratch - memory size >= size | |
| | returned by | |
| | xa_nn_conv2d_depthwise_getsize(| |
| |) | |
| p_out_multiplier | Cannot be NULL | |
| | Should not overlap | |
| | Aligned on 4-byte boundry | |
| p_out_shift | Cannot be NULL | |



| | Should not overlap |
|----------------------------|---|
| | Aligned on 4-byte boundry |
| | Each 32-bit value should be in range [-31 31] |
| input_height, input_width, | Greater than or equal to 1 |
| input_channels | |
| kernel_height | {1,2,, input_height} |
| kernel_width | {1,2,, input_width} |
| channels_multiplier | Greater than or equal to 1 |
| x_stride | {1,2,, kernel_width} |
| y_stride | {1,2,, kernel_height} |
| x_padding, y_padding | Greater than or equal to 0 |
| out_height, out_width | Greater than or equal to 1 |
| acc_shift,bias_shift, | {-31 31} for fixed point and quantized 8-bit APIs |
| out_shift | |
| input_zero_bias | {-255,, 0} for asym8u input, {-127, 128} for |
| | asym8s input |
| kernel_zero_bias | {-255, 0} for asym8u kernel |
| out_zero_bias | {0,,255} for asym8u output, {-128, 127} for |
| | asym8s output |
| out_multiplier | Greater than 0 |
| inp_data_format | can be 0: SHAPE_CUBE_DWH_T or 1: |
| | SHAPE_CUBE_WHD_T |
| out_data_format | must be 0: SHAPE_CUBE_DWH_T |

3.2.3.2 Pointwise 2D Convolution Kernel

Description

These kernels perform pointwise multiplication of input cube (input_height x input_width x input_channels) with kernel vector (input_channels) in depth dimension to produce output 2D plane (input_height x input_width). Thus, with out_channels kernel vectors, output cube of dimension (input_height x input_width x out_channels) is produced. Bias is added to the pointwise multiplication output. There is one bias value for each output 2D plane; that is, bias is a vector of dimension out_channels.

The bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output respectively. Both bias_shift and acc_shift can be either positive or negative, where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as convolution - accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note: acc_shift and bias_shift are not relevant in case of floating point kernels and quantized 8-bit kernels.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.



These kernels expect input cube in SHAPE_CUBE_DWH_T shape type, kernel as matrix, bias as vector and produce output cube in SHAPE_CUBE_WHD_T or SHAPE_CUBE_DWH_T (only for 8x8 and asym8u kernels) shape type. The out_data_format argument to kernel API must be always 1 except for 8x8 and asym8u kernels for which it can be 0 or 1 indicating SHAPE_CUBE_DWH_T and SHAPE_CUBE_WHD_T respectively.

Function variants available are xa_nn_conv2d_pointwise_[p], where:

[p]: precision in bits

Precision

There are five variants available:

| Туре | Description |
|---------------|---|
| 16x16 | 16-bit kernel, 16-bit input, 16-bit output |
| 8x16 | 8-bit kernel, 16-bit input, 16-bit output |
| 8x8 | 8-bit kernel, 8-bit input, 8-bit output |
| f32 | float32 kernel, float32 input, float32 output |
| asym8uxasym8u | asym8u kernel, asym8u input, asym8u output |

Algorithm

$$\begin{split} z_{h,w,d} &= 2^{acc\text{-}shift} \left(\sum_{k=0}^{I_{c}-1} in_{h,w,k} \cdot ker_{d,0,0,k} + 2^{bias\text{-}shift} \, b_{0,0,d} \right) \\ h &= 0, \dots \overline{input\text{-}height-1}, w = 0, \dots \overline{input\text{-}width-1}, \\ d &= 0, \dots \overline{out_{channels}-1} \end{split}$$

In case of floating-point kernel and quantized 8-bit kernels, acc_shift=0 and bias_shift=0. Thus, $2^{acc-shift} = 2^{bias-shift} = 1$

in, ker denote the p_inp, and p_ker shapes respectively.

 I_C denotes input_channels

b denotes the bias shape

```
WORD32 xa_nn_conv2d_pointwise_16x16

(WORD16 * p_out, WORD16 * p_ker, WORD16 * _inp,
WORD16 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 out_channels, WORD32 acc_shift,
WORD32 bias_shift, WORD32 out_data_format);

WORD32 xa_nn_conv2d_pointwise_8x16

(WORD16 * p_out, WORD8 * p_ker, WORD32 input_width,
WORD32 input_channels, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 out_channels, WORD32 acc_shift,
WORD32 bias_shift, WORD32 out_data_format);
WORD32 xa_nn_conv2d_pointwise_8x8

(WORD8 * p_out, WORD8 * p_ker, WORD8 * p_inp,
```



```
WORD32 input_channels, WORD32 out_channels, WORD32 acc_shift,
WORD32 bias_shift, WORD32 out_data_format);
WORD32 xa_nn_conv2d_pointwise_f32
(FLOAT32 * p_out, FLOAT32 * p_ker, FLOAT32 * p_inp,
FLOAT32 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 out_channels,
WORD32 out_data_format);
WORD32 xa_nn_conv2d_pointwise_asym8uxasym8u
(UWORD8 * p_out, const UWORD8 * p_ker, const UWORD8 * p_inp,
WORD32 * p_bias, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 input_height, WORD32 input_width,
WORD32 input_channels, WORD32 out_channels, WORD32 input_zero_bias,
WORD32 out_zero_bias, WORD32 out_data_format);
WORD32 out_zero_bias, WORD32 out_data_format);
```

Arguments

| Туре | Name | Size | Description |
|-------------------------------------|------------------|---|--|
| Input | | | |
| WORD16 *, WORD8 *, FLOAT32 *, | p_ker | out_channels * input_channels | Kernel matrix, fixed or floating point (out_channels x |
| WORD16 *, WORD8 *, FLOAT32 *, | p_inp | input_height* input width* input_channels | Input_channels) Input cube, fixed or floating point, in SHAPE_CUBE_DWH_T |
| WORD16 *, WORD8 *, FLOAT32 *, | p_bias | out_channels | Bias vector, fixed or floating point |
| WORD32 | input_height | | Input height |
| WORD32 | input_width | | Input width |
| WORD32 | input_channels | | Number of input channels |
| WORD32 | out_channels | | Number of output channels |
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | input_zero_bias | | Zero offset of input |
| WORD32 | kernel_zero_bias | | Zero offset of kernel |
| WORD32 | out_multiplier | | Multiplier value of output |
| WORD32 | out_shift | | Shift value of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| WORD32 | out_data_format | | Output data format 1:SHAPE_CUBE_WHD_T |

Returns

- 0: no error
- -1: error, invalid parameters



Restrictions

| Arguments | Restrictions |
|---|--|
| p_out, p_ker, p_inp, p_bias | Cannot be NULL |
| | Should not overlap |
| | Aligned on 16-byte boundary except for 8x8 and |
| | asym8u kernels |
| input_height, input_width | Greater than or equal to 1 |
| input_channels | Greater than or equal to 4, multiple of 4 except for |
| | 8x8 and asym8u kernels |
| out_channels | Greater than or equal to 1 |
| <pre>acc_shift, bias_shift, out_shift</pre> | {-31 31} for fixed point and quantized 8-bit APIs |
| input_zero_bias | {-255,, 0} for asym8u input, {-127, 128} for |
| | asym8s input |
| kernel_zero_bias | {-255, 0} for asym8u kernel |
| out_zero_bias | {0,,255} for asym8u output, {-128, 127} for |
| | asym8s output |
| out_multiplier | Greater than 0 |
| out_data_format | Can be 0: SHAPE_CUBE_DWH_T or |
| | 1: SHAPE_CUBE_WHD_T for 8x8 and asym8u |
| | kernels. Must be 1 for other kernels. |

3.3 Activation Kernels

3.3.1 Sigmoid

Description

These kernels perform the sigmoid operation on input vector x and give output vector as y = sigmoid(x). Both the input and output vectors have size vec_length .

The fixed-point kernels accept 32-bit input in Q6.25 format and give output in Q16.15 (32-bit), Q15 (16-bit), or Q7 (8-bit) format.

For the asym8u kernels both the input and output are of asym8u datatype.

Function variants available are xa_nn_vec_sigmoid_[p]_[q], where:

- [p]: Input precision in bits
- [q]: Output precision in bits

Precision

There are five variants available.



| Туре | Description | |
|---------------|-------------------------------|--|
| 32_32 | 32-bit input, 32-bit output | |
| 32_16 | 32-bit input, 16-bit output | |
| 32_8 | 32-bit input, 8-bit output | |
| f32_f32 | float32 input, float32 output | |
| asym8uxasym8u | asym8u input, asym8u output | |

Algorithm

$$y_n = \frac{1}{1 + \exp(-x_n)}$$
, $n = 0, \dots, \overline{vec\text{-length} - 1}$

Prototype

```
WORD32 xa_nn_vec_sigmoid_32_32
(WORD32 * p_out, const WORD32 * p_vec,
                                               WORD32 vec_length);
WORD32 xa_nn_vec_sigmoid_32_16
(WORD16 * p_out, const WORD32 * p_vec,
                                               WORD32 vec_length);
WORD32 xa_nn_vec_sigmoid_32_8
(WORD8 * p_out, const WORD32 * p_vec,
                                               WORD32 vec_length);
WORD32 xa_nn_vec_sigmoid_f32_f32
(FLOAT32 * p_out, const FLOAT32 * p_vec,
                                               WORD32 vec_length);
WORD32 xa_nn_vec_sigmoid_asym8u_asym8u
(UWORD8 * p_out, const UWORD8 * p_vec,
                                               WORD32 zero point,
WORD32 input_range_radius, WORD32 input_multiplier, WORD32 input_left_shift,
WORD32 vec_length);
```

Arguments

| Туре | Name | Size | Description |
|--|--------------------|------------|--|
| Input | | | |
| const WORD32 *, const UWORD8 * const FI.OAT32 * | p_vec | vec_length | Input vector, Q6.25, floating point or asym8u |
| WORD32 | zero_point | | bias value |
| WORD32 | input_range_radius | | Range radius: output = (abs (x _i - zero_point) <= radius)? sigmoid() : 0 |
| WORD32 | input_multiplier | | Multiplier value of input |
| WORD32 | input_left_shift | | Left Shift value of input |
| WORD32 | vec_length | | Length of input vector |
| Output | | | |
| WORD32 *, WORD16 *, WORD8 *, UWORD8 *, FLOAT32 * | p_out | vec_length | Output vector, fixed (Q16.15, Q15, Q7) floating point or asym8u |

Returns

- 0: no error
- -1: error, invalid parameters



Restrictions

| Arguments | Restrictions |
|--------------------|---------------------------|
| p_vec, p_out | Should not overlap |
| | Cannot be NULL |
| zero_point, | [0, 255] |
| input_range_radius | |
| input_left_shift | [-31, 31] |
| input_multiplier | Shouldn't be less than 0. |
| vec_length | Greater than 0 |

3.3.2 Tanh

Description

These kernels perform the hyperbolic tangent operation on input vector x and give output vector as $y = \tanh(x)$. Both the input and output vectors have size vec_length .

The fixed-point kernels accept 32-bit input in Q6.25 format and give output in Q16.15 (32-bit), Q15 (16-bit), or Q7 (8-bit) format.

Function variants available are $xa_nn_vec_tanh_[p]_[q]$, where:

- [p]: Input precision in bits
- [q]: Output precision in bits

Precision

There are four variants available:

| Туре | Description |
|---------|-------------------------------|
| 32_32 | 32-bit input, 32-bit output |
| 32_16 | 32-bit input, 16-bit output |
| 32_8 | 32-bit input, 8-bit output |
| f32_f32 | float32 input, float32 output |

Algorithm

$$y_n = \tanh(x_n)$$
, $n = 0, \dots, \overline{vec\text{-length} - 1}$



(FLOAT32 * p_out, const FLOAT32 * p_vec, WORD32 vec_length);

Arguments

| Туре | Name | Size | Description | |
|---|------------|------------|--|--|
| Input | | | | |
| WORD32 *, FLOAT32 * | p_vec | vec_length | Input vector, Q6.25 or floating point | |
| WORD32 | vec_length | | Length of input vector | |
| Output | Output | | | |
| WORD32 *, WORD16 *, WORD8 *, FLOAT32 * | p_out | vec_length | Output vector, fixed (Q16.15, Q15, Q7) or floating point | |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions | |
|--------------|--------------------|--|
| p_vec, p_out | Should not overlap | |
| | Cannot be NULL | |

3.3.3 Rectifier Linear Unit (ReLU)

Description

These kernels compute the rectifier linear unit function of input vector x and give output vector as y = relu(x). Both the input and output vectors have size vec_length .

The fixed-point routines accept 32-bit input in Q6.25 format and gives 32-bit output in Q16.15 format.

The threshold argument to relu kernel API allows to set upper threshold for proper compression of output signal and is expected in Q16.15 format. In relu1 and relu6 kernels, the thresholds are set to 1 and 6, respectively.

The standard ReLU kernels relu std can be used when the threshold is not required.

Function variants available are xa_nn_vec_relu_[p]_[q], xa_nn_vec_relu1_[p]_[q], and xa_nn_vec_relu6_[p]_[q], where:

- [p]: Input precision in bits
- [q]: Output precision in bits

Precision

There are four variants available:

| Туре | Description |
|---------|-------------------------------|
| 32_32 | 32-bit input, 32-bit output |
| f32_f32 | float32 input, float32 output |
| 16_16 | 16-bit input, 16-bit output |
| 8_8 | 8-bit input, 8-bit output |

Algorithm

```
y_n = \max(0, \min(x_n, K)), \qquad n = 0, \dots, \overline{vec\text{-length} - 1}
```

K represents threshold

```
WORD32 xa_nn_vec_relu_32_32
(WORD32 * p_out, const WORD32 * p_vec, WORD32 threshold,
WORD32 vec_length);
WORD32 xa_nn_vec_relu_f32_f32
(FLOAT32 * p_out, const FLOAT32 * p_vec, FLOAT32 threshold,
WORD32 vec_length);
WORD32 xa_nn_vec_relu_16_16
(WORD16 * p_out, const WORD16 * p_vec, WORD16 threshold,
WORD32 vec_length);
WORD32 va_nn_vec_relu_8_8
(WORD8 * p_out, const WORD8 * p_vec, WORD8 threshold,
WORD32 vec_length);
```



```
WORD32 xa_nn_vec_relu1_32_32
(WORD32 * p_out, const WORD32 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu1_f32_f32
(FLOAT32 * p_out, const FLOAT32 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu6_32_32
(WORD32 * p_out, const WORD32 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu6_f32_f32
(FLOAT32 * p_out, const FLOAT32 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu_std 32 32
(WORD32 * p_out, const WORD32 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu_std_f32_f32
(FLOAT32 * p_out, const FLOAT32 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu_std_16_16
(WORD16 * p_out, const WORD16 * p_vec, WORD32 vec_length);
WORD32 xa_nn_vec_relu_std_8_8
(WORD8 * p_out, const WORD8 * p_vec, WORD32 vec_length);
```

Arguments

| Туре | Name | Size | Description |
|--|------------|------------|---|
| Input | | | |
| const WORD32 *, const FLOAT32 *, const WORD16 *, const | p_vec | vec_length | Input vector, fixed-point or floating point |
| WORD8 * | | | |
| WORD32 | vec_length | | length of input vector |
| WORD32 FLOAT32 WORD16 WORD8 | threshold | | threshold, fixed or floating point |
| Output | | | |
| WORD32 *, FLOAT32 *, WORD16 *, WORD8 * | p_out | vec_length | Output vector, fixed or floating point |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions | |
|--------------|--------------------|--|
| p_vec, p_out | Should not overlap | |
| | Cannot be NULL | |

3.3.4 Softmax

Description

These kernels compute the softmax (normalized exponential function) of input vector x and give output vector as y = softmax(x). Both the input and output vectors have size vec_length .

The fixed-point kernels accept 32-bit input in Q6.25 format and give 32-bit output in Q16.15 format.

For the asym8u kernels, both the input and output are of the same precision and for asym8s kernels, the input is asym8s and the output precision can be asym8s or 16-bit.

Function variants available are xa_nn_vec_softmax_[p]_[q], where:

- [p]: Input precision in bits
- [q]: Output precision in bits

Precision

There are five variants available:

| Туре | Description | |
|---------------|-------------------------------|--|
| 32_32 | 32-bit input, 32-bit output | |
| f32_f32 | float32 input, float32 output | |
| asym8u_asym8u | asym8u input, asym8u output | |
| asym8s_asym8s | asym8s input, asym8s output | |
| asym8s_16 | asym8s input, 16-bit output | |

Algorithm

$$y_n = \frac{\exp(x_n)}{\sum_k \exp(x_k)}, \quad n = 0, \dots, \overline{vec\text{-length} - 1}$$

```
WORD32 xa_nn_vec_softmax_32_32

(WORD32 * p_out, const WORD32 * p_vec, WORD32 vec_length);

WORD32 xa_nn_vec_softmax_f32_f32

(FLOAT32 * p_out, const FLOAT32 * p_vec, WORD32 vec_length);

WORD32 xa_nn_vec_softmax_asym8u_asym8u

(UWORD8 * p_out, const UWORD8 * p_vec, WORD32 diffmin,

WORD32 input_left_shift, WORD32 input_multiplier,

WORD32 vec_length, pVOID p_scratch);

WORD32 xa_nn_vec_softmax_asym8s_asym8s

(WORD8 * p_out, const WORD8 * p_vec, WORD32 diffmin,

WORD32 input_left_shift, WORD32 input_multiplier,

WORD32 vec_length, pVOID p_scratch);

WORD32 vec_length, pVOID p_scratch);

WORD32 xa_nn_vec_softmax_asym8s_16

(WORD16 * p_out, const WORD8 * p_vec, WORD32 diffmin,

WORD32 input_left_shift, WORD32 input_multiplier,

WORD32 vec_length, pVOID p_scratch);
```



Arguments

| Туре | Name | Size | Description |
|---|----------------------|------------|---|
| Input | | | |
| WORD32 *, FLOAT32 *, const UWORD8 *, const WORD8 * | p_vec | vec_length | Input vector, Q6.25, floating point, asym8u or asym8s |
| WORD32 | diffmin | | Diffmin value: output = ((x _i – max) > diffmin) ? softmax(): 0 |
| WORD32 | input_ left_shift | | left shift value of input |
| WORD32 | input_ multiplier | | multiplier value of input |
| WORD32 | vec_length | | Length of input vector |
| Output | | | |
| WORD32 *, FLOAT32 *, UWORD8 *, WORD8 *, WORD16 * | p_out | vec_length | Output vector, Q16.15, floating point, asym8u, asym8s or 16-bit. |
| Temporary | | | |
| VOID *, | p_scratch | | Scratch (temporary) memory pointer |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|------------------|---------------------------|
| p_vec, p_out | Should not overlap |
| | Cannot be NULL |
| input_left_shift | [-31, 31] |
| input_multiplier | Shouldn't be less than 0. |
| vec_length | Greater than 0 |

3.3.5 Activation Min Max

Description

These kernels compute the activation minimum and maximum value of input vector x and give output vector as y = activation min max(x). Both the input and output vectors have size num elm.

For activation min max kernels, the input precision and the output precision are same.

The activation_min and activation_max arguments to the kernel API allow to set the threshold for proper compression of the output. The kernel is a generic implementation of the ReLU function.



Function variant available is xa_nn_vec_activation min max_[p]_[q], where:

- [p]: Input precision in bits
- [q]: Output precision in bits

Precision

There are four variants available:

| Туре | Description | |
|---------------|-------------------------------|--|
| f32_f32 | float32 input, float32 output | |
| asym8uxasym8u | asym8u input, asym8u output | |
| 16_16 | 16-bit input, 16-bit output | |
| 8_8 | 8-bit input, 8-bit output | |

Algorithm

```
y_n = \max(activation\_min, \min(x_n, activation\_max)) \,, \qquad n = 0, \dots, \overline{vec\_length-1} activation\_min \text{ represents lower threshold.}
```

activation_max represents upper threshold.

Prototype

```
WORD32 xa_nn_vec_activation_min_max_f32_f32
(FLOAT32 * p_out, const FLOAT32 * p_vec, FLOAT32 activation_min, FLOAT32 activation_max, WORD32 vec_length);
WORD32 xa_nn_vec_activation_min_max_asym8u_asym8u
(UWORD8 * p_out, const UWORD8 * p_vec, int activation_min, int activation_max, WORD32 vec_length);
WORD32 xa_nn_vec_activation_min_max_16_16
(WORD16 * p_out, const WORD16 * p_vec, int activation_min, int activation_max, WORD32 vec_length);
WORD32 xa_nn_vec_activation_min_max_8_8
(WORD8 * p_out, const WORD8 * p_vec, int activation_min, int activation_max, WORD32 vec_length);
word32 xa_nn_vec_activation_min_max_8_8
(WORD8 * p_out, const WORD8 * p_vec, int activation_min, int activation_max, WORD32 vec_length);
```

Arguments

| Туре | Name | Size | Description |
|---|----------------|------------|---|
| Input | | | |
| const UWORD8 *, const FLOAT32 *, const WORD16 *, const WORD8 * | p_vec | vec_length | Input vector, floating- point,asym8u or fixed point. |
| WORD32 | vec_length | | Length of input vector |
| WORD32, FLOAT32 | activation_min | | Lower threshold value, floating- point, asym8u or fixed point. |
| WORD32, FLOAT32 | activation_max | | Upper threshold value, floating- point, asym8u or fixed point |



| Output | | | |
|--------------------------------------|-------|------------|--|
| UWORD8 *, FLOAT32 *, WORD16 *, | p_out | vec_length | Output vector, floating-point, asym8u or fixed point |
| WORD8 * | | | |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|--------------|--|
| p_vec, p_out | Aligned on (size of one element)-byte boundary |
| | Cannot be NULL |

3.4 Pooling Kernels

3.4.1 Average Pool Kernel

Description

These kernels compute 2D average pool on a set of input planes (matrices) x and give a set of planes y as output.

The pooling region is defined by $kernel_height$ and $kernel_width$. It is shifted over the input plane in steps of x_stride horizontally and in steps of y_stride vertically to generate the specified output plane size. The input is extended by zero padding as specified by the padding region. The padding is determined by the parameters $x_padding$, $y_padding$ for left and top side padding respectively, and out_width , out_height for right and bottom padding respectively. Around the edges of input planes, if only a part of pooling region is covering input plane then only the average of those elements is calculated, and the denominator is the number of elements from input in current pooling region.

The average pool kernels accept input as 8-bit, 16-bit integer, asym8u or single precision floating point format and give output in the same precision as input.

These kernels require temporary buffer for average pool computation. This temporary buffer is provided by the p_scratch argument of kernel API. The size of the temporary buffer should be queried using $xa_nn_avgpool_getsize()$ helper API.

These kernels expect input cube in SHAPE_CUBE_WHD_T and SHAPE_CUBE_DWH_T shape type and produce output cube in SHAPE_CUBE_WHD_T and SHAPE_CUBE_DWH_T shape type respectively. The inp_data_format and out_data_format arguments to the kernel API can be 0 or 1 to indicate input and output cube shapes respectively.

The value of inp data format and out_data_format must be equal.



Function variants available are xa_nn_avgpool_[p], where:

[p]: Input and Output precision in bits

Precision

There are four variants available:

| Туре | Description |
|--------|-------------------------------|
| 8 | 8-bit input, 8-bit output |
| 16 | 16-bit input, 16-bit output |
| f32 | float32 input, float32 output |
| asym8u | asym8u input, asym8u output |

Algorithm

$$\begin{split} z_{h,w,d} &= \frac{1}{K_H K_W} \left(\sum_{i=0}^{K_H-1} \sum_{j=0}^{K_W-1} in_{(h*y-stride+i),(w*x-stride+j),d)} \right) \\ h &= 0, \dots, \overline{out-height-1}, \quad w = 0, \dots, \overline{out-width-1}, \\ d &= 0, \dots, \overline{out-channels-1} \end{split}$$

in denotes padded input cube, z denotes output

 K_H , K_W denote kernel_height, kernel_width respectively.

```
WORD32 xa_nn_avgpool_getsize
(WORD32 input_channels, WORD32 inp_precision, WORD32 input_height, WORD32 input_width, WORD32 kernel_height, WORD32 x_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 v_mordata_format, WORD32 v_mordata_format);

WORD32 xa_nn_avgpool_8
(WORD8 * p_out, WORD32 input_channels, WORD32 input_height, WORD32 input_width, WORD32 input_channels, WORD32 v_stride, WORD32 v_mordata_format);

WORD32 x_padding, WORD32 y_padding, WORD32 v_stride, WORD32 v_stride, WORD32 v_mordata_format, WORD32 v_mordata_format, WORD32 v_mordata_format, WORD32 v_mordata_format, WORD32 out_height, WORD32 v_mordata_format, WORD32 out_height, WORD32 v_mordata_format, WORD32 out_height, WORD32 out_height, WORD32 out_data_format, WORD32 out_height, WORD32 out_data_format, WORD32 out_data_format, WORD32 out_data_format, WORD32 out_data_format, WORD32 out_data_format, WORD3
```



```
VOID * p_scratch);
WORD32 xa_nn_avgpool_asym8u
(UWORD8* p_out, const UWORD8* p_inp, WORD32 input_height,
WORD32 input_width, WORD32 input_channels, WORD32 kernel_height,
WORD32 kernel_width, WORD32 x_stride, WORD32 y_stride,
WORD32 x_padding, WORD32 y_padding, WORD32 out_height,
WORD32 out_width, WORD32 inp_data_format, WORD32 out_data_format,
VOID *p_scratch);
```

Arguments

| Туре | Name | Size | Description |
|--|-----------------|--|---|
| Input | | | |
| WORD8 *, WORD16 *, const UWORD8 *, const FLOAT32 * | p_inp | <pre>input_height * input_width * input_channels</pre> | Input cube |
| WORD32 | input_height | | Input height |
| WORD32 | input_width | | Input width |
| WORD32 | input_channels | | Input number of channels |
| WORD32 | kernel_height | | Pooling window height |
| WORD32 | kernel_width | | Pooling window width |
| WORD32 | x_stride | | Horizontal stride over input |
| WORD32 | y_stride | | Vertical stride over input |
| WORD32 | x_padding | | Left padding width on input |
| WORD32 | y_padding | | Top padding height on input |
| WORD32 | out_height | | Output height |
| WORD32 | out_width | | Output width |
| WORD32 | inp_data_format | | Input data format 0:SHAPE_CUBE_DWH_T 1:SHAPE_CUBE_WHD_T |
| WORD32 | out_data_format | | Output data format: 0:SHAPE_CUBE_DWH_T 1:SHAPE_CUBE_WHD_T |
| Output | | | |
| WORD8 *, WORD16 *, UWORD8 *, FLOAT32 * | p_out | <pre>out_height * out_width * input_channels</pre> | Output cube |
| Temporary | | | |
| VOID * | p_scratch | xa_nn_avgpool_ getsize() | Temporary / scratch memory |

Returns

- 0: no error
- -1: error, invalid parameters



Restrictions

| Arguments | Restrictions |
|---------------------------|--|
| p_inp, p_out | Cannot be NULL |
| | Should not overlap |
| p_scratch | Cannot be NULL |
| | Should not overlap |
| | Memory size ≥ size returned by |
| | xa_nn_avgpool_getsize() |
| input_height, input_width | Greater than or equal to 1 |
| input_channels | Greater than or equal to 1 |
| kernel_height | {1, 2,, min(input_height, 256)} (for 8-bit and 16- |
| | bit) |
| | {1, 2,, input_height} (for float32) |
| kernel_width | {1, 2,, min(input_width, 256)} (for 8-bit and 16- |
| | bit) |
| | {1, 2,, input_width} (for float32) |
| x_stride, y_stride | Greater than or equal to 1 |
| x_padding, y_padding | Greater than or equal to 0 |
| out_height, out_width | greater than or equal to 1 |
| inp_data_format | Can be 0: SHAPE_CUBE_DWH_T or |
| | 1: SHAPE_CUBE_WHD_T |
| out_data_format | Must be equal to inp_data_format |

3.4.2 Max Pool Kernel

Description

These kernels perform 2D max pooling operation over a set of input planes x and give as output, a set of planes y.

The pooling region is defined by kernel_height and kernel_width. It is shifted over the input plane horizontally in steps of x_stride and vertically in steps of y_stride to generate the specified output plane size.

The input plane, padded with the maximum negative values is considered while performing the max pooling operation. The padding region is determined by the parameters $x_{padding}$, $y_{padding}$ for left and top side padding respectively, and out_{width} , out_{height} for right and bottom padding respectively.

The max pool kernels accept input as 8-bit, 16-bit integer, asym8u or single precision floating point format and give output in the same precision as input.

These kernels require temporary buffer for max pool computation. This temporary buffer is provided by the p_scratch argument of kernel API. The size of the temporary buffer should be queried using the xa_nn_maxpool_getsize() helper API.

These kernels expect input cube in SHAPE_CUBE_WHD_T and SHAPE_CUBE_DWH_T shape type and produce output cube in SHAPE_CUBE_WHD_T and SHAPE_CUBE_DWH_T shape type respectively. The



<code>inp_data_format</code> and <code>out_data_format</code> arguments to the kernel API can be 0 or 1 to indicate input and output cube shapes respectively.

The value of inp data format and out_data_format must be equal.

Function variants available are xa_nn_maxpool_[p], where:

[p]: Input and Output precision in bits

Precision

There are four variants available:

| Туре | Description |
|--------|-------------------------------|
| 8 | 8-bit input, 8-bit output |
| 16 | 16-bit input, 16-bit output |
| f32 | float32 input, float32 output |
| asym8u | asym8u input, asym8u output |

Algorithm

$$\begin{split} z_{h,w,d} &= \max \left(in_{(h*y-stride+i),(w*x-stride+j),d)}\right) \\ h &= 0, \dots, \underbrace{out-height-1}_{out-channels-1}, \quad w = 0, \dots, \underbrace{out-width-1}_{out-channels-1}, \\ i &= 0, \dots, K_H-1, \quad j = 0, \dots, K_W-1 \end{split}$$

in denotes padded input cube, z denotes output.

 K_H , K_W denote kernel_height, kernel_width respectively.



Prototype

```
WORD32 xa nn maxpool getsize
(WORD32 input_channels, WORD32 inp_precision, WORD32 out_precision,
 WORD32 input_height, WORD32 input_width, WORD32 kernel_height, WORD32 kernel_width, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 inp_data_format, WORD32 out_data_format);
WORD32 xa_nn_maxpool_8
(WORD8 * p_out, WORD8 * p_inp, WORD32 input_height,
WORD32 input_width, WORD32 input_channels, WORD32 kernel_height,
WORD32 kernel_width, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 out_data_format,
 VOID * p_scratch);
WORD32 xa_nn_maxpool_16
(WORD16 * p_out, WORD16 * p_inp, WORD32 input_height,
WORD32 input_width, WORD32 input_channels, WORD32 kernel_height,
WORD32 kernel_width, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 out_data_format,
 VOID * p_scratch);
WORD32 xa_nn_maxpool_f32
(FLOAT32 * p_out, FLOAT32 * p_inp, WORD32 input_height, WORD32 input_width, WORD32 input_channels, WORD32 kernel_height,
WORD32 kernel_width, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 out_data_format,
 VOID * p_scratch);
WORD32 xa nn maxpool_asym8u
 (UWORD8* p_out, const UWORD8* p_inp, WORD32 input_height, WORD32 input_width, WORD32 input_channels WORD32 input_words)
(UWORD8* p_out,
 WORD32 Input width, WORD32 input challed, WORD32 kernel_width, WORD32 x_stride, WORD32 y_stride, WORD32 x_padding, WORD32 y_padding, WORD32 out_height, WORD32 out_width, WORD32 inp_data_format, WORD32 out_data_format,
 VOID *p scratch);
```

Arguments

| Туре | Name | Size | Description |
|--|----------------|--|------------------------------|
| Input | | | |
| WORD8 *, WORD16 *, const UWORD8 *, const FLOAT32 * | p_inp | <pre>input_height * input_width * input_channels</pre> | Input cube |
| WORD32 | input_height | | Input height |
| WORD32 | input_width | | Input width |
| WORD32 | input_channels | | Input number of channels |
| WORD32 | kernel_height | | Pooling window height |
| WORD32 | kernel_width | | Pooling window width |
| WORD32 | x_stride | | Horizontal stride over input |
| WORD32 | y_stride | | Vertical stride over input |
| WORD32 | x_padding | | Left padding width on input |
| WORD32 | y_padding | | Top padding height on input |
| WORD32 | out_height | | Output height |
| WORD32 | out_width | | Output width |



| WORD32 | inp_data_format | | Input data format 0:SHAPE_CUBE_DWH_T 1:SHAPE_CUBE_WHD_T |
|--|-----------------|--|---|
| WORD32 | out_data_format | | Input data format 0:SHAPE_CUBE_DWH_T 1:SHAPE_CUBE_WHD_T |
| Output | | | |
| WORD8 *, WORD16 *, UWORD8 *, FLOAT32 * | p_out | <pre>out_height * out_width * input_channels</pre> | Output cube |
| Temporary | | | |
| VOID * | p_scratch | xa_nn_maxpool_ getsize() | Temporary / scratch memory |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions | |
|---------------------------|----------------------------------|--|
| p_inp, p_out | Cannot be NULL | |
| | Should not overlap | |
| | Should not overlap | |
| | Memory size ≥ size returned by | |
| | xa_nn_maxpool_getsize() | |
| input_height, input_width | Greater than or equal to 1 | |
| input_channels | Greater than or equal to 1 | |
| kernel_height | {1, 2,, input_height} | |
| kernel_width | {1, 2,, input_width} | |
| x_stride, y_stride | Greater than or equal to 1 | |
| x_padding, y_padding | Greater than or equal to 0 | |
| out_height, out_width | Greater than or equal to 1 | |
| inp_data_format | Can be 0: SHAPE_CUBE_DWH_T or | |
| | 1: SHAPE_CUBE_WHD_T | |
| out_data_format | Must be equal to inp_data_format | |

3.5 Fully connected Layer

3.5.1 Fully Connected Kernel

Description

These kernels perform the operation of multiplication of weight matrix with input vectors in a fully connected neural network layer i.e. z = weight*input + bias. The column dimension of weight must match



the row dimension of input. Bias and resulting output vector z have as many numbers of rows as weight matrix.

The bias_shift and acc_shift arguments are provided in kernel API to adjust Q format of bias and output, respectively. Both bias_shift and acc_shift can be either positive or negative, where positive value denotes a left shift and negative value denotes a right shift.

bias_shift is the shift in number of bits applied to the bias to make it in the same Q format as weight X input multiplication – accumulation result. acc_shift is the shift in number of bits applied to the accumulator to obtain the output in desired Q format.

Note: acc_shift and bias_shift are not relevant in the case of floating point and quantized 8-bit kernels.

For conversion from higher precision accumulator to lower precision output, symmetric rounding is used.

The precision of output is the same as precision of input vector.

The arguments <code>input_zero_bias</code>, <code>weight_zero_bias</code> are provided to convert the quantized 8-bit inputs into their real values and perform Fully Connected kernel operation. The <code>out_zero_bias</code>, <code>out_multiplier</code> and <code>out_shift</code> values are used to quantize real values of output back to 8-bit.

Function variants available (for fixed point) are xa_nn_fully_connected_[p]x[q]_[r], where:

- [p]: Weight matrix precision in bits
- [q]: Input vector precision in bits
- [r]: Output vector precision in bits

Precision

There are six variants available:

| Туре | Description |
|----------------------|---|
| 16x16_16 | 16-bit weight matrix, 16-bit input vector, 16-bit output |
| 8x16_16 | 8-bit weight matrix, 16-bit input vector, 16-bit output |
| 8x8_8 | 8-bit weight matrix, 8-bit input vector, 8-bit output |
| f32 | float32 weight matrix, float32 input vector, float32 output |
| asym8uxasym8u_asym8u | asym8u weight matrix, asym8u input vector, asym8u output |
| sym8sxasym8s_asym8s | sym8s weight matrix, asym8s input vector, asym8s output |

Algorithm

$$z_n = 2^{acc\text{-}shift} \left(\sum_{m=0}^{W_D-1} weight_{n,m} \cdot input_m \ + \ 2^{bias\text{-}shift} bias_n \right),$$

$$n = 0, \dots, \overline{out\text{-}depth-1}$$

where W_D represents weight_depth



For floating point and quantized 8-bit routines, acc_shift=0 and bias_shift=0

Thus, $2^{acc\text{-}shift} = 2^{bias\text{-}shift} = 1$

Prototype

```
WORD32 xa_nn_fully_connected_16x16_16
(WORD16 * p_out, WORD16 * p_weight,
WORD16 * p_bias, WORD32 weight_depth,
WORD32 acc_shift, WORD32 bias_shift);
                                                          WORD16 * p_inp,
                                                          WORD32 out_depth,
WORD32 xa_nn_fully_connected_8x16_16
(WORD16 * p_out, WORD8 * p_weight,
WORD16 * p_bias, WORD32 weight_depth,
WORD32 acc_shift, WORD32 bias_shift);
                                                          WORD16 * p_inp,
                                                          WORD32 out_depth,
WORD32 xa_nn_fully_connected_8x8_8
(WORD8 * p_out, WORD8 * p_weight,
WORD8 * p_bias, WORD32 weight_depth,
WORD32 acc_shift, WORD32 bias_shift);
                                                          WORD8 * p_inp,
                                                          WORD32 out_depth,
WORD32 xa_nn_fully_connected_f32
(FLOAT32 * p_out, FLOAT32 * p_weight, FLOAT32 * p_bias, WORD32 weight_depth,
                                                          FLOAT32 * p_inp,
                                                          WORD32 out_depth);
WORD32 xa_nn_fully_connected asym8uxasym8u asym8u
(UWORD8 * p_out, const UWORD8 * p_weight, const UWORD8 * p_inp,
 const WORD32 * p_bias, WORD32 weight_depth,
                                                          WORD32 out depth,
 WORD32 input_zero_bias, WORD32 weight_zero_bias, WORD32 out_multiplier,
WORD32 out shift, WORD32 out zero bias);
WORD32 xa_nn_fully_connected_sym8sxasym8s asym8s
(WORD8 * p_out, const WORD8 * p_weight, const WORD8 * p_inp,
 const WORD32 * p_bias, WORD32 weight_depth, WORD32 out_depth,
 WORD32 input_zero_bias,WORD32 out_multiplier, WORD32 out_shift,
 WORD32 out zero bias);
```

Arguments

| Туре | Name | Size | Description |
|--|-----------|-------------------------|--|
| Input | | | |
| WORD16 *, WORD8 *, pFLOAT32, const UWORD8 *, const WORD8 * | p_weight | out_depth* weight_depth | Weight matrix, fixed, floating point, asym8u or sym8s |
| WORD16 *, WORD8 *, pFLOAT32, const UWORD8 *, const WORD8 * | p_inp | weight_depth* 1 | Input vector, fixed, floating point, asym8u or asym8s |
| WORD16 *, WORD8 *, pFLOAT32, WORD32 * | p_bias | out_depth*1 | Bias vector, fixed or floating point, 32-bit for quantized kernels |
| WORD32 | out_depth | | Number of rows in weight matrix, bias and output vector |



| WORD32 | weight_depth | | Number of columns in weight matrix and rows in input vector |
|---|------------------|-------------|---|
| WORD32 | acc_shift | | Shift applied to accumulator |
| WORD32 | bias_shift | | Shift applied to bias |
| WORD32 | input_zero_bias | | Zero offset of input |
| WORD32 | weight_zero_bias | | Zero offset of weights |
| WORD32 | out_multiplier | | Multiplier value of output |
| WORD32 | out_shift | | Shift value of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| Output | | | |
| WORD8 *, WORD16 *, pFLOAT32, WORD8 *, UWORD8* | p_out | out_depth*1 | Output vector, fixed, floating point, asym8u or asym8s |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|---|---|
| weight_depth | Multiple of 4 for fixed point kernels.(2 in case of floating point). No restriction for quantized 8-bit kernels. |
| <pre>p_weight, p_inp, p_bias, p_out</pre> | Aligned on 16-byte boundary, should not overlap (size of one element)-byte boundary in case of floating point and quantized 8-bit kernels). |
| p_weight, p_inp, p_out | Cannot be NULL |
| out_depth | Greater than or equal to 1 |
| <pre>acc_shift, bias_shift, out_shift</pre> | {-31,,31} |
| input_zero_bias | {-255,,0} for asym8u, {-127,,128} for asym8s |
| weight_zero_bias | {-255,,0} for asym8u |
| out_zero_bias | {0,,255} for asym8u, {-128,,127} for asym8s |

3.6 Basic Operations and Miscellaneous Kernels

3.6.1 Interpolation Kernel

Description

This kernel performs interpolation between two input vectors h and y using interpolation factor from vector x to get output vector z.

The interpolation kernel accepts 16-bit inputs and 16-bit interpolation factor in Q15 format and produces 16-bit output in Q15 format.

Precision

| Туре | Description |
|--------|--|
| 16-bit | 16-bit input, 16-bit interpolation factor, 16-bit output |

Algorithm

$$z_n = x_n * y_n + (1 - x_n) * h_n$$
, $n = 0 \dots, \overline{num\text{-}elements - 1}$

 x_n represents interpolation factor.

 y_n represents first input, h_n represents second input.

 z_n represents output.

Prototype

```
WORD32 xa_nn_vec_interpolation_q15
(WORD16 * p_out, WORD16 * p_ifact, WORD16 * p_inp1,WORD16 * p_inp2, WORD32
num_elements);
```

Arguments

| Туре | Name | Size | Description |
|----------|--------------|--------------|-----------------------------|
| Input | | | |
| WORD16 * | p_ifact | num_elements | Interpolation factor vector |
| WORD16 * | p_inp1 | num_elements | First input vector |
| WORD16 * | p_inp2 | num_elements | Second input vector |
| WORD32 | num_elements | | Number of elements |
| Output | | | |
| WORD16 * | p_out | num_elements | Output vector |

Returns

0: no error



-1: error, invalid parameters

Restrictions

| Arguments | Restrictions |
|-------------------------------------|----------------------------|
| <pre>p_ifact, p_inp1, p_inp2,</pre> | Aligned on 8-byte boundary |
| p_out | Should not overlap |
| | Cannot be NULL |
| num_elements | Multiple of 4 |

3.6.2 Dot Product Kernels

Description

These kernels perform the dot product operations between two sets of input vectors p_{inp1} and p_{inp2} to get output vector p_{out} . The supported precisions are: f32xf32_f32 and 16x16_asym8s.

Function variants available are xa nn elm quantize [p]x[q] [r], where:

- [p],[q]: Input precision
- [r]: Output precision

Precision

There are two variants available:

| Туре | Description |
|--------------|-------------------------------|
| f32xf32_f32 | float32 input, float32 output |
| 16x16_asym8s | 16-bit input, asym8s output |

Algorithm

$$z_n = \left(\sum_{m=0}^{vec_length-1} inp1_m \cdot inp2_m + bias_n\right)$$

$$n = 0, \dots, \overline{vec_count - 1}$$

```
WORD32 xa_nn_dot_prod_f32xf32_f32
(FLOAT32 * p_out, const FLOAT32 * p_inp1, const FLOAT32 * p_inp2,
WORD32 vec_length, WORD32 num_vecs);
WORD32 xa_nn_dot_prod_16x16_asym8s
(WORD8 * p_out, const WORD16 * p_inp1, const WORD16 * p_inp2,
const WORD32 * bias_ptr, WORD32 vec_length, WORD32 out_multiplier,
WORD32 out_shift, WORD32 out_zero_bias, WORD32 vec_count);
```



Arguments

| Туре | Name | Size | Description |
|---|------------------------|------------|----------------------------|
| Input | | | |
| const FLOAT32 * const WORD16 * | p_inp1 | vec_length | First input vector |
| const FLOAT32 * const WORD16 * | p_inp2 | vec_length | Second input vector |
| const WORD32 * | bias_ptr | vec_count | Bias vector |
| WORD32 | vec_length | | Length of each vector |
| WORD32 | out_multiplier | | Multiplier value of output |
| WORD32 | out_shift | | Shift value of output |
| WORD32 | out_zero_bias | | Zero offset of output |
| WORD32 | num_vecs, vec_count | | Number of input vectors |
| Output | _ | | |
| FLOAT32 * WORD8 * | p_out | num_vecs | Output vector |

Returns

- 0: no error
- -1: error, invalid parameters

Restrictions:

| Arguments | Restrictions |
|----------------------|--|
| p_inp1,p_inp2, p_out | Aligned on (size of one element)-byte boundary |
| | Cannot be NULL |
| vec_length, num_vecs | Greater than 0 |
| out_shift | {-31,, 31} |
| out_multiplier | Greater than 0 |
| out_zero_bias | {-128,127} for out type asym8s |

3.6.3 Elementwise Quantize Kernel

Description

These kernels perform the quantization operation of the p_inp1 input vector elements to get the output vector p_out . The kernel is developed in reference to the Quantize operator implementation in Tensorflow Lite Micro.

Function variants available are $xa_nn_elm_quantize_[p]_[q]$, where:

- [p]: Input precision
- [p]: Output precision



Precision

| Туре | Description | |
|----------------|------------------------------|--|
| asym16s_asym8s | asym16s input, asym8s output | |

Prototype

Arguments

| Туре | Name | Size | Description | | |
|-------------------|----------------|----------|----------------------------|--|--|
| Input | | | | | |
| const WORD16 * | p_inp | num_elm | Input vector | | |
| WORD32 | inp_zero_bias | | Zero offset of input | | |
| WORD32 | out_zero_bias | | Zero offset of output | | |
| WORD32 | out_shift | | Shift value of output | | |
| WORD32 | out_multiplier | | Multiplier value of output | | |
| WORD32 | num_elm | | Number of input elements | | |
| Output | Output | | | | |
| WORD8 * | p_out | num_vecs | Output vector | | |

Returns

0: no error

-1: error, invalid parameters

Restrictions:

| Arguments | Restrictions |
|----------------|--|
| p_inp, p_out | Aligned on (size of one element)-byte boundary |
| | Cannot be NULL |
| num_elm | Greater than 0 |
| out_shift | {-31,, 31} |
| out_multiplier | Greater than 0 |
| inp_zero_bias | {-32768,32767} for out type asym8s |
| out_zero_bias | {-128,127} for out type asym8s |



4. HiFi 5 NN Library – Layers

This section explains the APIs of each layer implementation in the NN library. All the layers conform to the "generic NN Layer API" and flow explained in Section 2.

The NN library is a single archive containing all layers and low-level kernels implementations. Each layer has its own header file that defines the APIs specific to the layer. The following sections explain each layer in detail.

Note

This version of the library supports GRU, LSTM, and CNN layers.

4.1 GRU Layer

The GRU APIs are defined in xa_nnlib_gru_api.h. Refer to the overall signal flow diagram of GRU in 11.

4.1.1 GRU Layer Specification

GRU layer implements the following input-output equations 11:

```
\begin{split} z_t &= sigmoid(W_z * x_t + U_z * prev-h + b_z) \\ r_t &= sigmoid(W_r * x_t + U_r * prev-h + b_r) \\ g &= \tanh(W_h * x_t + U_h * (r_t \cdot prev-h) + b_h) \\ y_t &= h_t = z_t \cdot g + (1 - z_t) \cdot prev-h \\ prev-h &= h_t \end{split}
```

 x_t : input vector y_t , h_t : output vector W, U: weight matrices

prev-h: previous output vector

 z_t : update gate vector r_t : reset gate vector b: bias vectors



4.1.2 Error Codes Specific to GRU

Other than common error codes explained in Section 2.3, the GRU layer may also report the following error codes, which may be generated during the initialization stage.

- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS³
 Number of input features is not supported
- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_OUT_FEATS
 Number of output features is not supported
- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PRECISION
 I/O precision is not supported
- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_COEFF_QFORMAT
 Number of fractional bits for coefficients is not supported.
- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IO_QFORMAT
 Number of fractional bits for input-output is not supported.
- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_MEMBANK_PADDING
 Membank padding should be 0 or 1.
- XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PARAM_ID
 Parameter identifier (param_id) is not valid

The following error codes may be generated during the execution stage.

- XA_NNLIB_GRU_EXECUTE_FATAL_INSUFFICIENT_DATA
 Input data passed in is insufficient
- XA_NNLIB_GRU_EXECUTE_FATAL_INSUFFICIENT_OUTPUT_BUFFER_ SPACE
 - Output Buffer Size is not sufficient

_

³ FEATS := features



4.1.3 API Functions Specific to GRU

4.1.3.1 Query Functions

Table 4-1 GRU Get Persistent Size Function

| F | | | | |
|-------------|--|--|--|--|
| Function | xa_nnlib_gru_get_persistent_fast | | | |
| Syntax | <pre>Int32 xa_nnlib_gru_get_persistent_fast(</pre> | | | |
| | xa_nnlib_gru_init_config_t *config) | | | |
| | | | | |
| Description | Returns persistent memory size in bytes required by GRU layer. | | | |
| Parameters | Input: config | | | |
| | Initial configuration parameters (see Table 4-7). | | | |
| Errors | If return value is less than 0, then it is an error. Following are the possible error codes: | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS | | | |
| | Number of input features is not supported | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS | | | |
| | Number of output features is not supported | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PRECISION | | | |
| | I/O precision is not supported | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_COEFF_ QFORMAT | | | |
| | Number of fractional bits for coefficients is not supported. | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IO_ QFORMAT | | | |
| | Number of fractional bits for input-output is not supported. | | | |



Table 4-2 GRU Get Scratch Size Function

| Function | 1'1 | | |
|-------------|--|--|--|
| | xa_nnlib_gru_get_scratch_fast | | |
| Syntax | <pre>Int32 xa_nnlib_gru_get_scratch_fast(</pre> | | |
| | <pre>xa_nnlib_gru_init_config_t *config)</pre> | | |
| | | | |
| Description | Returns scratch memory size in bytes required by GRU layer. | | |
| Parameters | Input: config | | |
| | Initial configuration parameters (see Table 4-7). | | |
| Errors | If return value is less than 0, then it is an error. Following are the possible error codes: | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS | | |
| | Number of input features is not supported | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS | | |
| | Number of output features is not supported | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PRECISION | | |
| | I/O precision is not supported | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_COEFF_ QFORMAT | | |
| | Number of fractional bits for coefficients is not supported | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IO_ QFORMAT | | |
| | Number of fractional bits for input-output is not supported | | |



4.1.3.2 Initialization Stage

Table 4-3 GRU Init Function

| Function | xa_nnlib_gru_init | | | | |
|-------------|--|--|--|--|--|
| Syntax | Int32 | | | | |
| | xa_nnlib_gru_init (| | | | |
| | xa_nnlib_handle_t handle, | | | | |
| | xa_nnlib_gru_init_config_t *config) | | | | |
| Description | Reset the GRU Layer API handle into its initial state. Set up the GRU Layer to the specified initial configuration parameters. This function sets prev_h vector to 0; the user can put the desired values in prev_h by using set config XA_NNLIB_GRU_RESTORE_CONTEXT (refer to Table 4-11 for more information). | | | | |
| Parameters | Input: handle | | | | |
| | Pointer to the component persistent memory. This is the opaque handle. | | | | |
| | Required size: see xa_nnlib_gru_get_persistent_fast. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: config | | | | |
| | Initial configuration parameters (see Table 4-7). Note that the initial | | | | |
| | configuration parameters <i>must</i> be identical to those passed to query functions. | | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | |
| | One of the pointers is invalid. | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | |
| | One of the pointers is not properly aligned. | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS | | | | |
| | Number of input features is not supported | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IN_FEATS | | | | |
| | Number of output features is not supported | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PRECISION | | | | |
| | I/O precision is not supported. | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_COEFF_QFORMAT | | | | |
| | Number of fractional bits for coefficients is not supported. | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_IO_QFORMAT | | | | |
| | Number of fractional bits for input-output is not supported. | | | | |



4.1.3.3 Execution Stage

Table 4-4 GRU Execution Function

| Function | xa_nnlib_gru_process | | | | |
|-------------|---|--|--|--|--|
| Syntax | Int32 xa_nnlib_gru_process(| | | | |
| • | xa_nnlib_handle_t handle, | | | | |
| | void *scratch, | | | | |
| | void *input, | | | | |
| | void *output, | | | | |
| | xa_nnlib_shape_t *p_in_shape, | | | | |
| . | xa_nnlib_shape_t *p_out_shape) | | | | |
| Description | Processes one input shape to generate one output shape. | | | | |
| Parameters | Input: handle | | | | |
| | The opaque component handle. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: scratch | | | | |
| | | | | | |
| | A pointer to the scratch buffer. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: input | | | | |
| | A pointer to the input buffer. Input buffer contains input data. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | | | | | |
| | Output: output | | | | |
| | A pointer to the output buffer. Output is written to output buffer. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input/Output: p_in_shape | | | | |
| | | | | | |
| | Pointer to the shape containing input buffer dimensions. Contains the length of input data passed to GRU layer. | | | | |
| | Required alignment: 4 bytes. | | | | |
| | Required alignment. 4 bytes. | | | | |
| | Input/Output: p_out_shape | | | | |
| | | | | | |
| | Pointer to the shape for output buffer dimensions. On return, *p_out_shape is filled with the length of output generated by HiFi | | | | |
| | GRU Layer. | | | | |
| | Required alignment: 4 bytes. | | | | |
| Errors | | | | | |
| LITUIS | If the return value is not XA_NNLIB_NO_ERROR, it implies that | | | | |
| | the function has encountered one of the following errors: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | |
| | One of the pointers is NULL. | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | |
| | One of the pointers is not properly aligned. | | | | |
| | | | | | |



| | XA_NNLIB_FATAL_INVALID_SHAPE |
|---|---|
| | Either input or output shape is invalid. |
| • | XA_NNLIB_GRU_EXECUTE_FATAL_INSUFFICIENT_ DATA |
| | Input data passed in insufficient. |
| • | XA_NNLIB_GRU_EXECUTE_FATAL_INSUFFICIENT_ OUTPUT_BUFFER_SPACE |
| | Output buffer size is not sufficient. |

Table 4-5 GRU Set Parameter Function Details

| Function | | | | | |
|-------------|---|--|--|--|--|
| Function | xa_nnlib_gru_set_config | | | | |
| Syntax | Int32 | | | | |
| | xa_nnlib_gru_set_config (| | | | |
| | xa_nnlib_handle_t handle, | | | | |
| | xa_nnlib_gru_param_id_t param_id, | | | | |
| | void *params) | | | | |
| Description | Sets the parameter specified by param_id to the value passed in the buffer pointed to by params. | | | | |
| Parameters | Input: handle | | | | |
| | The opaque component handle. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: param_id | | | | |
| | Identifies the parameter to be written. Refer to Table 4-11 for the list | | | | |
| | of supported parameters. | | | | |
| | Input: params | | | | |
| | A pointer to a buffer that contains the parameter value. | | | | |
| | Required alignment: 4 bytes. | | | | |
| Errors | | | | | |
| Ellois | If the return value is not XA_NNLIB_NO_ERROR, it implies that function has encountered one of the following errors: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC One of the pointers (handle or params) is NULL. | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | |
| | One of the pointers (handle or params) is not aligned correctly. | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PARAM_ID Parameter identifier (param_id) is not valid. | | | | |



Table 4-6 GRU Get Parameter Function Details

| Function | xa_nnlib_gru_get_config | | | | | |
|-------------|---|--|--|--|--|--|
| | | | | | | |
| Syntax | Int32 xa_nnlib_gru_get_config (| | | | | |
| | xa_nnlib_handle_t handle, | | | | | |
| | <pre>xa_nnlib_gru_param_id_t param_id,</pre> | | | | | |
| | void *params) | | | | | |
| Description | Gets the value of the parameter specified by param_id in the buffer pointed to by params. | | | | | |
| Parameters | Input: handle | | | | | |
| | The opaque component handle. | | | | | |
| | Required alignment: 8 bytes. | | | | | |
| | Input: param_id | | | | | |
| | Identifies the parameter to be read. Refer to Table 4-11 for the list | | | | | |
| | of supported parameters. | | | | | |
| | | | | | | |
| | Output: params A pointer to a buffer that is filled with the parameter value when the | | | | | |
| | function returns. | | | | | |
| | Required alignment: 4 bytes. | | | | | |
| Errors | | | | | | |
| 211010 | If the return value is not XA_NNLIB_NO_ERROR, it implies that function has encountered one of the following errors: | | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | | |
| | One of the pointers (handle or params) is NULL. | | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | | |
| | One of the pointers (handle or params) is not aligned correctly. | | | | | |
| | XA_NNLIB_GRU_CONFIG_FATAL_INVALID_PARAM_ID | | | | | |
| | Parameter identifier (param_id) is not valid. | | | | | |



4.1.4 Structures Specific to GRU

Table 4-7 GRU Config Structure xa_nnlib_gru_init_config_t

| Element Type | Element Name | Range | Default | Description |
|------------------------------|---------------|--|--------------------------|---|
| Int32 | in_feats | 4-2048 | 256 | Number of input features (must be multiple of 4) |
| Int32 | out_feats | 4-2048 | 256 | Number of output features (must be multiple of 4) |
| Int32 | pad | 0, 1 | 1 | Padding 16 bytes for HiFi 5 |
| Int32 | mat_prec | 8, 16 | 16 | Matrix input precision |
| Int32 | vec_prec | 16 | 16 | Vector input precision |
| xa_nnlib_gru _precision_t | precision | XA_NNLIB_ GRU_ 16bx16b, XA_NNLIB_ GRU_ 8bx16b | XA_NNLIB_ GRU_16bx16b | Coef and I/O precision. Note: Current library supports only 16bx16b and 8bx16b precision for GRU |
| Int16 | coeff_Qformat | 0-15 | 15 | Number of fractional bits for weights and biases |
| Int16 | io_Qformat | 0-15 | 12 | Number of fractional bits for input and output |

Table 4-8 xa_nnlib_gru_weights_t Parameter Type

| Element Type | Element Name | Range | Default | Description |
|----------------------|--------------|-------|---------|------------------------------------|
| coeff_t * | W_Z | NA | NA | Pointer to coefficient matrix w_z. |
| xa_nnlib_ shape_t | shape_w_z | NA | NA | Shape information about w_z. |
| coeff_t * | u_z | NA | NA | Pointer to coefficient matrix u_z. |
| xa_nnlib_ shape_t | shape_u_z | NA | NA | Shape information about u_z. |
| coeff_t * | w_r | NA | NA | Pointer to coefficient matrix w_r. |
| xa_nnlib_ shape_t | shape_w_r | NA | NA | Shape information about w_r. |
| coeff_t * | u_r | NA | NA | Pointer to coefficient matrix u_r. |
| xa_nnlib_ shape_t | shape_u_r | NA | NA | Shape information about u_r. |
| coeff_t * | w_h | NA | NA | Pointer to coefficient matrix w_h. |
| xa_nnlib_ shape_t | shape_w_h | NA | NA | Shape information about w_h. |
| coeff_t * | u_h | NA | NA | Pointer to coefficient matrix u_h. |
| xa_nnlib_ shape_t | shape_u_h | NA | NA | Shape information about u_h. |

Shape information about b_h.

coeff_t *

xa_nnlib_

shape_t

b_h

shape_b_h

Element Type Element Name Range Default Description NA NA Pointer to coefficient matrix b_z. coeff_t * b_z NA NA Shape information about b_z. xa_nnlib_ shape_b_z shape_t NA NA Pointer to coefficient matrix b_r. coeff_t * b_r NA NA Shape information about b_r. xa_nnlib_ shape_b_r shape_t NA NA Pointer to coefficient matrix b_h.

Table 4-9 xa_nnlib_gru_biases_t Parameter Type

Note GRU requires all weight matrices' and bias vectors' pointers to be 8 bytes aligned.

NA

Enums Specific to GRU 4.1.5

NA

Table 4-10 Enum xa_nnlib_gru_precision_t

| Element | Description |
|----------------------|---|
| XA_NNLIB_GRU_16bx16b | Coef: 16 bits, I/O: 16 bits Fixed Point |
| XA_NNLIB_GRU_8bx16b | Coef: 8 bits, I/O: 16 bits Fixed Point |
| XA_NNLIB_GRU_8bx8b | Not supported |
| XA_NNLIB_flt16xflt16 | Not supported |

Note Currently, GRU only supports XA_NNLIB_GRU_16bx16b, XA_NNLIB_GRU_8bx16b precision setting.

Table 4-11 describes parameter IDs for parameters supported by GRU. It contains the following columns:

- Parameter ID: Parameter identifier (param_id).
- Value type: A pointer (params) to a variable of this type is to be passed.
- RW: Indicates whether the parameter can be read (get) and/or written (set).
- Range: Indicates valid values of the parameter.
- Default: Default value of the parameter
- Description: Brief description of the parameter.



Table 4-11 GRU Specific Parameters

| Parameter ID | Value Type | RW | Range | Default | Description |
|------------------------------|------------------------------------|----|-------|---------|---|
| XA_NNLIB_GRU_RESTORE_CONTEXT | vect_t [] | RW | NA | NA | Set previous output. This can be used to set prev_h to specific context (size should be equal to number of output features). Upon set config, the buffer passed is copied to persistent memory; upon get config, it returns the prev_h state in the given buffer. |
| XA_NNLIB_GRU_WEIGHT | xa_nnli b_gru_ weights _t | RW | NA | NA | Weight matrices, pointers to weight matrices along with shape information must be passed via xa_nnlib_gru_weights_t structure for set config. Upon get config, it returns pointers to weight matrices along with their shape information in same structure. |
| XA_NNLIB_GRU_BIAS | xa_nnli b_gru_ biases_ t | RW | NA | NA | Bias vectors, pointers to bias vectors along with shape information must be passed via xa_nnlib_gru_biases_t structure for set config. Upon get config, it returns pointers to bias vectors along with their shape information in same structure. |
| XA_NNLIB_GRU_INPUT_SHAPE | xa_nnli b_shape _t | R | NA | NA | Input shape information, get information of the input shape expected by the layer. |
| XA_NNLIB_GRU_OUTPUT_SHAPE | xa_nnli b_shape _t | R | NA | NA | Output shape information, get information of the output shape expected by layer. |

4.2 LSTM Layer

The LSTM APIs are defined in xa_nnlib_lstm_api.h.

4.2.1 LSTM Layer Specification

The LSTM layer implements the following forward path input-output equations:

```
\begin{split} f_f &= sigmoid \big(w_{xf} * frame_f + prev-h * w_{hf} + b_f\big) \\ i_f &= sigmoid \big(w_{xi} * frame_f + prev-h * w_{hi} + b_i\big) \\ c-hat_f &= \tanh(w_{xc} * frame_f + prev-h * w_{hc} + b_c) \\ c_f &= f_f.prev-c + i_f * c-hat_f \\ o_f &= sigmoid \big(w_{xo} * frame_f + prev-h * w_{ho} + b_o\big) \\ h_f &= o_f * \tanh(c_f) \end{split}
```

 i_f : input gate prev-h: previous output vector h_t : output vector prev-c: previous cell output $c-hat_f$: intermediate cell state vector f_f : forget gate $frame_f$: Input vector f_f : cell state vector f_f : cell state vector f_f : weight matrices of input f_f : weight matrices of recurrent connections

4.2.2 Error Codes Specific to LSTM

Other than common error codes explained in Section 2.3, the LSTM layer may also report the following error codes, which may be generated during the initialization stage:

- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IN_FEATS⁴
 Number of input features is not supported
- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_OUT_FEATS
 Number of output features is not supported
- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PRECISION
 I/O precision is not supported
- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_COEFF_QFORMAT
 Number of fractional bits for coefficients is not supported.
- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_CELL_QFORMAT
 Number of fractional bits for cells is not supported

_

⁴ FEATS: = features



- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IO_QFORMAT
 Number of fractional bits for input-output is not supported.
- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_MEMBANK_PADDING
 Membank padding should be 0 or 1.
- XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PARAM_ID
 Parameter identifier (param_id) is not valid

The following error codes may be generated during the execution stage.

- XA_NNLIB_LSTM_EXECUTE_FATAL_INSUFFICIENT_DATA
 Input data passed in insufficient
- XA_NNLIB_LSTM_EXECUTE_FATAL_INSUFFICIENT_OUTPUT_BUFFER_
 SPACE

Output Buffer Size is not sufficient



4.2.3 API Functions Specific to LSTM

4.2.3.1 Query Functions

Table 4-12 LSTM Get Persistent Size Function

| Function | | | | | |
|-------------|---|--|--|--|--|
| | xa_nnlib_lstm_get_persistent_fast | | | | |
| Syntax | <pre>Int32 xa_nnlib_lstm_get_persistent_fast (</pre> | | | | |
| | <pre>xa_nnlib_lstm_init_config_t *config)</pre> | | | | |
| | | | | | |
| Description | Returns persistent memory size in bytes required by LSTM layer. | | | | |
| Parameters | Input: config | | | | |
| | Initial configuration parameters (see Table 4-18). | | | | |
| Errors | If return value is less than 0 then it is an error. Following are the possible error codes: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IN_FEATS | | | | |
| | Number of input features is not supported | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_OUT_FEATS | | | | |
| | Number of output features is not supported | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PRECISION | | | | |
| | I/O precision is not supported | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_COEFF_QFORMAT | | | | |
| | Number of fractional bits for coefficients is not supported. | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_CELL_QFORMAT | | | | |
| | Number of fractional bits for cells is not supported | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IO_QFORMAT | | | | |
| | Number of fractional bits for input-output is not supported. | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_MEMBANK_ PADDING | | | | |
| | Membank padding should be 0 or 1. | | | | |



Table 4-13 LSTM Get Scratch Size Function

| Function | xa_nnlib_lstm_get_scratch_fast | | | | | |
|-------------|---|--|--|--|--|--|
| Syntax | Int32 xa_nnlib_lstm_get_scratch_fast (| | | | | |
| | <pre>xa_nnlib_lstm_init_config_t *config)</pre> | | | | | |
| Description | Returns scratch memory size in bytes required by LSTM layer. | | | | | |
| Parameters | Input: config Initial configuration parameters (see Table 4-18). | | | | | |
| Errors | If return value is less than 0 then it is an error, the possible error codes are: | | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IN_FEATS | | | | | |
| | Number of input features is not supported | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_OUT_FEATS | | | | | |
| | Number of output features is not supported | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PRECISION | | | | | |
| | I/O precision is not supported | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_COEFF_QFORMAT | | | | | |
| | Number of fractional bits for coefficients is not supported. | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_CELL_QFORMAT | | | | | |
| | Number of fractional bits for cells is not supported | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IO_QFORMAT | | | | | |
| | Number of fractional bits for input-output is not supported. | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_MEMBANK_ PADDING | | | | | |
| | Membank padding should be 0 or 1. | | | | | |



4.2.3.2 Initialization Stage

Table 4-14 LSTM Init Function

| Function | xa_nnlib_lstm_init | | | | | | |
|-------------|---|--|--|--|--|--|--|
| Syntax | Int32 | | | | | | |
| | xa_nnlib_lstm_init (| | | | | | |
| | xa_nnlib_handle_t handle, | | | | | | |
| | xa_nnlib_lstm_init_config_t *config) | | | | | | |
| Description | Reset the LSTM layer API handle into its initial state. Set up the LSTM layer to the specified initial configuration parameters. This function sets prev_h vector and prev_c vector to 0; the user can put the desired values in prev_h and prev_c by using set config XA_NNLIB_LSTM_RESTORE_CONTEXT_OUTPUT and XA_NNLIB_LSTM_RESTORE_CONTEXT_CELL respectively (refer to Table 4-22 for more information). | | | | | | |
| Parameters | Input: handle Pointer to the component persistent memory. This is the opaque handle. | | | | | | |
| | Required size: see xa_nnlib_lstm_get_persistent_fast. Required alignment: 8 bytes. | | | | | | |
| | Input: config Initial configuration parameters (see Table 4-18). Note that the initial configuration parameters MUST be identical to those passed to query functions. | | | | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: | | | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | | | |
| | One of the pointers is invalid. | | | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | | | |
| | One of the pointers is not properly aligned. | | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IN_FEATS | | | | | | |
| | Number of input features is not supported | | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_OUT_FEATS | | | | | | |
| | Number of output features is not supported | | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PRECISION | | | | | | |
| | I/O precision is not supported | | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_COEFF_QFORMAT | | | | | | |
| | Number of fractional bits for coefficients is not supported. | | | | | | |
| | | | | | | | |



XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_CELL_QFORMAT
 Number of fractional bits for cells is not supported
 XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_IO_QFORMAT
 Number of fractional bits for input-output is not supported
 XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_MEMBANK_
 PADDING
 Membank padding should be 0 or 1.

4.2.3.3 Execution Stage

Table 4-15 LSTM Execution Function

| Function | xa_nnlib_lstm_process | | | | | |
|-------------|---|--|--|--|--|--|
| | Int32 xa_nnlib_lstm_process (| | | | | |
| Syntax | xa_nnlib_handle_t handle, | | | | | |
| | void *scratch, | | | | | |
| | void *input, | | | | | |
| | void *output, | | | | | |
| | xa_nnlib_shape_t *p_in_shape, | | | | | |
| | xa_nnlib_shape_t *p_out_shape) | | | | | |
| Description | Processes one input shape to generate one output shape. | | | | | |
| Parameters | Input: handle | | | | | |
| | The opaque component handle. | | | | | |
| | Required alignment: 8 bytes. | | | | | |
| | | | | | | |
| | Input: scratch | | | | | |
| | A pointer to the scratch buffer. | | | | | |
| | Required alignment: 8 bytes. | | | | | |
| | Input: input | | | | | |
| | A pointer to the input buffer. Input buffer contains input data. | | | | | |
| | Required alignment: 8 bytes. | | | | | |
| | Output: output | | | | | |
| | A pointer to the output buffer. Output is written to the output buffer. | | | | | |
| | Required alignment: 8 bytes. | | | | | |
| | Input/Output: p_in_shape | | | | | |
| | Pointer to the shape containing input buffer dimensions. Contains the length of input data passed to LSTM layer. Required alignment: 4 bytes. | | | | | |
| | Input/Output: p_out_shape | | | | | |



| , | Pointer to the shape for output buffer dimensions. On return, *p_out_shape is filled with the length of output generated by HiFi LSTM layer. Required alignment: 4 bytes. | | | | |
|---|--|--|--|--|--|
| | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: XA_NNLIB_FATAL_MEM_ALLOC One of the pointers is NULL. XA_NNLIB_FATAL_MEM_ALIGN One of the pointers is not having proper alignment. XA_NNLIB_FATAL_INVALID_SHAPE Either input or output shape is invalid. XA_NNLIB_LSTM_EXECUTE_FATAL_INSUFFICIENT_DATA Input data passed in insufficient XA_NNLIB_LSTM_EXECUTE_FATAL_INSUFFICIENT_OUTPUT_ BUFFER_SPACE Output Buffer Size is not sufficient | | | | |



Table 4-16 LSTM Set Parameter Function Details

| Function | xa_nnlib_lstm_set_config | | | | | |
|-------------|--|--|--|--|--|--|
| Syntax | Int32 | | | | | |
| Symax | xa_nnlib_lstm_set_config (| | | | | |
| | | | | | | |
| | xa_nnlib_handle_t handle, | | | | | |
| | xa_nnlib_lstm_param_id_t param_id, | | | | | |
| | void *params) | | | | | |
| Description | Sets the parameter specified by param_id to the value passed in the buffer pointed to by params. | | | | | |
| Parameters | Input: handle | | | | | |
| | The opaque component handle. | | | | | |
| | Required alignment: 8 bytes. | | | | | |
| | <pre>Input: param_id</pre> | | | | | |
| | Identifies the parameter to be written. Refer to Table 4-11 for the list of | | | | | |
| | supported parameters. | | | | | |
| | Input: params | | | | | |
| | A pointer to a buffer that contains the parameter value. | | | | | |
| | Required alignment: 4 bytes. | | | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the | | | | | |
| | function has encountered one of the following errors: | | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | | |
| | One of the pointers (handle or params) is NULL. | | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | | |
| | One of the pointers (handle or params) is not aligned correctly. | | | | | |
| | XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PARAM_ID | | | | | |
| | Parameter identifier (param_id) is not valid. | | | | | |



Table 4-17 LSTM Get Parameter Function Details

| Function | xa_nnlib_lstm_get_config | | | |
|-------------|---|--|--|--|
| Syntax | <pre>Int32 xa_nnlib_lstm_get_config (xa_nnlib_handle_t handle, xa_nnlib_lstm_param_id_t param_id, void *params)</pre> | | | |
| Description | Gets the value of the parameter specified by param_id in the buffer pointed to by params. | | | |
| Parameters | Input: handle The opaque component handle. Required alignment: 8 bytes. Input: param_id Identifies the parameter to be read. Refer to Table 4-11 for the list of supported parameters. Output: params A pointer to a buffer that is filled with the parameter value when the function returns. Required alignment: 4 bytes. | | | |
| Errors | Required alignment: 4 bytes. If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: XA_NNLIB_FATAL_MEM_ALLOC One of the pointers (handle or params) is NULL. XA_NNLIB_FATAL_MEM_ALIGN One of the pointers (handle or params) is not aligned correctly. XA_NNLIB_LSTM_CONFIG_FATAL_INVALID_PARAM_ID Parameter identifier (param_id) is not valid. | | | |



4.2.4 Structures Specific to LSTM

Table 4-18 LSTM Config Structure xa_nnlib_lstm_init_config_t

| Element Type | Element Name | Range | Default | Description |
|-----------------------------------|-------------------|--|---------------------------|---|
| Int32 | in_feats | 4-2048 | 256 | Number of input features (must be multiple of 4) |
| Int32 | out_feats | 4-2048 | 256 | Number of output features (must be multiple of 4) |
| Int32 | pad | 0, 1 | 1 | Padding 16 bytes for HiFi 5 DSP |
| Int32 | mat_prec | 8, 16 | 16 | Matrix input precision |
| Int32 | vec_prec | 16 | 16 | Vector input precision |
| xa_nnlib_lst m_precision_ t | precision | XA_NNLIB_LSTM _16bx16b, XA_NNLIB_LSTM _8bx16b | XA_NNLIB_LST M_16bx16b | Coef and I/O precision. Note: The current library supports only 16bx16b and 8bx16b precision for LSTM. |
| Int16 | coeff_Qfo rmat | 0-15 | 15 | Number of fractional bits for weights and biases |
| Int16 | cell_Qfor mat | 0-26 | | Number of fractional bits for cells. |
| Int16 | io_Qforma t | 0-15 | 12 | Number of fractional bits for input and output |

Table 4-19 xa_nnlib_lstm_weights_t Parameter Type

| Element Type | Element Name | Range | Default | Description |
|--------------|--------------|-------|---------|-------------------------------------|
| coeff_t * | w_xf | NA | NA | Pointer to coefficient matrix w_xf. |
| xa_nnlib_ | shape_w_xf | NA | NA | Shape information about w_xf. |
| shape_t | | | | |
| coeff_t * | w_xi | NA | NA | Pointer to coefficient matrix w_xi. |
| xa_nnlib_ | shape_w_xi | NA | NA | Shape information about w_xi. |
| shape_t | | | | |
| coeff_t * | W_XC | NA | NA | Pointer to coefficient matrix w_xc. |
| xa_nnlib_ | shape_w_xc | NA | NA | Shape information about w_xc. |
| shape_t | | | | |
| coeff_t * | W_XO | NA | NA | Pointer to coefficient matrix w_xo. |
| xa_nnlib_ | shape_w_xo | NA | NA | Shape information about w_xo. |
| shape_t | | | | |
| coeff_t * | w_hf | NA | NA | Pointer to coefficient matrix w_hf. |
| xa_nnlib_ | shape_w_hf | NA | NA | Shape information about w_hf. |
| shape_t | | | | |
| coeff_t * | w_hi | NA | NA | Pointer to coefficient matrix w_hi. |

| Element Type | Element Name | Range | Default | Description |
|--------------|--------------|-------|---------|-------------------------------------|
| xa_nnlib_ | shape_w_hi | NA | NA | Shape information about w_hi. |
| shape_t | | | | |
| coeff_t * | w_hc | NA | NA | Pointer to coefficient matrix w_hc. |
| xa_nnlib_ | shape_w_hc | NA | NA | Shape information about w_hc. |
| shape_t | | | | |
| coeff_t * | w_ho | NA | NA | Pointer to coefficient matrix w_ho. |
| xa_nnlib_ | shape_w_ho | NA | NA | Shape information about w_ho. |
| shape_t | | | | |

Table 4-20 xa_nnlib_lstm_biases_t Parameter Type

| Element Type | Element Name | Range | Default | Description |
|------------------|--------------|-------|---------|------------------------------------|
| coeff_t * | b_f | NA | NA | Pointer to coefficient matrix b_f. |
| xa_nnlib_shape_t | shape_b_f | NA | NA | Shape information about b_f. |
| coeff_t * | b_i | NA | NA | Pointer to coefficient matrix b_i. |
| xa_nnlib_shape_t | shape_b_i | NA | NA | Shape information about b_i. |
| coeff_t * | b_c | NA | NA | Pointer to coefficient matrix b_c. |
| xa_nnlib_shape_t | shape_b_c | NA | NA | Shape information about b_c. |
| coeff_t * | b_0 | NA | NA | Pointer to coefficient matrix b_o. |
| xa_nnlib_shape_t | shape_b_o | NA | NA | Shape information about b_o. |

Note LSTM requires all weight matrices' and bias vectors' pointers to be 8 bytes aligned.

4.2.5 Enums Specific to LSTM

Table 4-21 Enum xa_nnlib_lstm_precision_t

| Element | Description |
|-----------------------|---|
| XA_NNLIB_LSTM_16bx16b | Coef: 16 bits, I/O: 16 bits Fixed Point |
| XA_NNLIB_LSTM_8bx16b | Coef: 8 bits, I/O: 16 bits Fixed Point |
| XA_NNLIB_LSTM_8bx8b | Not supported |
| XA_NNLIB_flt16xflt16 | Not supported |

Note Currently, LSTM only supports the XA_NNLIB_LSTM_16bx16b, XA_NNLIB_LSTM_8bx16b precision setting.



Table 4-22 describes parameter IDs for parameters supported by LSTM. It contains the following columns:

- Parameter ID: Parameter identifier (param_id).
- Value type: A pointer (params) to a variable of this type is to be passed.
- RW: Indicates whether the parameter can be read (get) and/or written (set).
- Range: Indicates valid values of the parameter.
- Default: Default value of the parameter.
- Description: Brief description of the parameter.

Table 4-22 LSTM Specific Parameters

| Parameter ID | Value Type | RW | Range | Default | Description |
|--|---------------------------------|----|-------|---------|--|
| XA_NNLIB_LSTM_RESTORE_ CONTEXT_OUTPUT | vect_t [] | RW | NA | NA | Set previous output. This can be used to set prev_h to specific context (size should be equal to number of output features). Upon set config, the buffer passed is copied to persistent memory; upon get config, it returns the prev_h state in the given buffer. |
| XA_NNLIB_LSTM_RESTORE_ CONTEXT_CELL | vect_t [] | RW | NA | NA | Set previous cell state. This can be used to set prev_c to specific cell context (size should be equal to number of output features). Upon set config, the buffer passed is copied to persistent memory; upon get config, it returns the prev_c state in the given buffer. |
| XA_NNLIB_LSTM_WEIGHT | xa_nnlib_ lstm_ weights_t | RW | NA | NA | Weight matrices, pointers to weight matrices along with shape information needs to be passed via xa_nnlib_lstm_weights_t structure for set config. Upon get config, it returns pointers to weight matrices along with their shape information in same structure. |
| XA_NNLIB_LSTM_BIAS | xa_nnlib_ lstm_ biases_t | RW | NA | NA | Bias vectors, pointers to bias vectors along with shape information needs to be passed via xa_nnlib_lstm_biases_t structure for set config. Upon get config, it returns pointers to bias vectors along with their shape information in same structure. |
| XA_NNLIB_LSTM_INPUT_ SHAPE | xa_nnlib_ shape_t | R | NA | NA | Input shape information, get information of the input shape expected by the layer. |
| A_NNLIB_LSTM_OUTPUT_ SHAPE | xa_nnlib_ shape_t | R | NA | NA | Output shape information, get information of the output shape expected by layer. |

4.3 CNN Layer

The CNN APIs are defined in xa_nnlib_cnn_api.h.

4.3.1 CNN Layer Specification

The CNN layer implements Standard 2D Convolution, Standard 1D Convolution, and Depthwise Separable 2D Convolution. Refer to the equations in Section 3.2.1 for Standard 2D Convolution, Section 3.2.2 for Standard 1D Convolution, and Section 3.2.3 for Depthwise Separable 2D Convolution.

4.3.2 Error Codes Specific to CNN

Other than common error codes explained in Section 2.3, the CNN layer may also report the following error codes, which may be generated during the initialization stage.

- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ALGO
 Algorithm is not supported
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PRECISION
 I/O precision is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHIFT
 Value of Bias shift is not supported
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ACC_SHIFT
 Value of Accumulator shift is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_STRIDE
 Value of strides is not supported
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PADDING
 Value of padding is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_INPUT_SHAPE
 Input shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_OUTPUT_SHAPE
 Out shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_KERNEL_SHAPE
 Kernel shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHAPE
 Bias shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ID
 Parameter identifier (param_id) is not valid



XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_COMBINATION
 Parameter combination (param_id) is not valid

The following error codes may be generated during the execution stage.

XA_NNLIB_CNN_CONFIG_FATAL_INVALID_INPUT_SHAPE
 Input shape passed during execution does not match with the input shape passed during initialization

4.3.3 API Functions Specific to CNN

4.3.3.1 Query Functions

Table 4-23 CNN Get Persistent Size Function

| Function | | | | | |
|-------------|--|--|--|--|--|
| | xa_nnlib_cnn_get_persistent_fast | | | | |
| Syntax | Int32 xa_nnlib_cnn_get_persistent_fast (| | | | |
| | xa_nnlib_cnn_init_config_t *config) | | | | |
| | | | | | |
| Description | Returns persistent memory size in bytes required by CNN layer. | | | | |
| Parameters | Input: config | | | | |
| | Initial configuration parameters (see Table 4-29). | | | | |
| Errors | If return value is less than 0, then it is an error. Following are the possible error codes: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ALGO | | | | |
| | Algorithm is not supported | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PRECISION | | | | |
| | I/O precision is not supported. | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHIFT | | | | |
| | Value of Bias shift is not supported | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ACC_SHIFT | | | | |
| | Value of Accumulator shift is not supported. | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_STRIDE | | | | |
| | Value of strides is not supported | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PADDING | | | | |
| | Value of padding is not supported. | | | | |
| | | | | | |



XA_NNLIB_CNN_CONFIG_FATAL_INVALID_INPUT_SHAPE Input shape dimension is not supported.
 XA_NNLIB_CNN_CONFIG_FATAL_INVALID_OUTPUT_SHAPE Out shape dimension is not supported.
 XA_NNLIB_CNN_CONFIG_FATAL_INVALID_KERNEL_SHAPE Kernel shape dimension is not supported.
 XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHAPE Bias shape dimension is not supported
 XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ID Parameter identifier (param_id) is not valid
 XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_COMBINATION
 Parameter combination (param_id) is not valid

Table 4-24 CNN Get Scratch Size Function

| Function | xa nnlib cnn get scratch fast | | | |
|-------------|--|--|--|--|
| - 4 | | | | |
| Syntax | Int32 xa_nnlib_cnn_get_scratch_fast (| | | |
| | xa_nnlib_cnn_init_config_t *config) | | | |
| | | | | |
| Description | Returns scratch memory size in bytes required by CNN layer. | | | |
| Parameters | Input: config | | | |
| | Initial configuration parameters (see Table 4-29). | | | |
| Errors | If return value is less than 0, then it is an error. Following are the possible error codes: | | | |
| | citor codes. | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ALGO | | | |
| | Algorithm is not supported | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PRECISION | | | |
| | I/O precision is not supported. | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHIFT | | | |
| | Value of bias shift is not supported | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ACC_SHIFT | | | |
| | Value of Accumulator shift is not supported. | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_STRIDE | | | |
| | Value of strides is not supported | | | |



- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PADDING
 Value of padding is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_INPUT_SHAPE
 Input shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_OUTPUT_SHAPE
 Out shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_KERNEL_SHAPE
 Kernel shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHAPE
 Bias shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ID
 Parameter identifier (param_id) is not valid
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ COMBINATION

Parameter combination (param_id) is not valid



4.3.3.2 Initialization Stage

Table 4-25 CNN Init Function

| Function | xa_nnlib_cnn_init | | | |
|-------------|--|--|--|--|
| Syntax | int xa_nnlib_cnn_init (| | | |
| | xa_nnlib_handle_t handle, | | | |
| | xa_nnlib_cnn_init_config_t *config) | | | |
| Description | Reset the CNN layer API handle into its initial state. Set up the CNN layer to the specified initial configuration parameters. | | | |
| Parameters | Input: handle Pointer to the component persistent memory. This is the opaque handle. Required size: see xa_nnlib_cnn_get_persistent_fast. Required alignment: 8 bytes. Input: config Initial configuration parameters (see Table 4-29). Note that the initial configuration parameters <i>must</i> be identical to those passed to query functions. | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: XA_NNLIB_FATAL_MEM_ALLOC One of the pointers is invalid. XA_NNLIB_FATAL_MEM_ALIGN One of the pointers is not properly aligned. XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ALGO Algorithm is not supported. XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PRECISION I/O precision is not supported. XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHIFT Value of Bias shift is not supported. XA_NNLIB_CNN_CONFIG_FATAL_INVALID_ACC_SHIFT Value of Accumulator shift is not supported. XA_NNLIB_CNN_CONFIG_FATAL_INVALID_STRIDE Value of strides is not supported. XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PADDING Value of padding is not supported. | | | |



- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_INPUT_SHAPE
 Input shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_OUTPUT_SHAPE
 Out shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_KERNEL_SHAPE
 Kernel shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_BIAS_SHAPE
 Bias shape dimension is not supported.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ID
 Parameter identifier (param_id) is not valid.
- XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ COMBINATION

Parameter combination (param_id) is not valid.



4.3.3.3 Execution Stage

Table 4-26 CNN Execution Function

| Function | xa_nnlib_cnn_process | | | | |
|-------------|---|--|--|--|--|
| Syntax | int xa_nnlib_cnn_process (| | | | |
| • | xa_nnlib_handle_t handle, | | | | |
| | void *scratch, | | | | |
| | void *input, | | | | |
| | void *output, | | | | |
| | <pre>xa_nnlib_shape_t *p_in_shape,</pre> | | | | |
| | xa_nnlib_shape_t *p_out_shape) | | | | |
| Description | Processes one input shape to generate one output shape. | | | | |
| Parameters | Input: handle | | | | |
| | The opaque component handle. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: scratch | | | | |
| | A pointer to the scratch buffer. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: input | | | | |
| | A pointer to the input buffer. Input buffer contains input data. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Output: output | | | | |
| | A pointer to the output buffer. Output is written to the output buffer. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input/Output: p_in_shape | | | | |
| | Pointer to the shape containing input buffer dimensions. Contains the length of input data passed to the CNN layer. | | | | |
| | Required alignment: 4 bytes. | | | | |
| | Output: p_out_shape | | | | |
| | Pointer to the shape for output buffer dimensions. Upon return, *p_out_shape is filled with the length of output generated by the CNN layer. | | | | |
| | Required alignment: 4 bytes. | | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | |
| | One of the pointers is NULL | | | | |
| | | | | | |



XA_NNLIB_FATAL_MEM_ALIGN
 One of the pointers is not having required alignment

XA_NNLIB_FATAL_INVALID_SHAPE
 Input shape passed during execution does not match with the input shape passed during initialization

Table 4-27 CNN Set Parameter Function Details

| Function | xa_nnlib_cnn_set_config | | | | |
|-------------|---|--|--|--|--|
| Syntax | int xa_nnlib_cnn_set_config (| | | | |
| | xa_nnlib_handle_t handle, | | | | |
| | xa_nnlib_cnn_param_id_t param_id, | | | | |
| | void *params) | | | | |
| Description | Sets the parameter specified by param_id to the value passed in the buffer pointed to by params. | | | | |
| Parameters | Input: handle | | | | |
| | The opaque component handle. | | | | |
| | Required alignment: 8 bytes. | | | | |
| | Input: param_id | | | | |
| | Identifies the parameter to be written. Refer to Table 4-32 for the list of supported parameters. | | | | |
| | Input: params | | | | |
| | A pointer to a buffer that contains the parameter value. Required alignment: 4 bytes. | | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: | | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | | |
| | One of the pointers (handle or params) is NULL. | | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | | |
| | One of the pointers (handle or params) is not aligned correctly. | | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ID | | | | |
| | Parameter identifier (param_id) is not valid. | | | | |



Table 4-28 CNN Get Parameter Function Details

| Function | xa_nnlib_cnn_get_config | | | |
|-------------|---|--|--|--|
| Syntax | <pre>int xa_nnlib_cnn_get_config(xa_nnlib_handle_t handle, xa_nnlib_cnn_param_id_t param_id, void *params)</pre> | | | |
| Description | Gets the value of the parameter specified by param_id in the buffer pointed to by params. | | | |
| Parameters | Input: handle The opaque component handle. Required alignment: 8 bytes. | | | |
| | nput: param_id dentifies the parameter to be read. Refer to Table 4-32 for the list of supported parameters. | | | |
| | put: params binter to a buffer that is filled with the parameter value when the stion returns. uired alignment: 4 bytes. | | | |
| Errors | If the return value is not XA_NNLIB_NO_ERROR, it implies that the function has encountered one of the following errors: | | | |
| | XA_NNLIB_FATAL_MEM_ALLOC | | | |
| | One of the pointers (handle or params) is NULL. | | | |
| | XA_NNLIB_FATAL_MEM_ALIGN | | | |
| | One of the pointers (handle or params) is not aligned correctly. | | | |
| | XA_NNLIB_CNN_CONFIG_FATAL_INVALID_PARAM_ID | | | |
| | Parameter identifier (param_id) is not valid. | | | |



4.3.4 Structures Specific to CNN

Table 4-29 CNN Config Structure xa_nnlib_cnn_init_config_t

| Element Type | Element Name | Range | Default | Description |
|------------------------------|-------------------------------|--|---|---|
| xa_nnlib_ | input_ | NA | height = 16 | Input shape dimensions |
| shape_t | shape | | width = 16 channels = 4 | |
| Int32 | output_ height | NA | 16 | Output height |
| Int32 | output_ width | NA | 16 | Output width |
| Int32 | output_ channels | NA | 4 | Output depth or channels |
| Int32 | output_ format | 0 or 1 | 0 | Output data format 0: SHAPE_CUBE_DWH_T 1: SHAPE_CUBE_WHD_T |
| xa_nnlib_ shape_t | kernel_ std_shape | NA | height = 16 width = 16 channels = 4 | Standard 1D/2D Convolution Kernel (Filter) shape dimensions output_channels indicate number of kernels |
| xa_nnlib_ shape_t | kernel_ ds_depth_ shape | NA | NA | Depthwise Separable 2D Convolution - Depthwise Kernel (filter) Dimensions |
| xa_nnlib_ shape_t | kernel_ds_ point_ shape | NA | NA | Depthwise Separable 2D Convolution - Pointwise Kernel (filter) Dimensions |
| xa_nnlib_ shape_t | bias_std_ shape | NA | channels = 4 | Standard 1D/2D Convolution Bias dimensions |
| xa_nnlib_ shape_t | bias_ds_ depth_ shape | NA | NA | Depthwise Separable 2D Convolution - Depthwise Bias) Dimensions |
| xa_nnlib_ shape_t | bias_ds_ point_ shape | NA | NA | Depthwise Separable 2D Convolution – Pointwise Bias Dimensions |
| xa_nnlib_cnn _precision_t | precision | XA_NNLIB_ CNN_16bx1 6b, XA_NNLIB_ CNN_8bx16 b, XA_NNLIB_ CNN_8bx8b, XA_NNLIB_ CNN_f32xf3 2 | XA_NNLIB_CNN_8b x16b | Kernel (filter), input, output precision setting |
| Int32 | bias_ shift | -31 to 31 | 7 | Q-format adjustment for bias before addition into accumulator, +/- value - left/right shift |

| Element Type | Element Name | Range | Default | Description |
|--------------|--------------|-----------|-----------------|--|
| Int32 | acc_shift | -31 to 31 | -7 | Q-format adjustment for accumulator before rounding to |
| | | | | result, +/- value - left/right shift |
| Int32 | channels_ | NA | NA | Depthwise Separable 2D |
| | multiplier | | | Convolution - channel multiplier. |
| | | | | (channels_multiplier |
| | | | | * input_channels) must |
| | | | | be multiple of 4 |
| Int32 | x_padding | NA | 2 | Left side padding to be added to |
| | | | | input |
| Int32 | y_padding | NA | 2 | Top padding to be added to |
| | | | | input |
| Int32 | x_stride | NA | 2 | Strides over padded input in |
| | | | | width dimension |
| Int32 | y_stride | NA | 2 | Strides over padded input in |
| | _ | | | height dimension |
| xa_nnlib_cnn | algo | NA | XA_NNLIB_CNN_CO | Convolution algorithm |
| _algo_t | | | NV2D_STD | |

4.3.5 Enums Specific to CNN

Table 4-30 Enum xa_nnlib_cnn_precision_t

| Element | Description |
|----------------------|---|
| XA_NNLIB_CNN_16bx16b | Coef: 16 bits, I/O: 16 bits fixed point |
| XA_NNLIB_CNN_8bx16b | Coef: 8 bits, I/O: 16 bits fixed point |
| XA_NNLIB_CNN_8bx8b | Coef: 8 bits, I/O: 8 bits fixed point |
| XA_NNLIB_CNN_f32xf32 | Coef: single precision float, I/O: single precision float |

Table 4-31 Enum xa_nnlib_cnn_algo_t

| Element | Description | | |
|-------------------------|------------------------------------|--|--|
| XA_NNLIB_CNN_CONV1D_ST | Standard 1D Convolution | | |
| XA_NNLIB_CNN_CONV2D_STD | Standard 2D Convolution | | |
| XA_NNLIB_CNN_CONV2D_DS | Depthwise Separable 2D Convolution | | |



Table 4-32 describes parameter IDs for parameters supported by CNN. It contains the following columns:

- Parameter ID: Parameter identifier (param_id).
- Value type: A pointer (params) to a variable of this type is to be passed.
- RW: Indicates whether the parameter can be read (get) and/or written (set).
- Range: Indicates valid values of the parameter.
- Default: Default value of the parameter
- Description: Brief description of the parameter.

Table 4-32 CNN Specific Parameters

| Parameter ID | Value Type | RW | Range | Default | Description |
|-------------------------------|------------------------------|----|-------|---------|--|
| XA_NNLIB_CNN_KERNEL | vect_t [] | RW | NA | NA | Kernel shape information, get or set information of the kernel shape expected by the layer |
| XA_NNLIB_CNN_BIAS | vect_t | RW | NA | NA | Bias shape information, get or set information of the bias shape expected by the layer |
| XA_NNLIB_CNN_INPUT_ SHAPE | xa_ nnlib_ shape_ t | R | NA | NA | Input shape information, get information of the input shape expected by the layer. |
| XA_NNLIB_CNN_OUTPUT_ SHAPE | xa_ nnlib_ shape_ t | R | NA | NA | Output shape information, get information of the output shape produced by layer. |



5.Introduction to the Example Testbench

5.1 Making the Library

If you have source code distribution, you must build the NN library before you can build the testbench. To do so, follow these steps:

- 1. Go to build.
- 2. From the command prompt, enter: xt-make -f makefile clean all install

The NN library xa_nnlib.a will be built and copied to the lib directory.

5.2 Making the Executable

To build the testbenches, follow these steps:

- 1. Go to test/build.
- 2. From the command-line prompt, enter:
 xt-make -f makefile_testbench_sample clean all

This will build the example testbenches for all the kernels and layers.

The following header files are common and used by all testbenches.

- Testbench header files (test/include)
 - xt_profiler.h
 - cmdline_parser.h
 - file_io.h
 - xt_manage_buffers.h

The following sections describe each low-level kernel and layer testbench.



5.3 Sample Testbench for Matrix X Vector Multiplication Kernels

The NN library Matrix X Vector Multiplication Kernels are provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_matXvec_testbench.c

5.3.1 **Usage**

The NN library Matrix X Vector Multiplication Kernels executable can be run with command-line options as follows.

\$ xt-run [--mem_model] [--turbo] xa_nn_matXvec_test [options]

| Option | Description | Additional Information |
|------------------|--|---------------------------------------|
| -rows | Rows of mat1. | |
| -cols1 | Columns of mat1 and rows of mat2 (Default=32) | Columns of mat1 must be multiple of 4 |
| -cols2 | Columns of mat2 (Default=32) | Columns of mat2 must be multiple of 4 |
| -row_stride1 | Row stride for mat1(Default=32) | |
| -row_stride2 | Row stride for mat2(Default=32) | |
| -vec_count | Vec count for Time batching(Default=1) | |
| -acc_shift | Accumulator shift(Default=-7) | |
| -bias_shift | Bias shift(Default=7) | |
| -mat_precision | 8, 16, -1(single precision float), -3 (asym8u) or -5 (sym8s); (Default=16) | |
| -inp_precision | 8, 16, -1(single precision float), -3 (asym8u) or -4 (asym8s); (Default=16) | |
| -out_precision | 8, 16, 32, 64 -1(single precision float), -3 (asym8u) or -4 (asym8s); (Default=16) | |
| -bias_precision | 16, 64 -1(single precision float), 32(for quantized 8-bit kernels); (Default=16) | |
| -membank_padding | 0 or 1 (Default=1) | |
| -frames | Positive number; (Default=2) | |
| -activation | Sigmoid, tanh, relu or softmax (Default= bypass i.e. no activation for output) | |



| Option | Description | Additional Information |
|--------------------------|---|--|
| -write_file | Set to 1 to write input and output vectors to file; (Default=0) | |
| -read_inp_file_name | Full filename for reading inputs (order - mat1, vec1, mat2, vec2, bias) | |
| -read_ref_file_name | Full filename for reading reference output | |
| - write_inp_file_name | Full filename for writing inputs (order - mat1, vec1, mat2, vec2, bias) | |
| - write_out_file_name | Full filename for writing output | |
| -verify | Verify output against provided reference | 0: Disable, 1: Bit exact match (Default=1) |
| -batch | Flag to execute time batching kernels | 0: Disable, 1: Enable (Default=0) |
| -fc | Flag to execute fully connected kernels | 0: Disable, 1: Enable (Default=0) |
| -help | Prints help | |

If no command line arguments are given, the Matrix X Vector Multiplication Kernels sample testbench runs with default values.

5.4 Sample Testbench for Convolution Kernels

The NN library convolutional kernels are provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_conv_testbench.c

5.4.1 Usage

The NN Library convolutional kernels executable can be run with command-line options as follows.

| Option | Description |
|-----------------|----------------------------|
| -input_height | Input height (Default=16) |
| -input_width | Input width (Default=16) |
| -input_channels | Input channels (Default=4) |
| -kernel_height | Kernel height (Default=3) |



| Option | Description | |
|----------------------|---|--|
| -kernel_width | Kernel width (Default=3) | |
| -out_channels | Out channels (Default=4) | |
| -channels_multiplier | Channel Multiplier (Default=1) | |
| -x_stride | Stride in width dimension (Default=2) | |
| -y_stride | Stride in height dimension (Default=2) | |
| -x_padding | Left padding in width dimension (Default=2) | |
| -y_padding | Top padding in height dimension (Default=2) | |
| -out_height | Output height (Default=16) | |
| -out_width | Output width (Default=16) | |
| -bias_shift | Bias shift (Default=7) | |
| -acc_shift | Accumulator shift (Default=-7) | |
| -inp_data_format | 0 (SHAPE_CUBE_DWH_T), 1 (SHAPE_CUBE_WHD_T) (Default=1) | |
| -out_data_format | 0 (SHAPE_CUBE_DWH_T), 1 (SHAPE_CUBE_WHD_T) (Default=0) | |
| -inp_precision | 8, 16, -1(single precision float), -3 (asym8u) or -4 (asym8s); (Default=16) | |
| -kernel_precision | 8, 16, -1(single precision float), -3 (asym8u) or -5 (sym8s); (Default=8) | |
| -out_precision | 8, 16, -1(single precision float), -3 (asym8u) or -4 (asym8s); (Default=16) | |
| -bias_precision | 8, 16, -1(single precision float), 32(for quantized 8-bit kernels) (Default=16) | |
| -frames | Positive number (Default=2) | |
| -kernel_name | conv2d_std, conv2d_depth, conv1d_std; (Default= conv2d_std) | |
| -write_file | Set to 1 to write input and output vectors to file; (Default=0) | |
| -read_inp_file_name | Full filename for reading inputs (order - input, kernel, bias, (pointwise kernel, pointwise bias for depth separable)) | |
| -read_ref_file_name | Full filename for reading reference output | |
| -write_inp_file_name | Full filename for writing inputs (order - input, kernel, bias, (pointwise kernel, pointwise bias for depth separable)) | |



| Option | Description |
|----------------------|--|
| -write_out_file_name | Full filename for writing output |
| -verify | Verify output against provided reference; 0: Disable, 1: Bit exact match (Default=1) |
| -help | Prints help |

If no command line arguments are given, the Convolutional Kernels sample testbench runs with default values.



5.5 Sample Testbench for Activation Kernels

The NN library activation kernels are provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_activations_testbench.c

5.5.1 **Usage**

The NN library activation kernels executable can be run with command-line options as follows.

\$ xt-run [--mem_model] [--turbo] xa_nn_activation_test [options]

| Option | Description | |
|-------------------------------------|---|--|
| -num_elements | Number of elements (Default=32) | |
| -relu_threshold | Threshold for relu in Q16.15 (Default= 32768 i.e. =1 in Q16.15) | |
| -inp_precision | 8, 16, 32, -1 (single precision float), -3 (asym8u) or -4 (asym8s); (Default=32) | |
| -out_precision | 8, 16, 32, -1(single precision float), -3 (asym8u) or -4 (asym8s); (Default=32) | |
| -frames | Positive number (Default=2) | |
| -activation | Sigmoid, tanh, relu, relu_std, relu1, relu6, activation_min_max or softmax (Default= sigmoid) | |
| -write_file | Set to 1 to write input and output vectors to file; (Default=0) | |
| -read_inp_file_name | Full filename for reading input | |
| -read_ref_file_name | Full filename for reading reference output | |
| - write_inp_file_name | Full filename for writing input | |
| - write_out_file_name | Full filename for writing output | |
| -verify | Verify output against provided reference; 0: Disable, 1: Bit exact match (Default=1) | |
| Quantized 8-bit specific parameters | | |
| -diffmin | Diffmin; Default=-15 | |
| -input_left_shift | Input_left_shift; Default=27 | |
| -input_multiplier | Input_multiplier; Default=2060158080 | |



| Option | Description |
|---------------------|--|
| -activation_max | asym8u input data activation max; Default=0 |
| -activation_min | asym8u input data activation min; Default=0 |
| -input_range_radius | Sigmoid_asym8u input parameter; Default=128 |
| -zero_point | Sigmoid_asym8u input parameter; Default=0 |
| -help | Prints help |

If no command line arguments are given, the Activation Kernels sample testbench runs with default values.

5.6 Sample Testbench for Pooling Kernels

The NN library pooling kernels are provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_pool_testbench.c

5.6.1 **Usage**

The NN library pooling kernels executable can be run with command-line options as follows.

| Option | Description |
|-----------------|---|
| -input_height | Input height (Default=16) |
| -input_width | Input width (Default=16) |
| -input_channels | Input channels (Default=4) |
| -kernel_height | Kernel height (Default=3) |
| -kernel_width | Kernel width (Default=3) |
| -x_stride | Stride in width dimension (Default=2) |
| -y_stride | Stride in height dimension (Default=2) |
| -x_padding | Left padding in width dimension (Default=2) |
| -y_padding | Top padding in height dimension (Default=2) |
| -out_height | Output height (Default=16) |
| -out_width | Output width (Default=16) |



| Option | Description | |
|----------------------|--|--|
| -acc_shift | Accumulator shift (Default=-7) | |
| -inp_data_format | 0 (SHAPE_CUBE_DWH_T), 1 (SHAPE_CUBE_WHD_T) (Default=1) | |
| -out_data_format | 0 (SHAPE_CUBE_DWH_T), 1 (SHAPE_CUBE_WHD_T) (Default=1) | |
| -inp_precision | 8, 16, -1(single precision float), -3(asym8u) (Default=16) | |
| -out_precision | 8, 16, -1(single precision float), -3(asym8u) (Default=16) | |
| -frames | Positive number (Default=2) | |
| -kernel_name | avgpool, maxpool (Default= avgpool) | |
| -write_file | set to 1 to write input and output vectors to file; (Default=0) | |
| -read_inp_file_name | Full filename for reading inputs (order - inp) | |
| -read_ref_file_name | Full filename for reading reference output | |
| -write_inp_file_name | Full filename for writing inputs (order - inp) | |
| -write_out_file_name | Full filename for writing output | |
| -verify | Verify output against provided reference; 0: Disable, 1: Bit exact match (Default=1) | |
| -help | Prints help | |

If no command line arguments are given, the Pooling Kernels sample testbench runs with default values.

5.7 Sample Testbench for Basic Operations Kernels

The NN library basic kernels are provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_basic_testbench.c

5.7.1 Usage

The NN library basic kernels executable can be run with command-line options as follows.

```
$ xt-run [--mem_model] [--turbo] xa_nn_basic_test [options]
```



| Option | Description | |
|------------------------|--|--|
| -io_length | Input/output vector length; Default=1024 | |
| -inp_precision | 16, -3 (asym8u), -1 (single prec float); Default=-1 | |
| -out_precision | -3 (asym8u), -1 (single prec float); Default=-1 | |
| -vec_count | Number of input vectors; Default=1 | |
| -frames | Positive number; Default=2 | |
| -kernel_name | elm_add, elm_sub, elm_mul, elm_mul_acc, elm_div, elm_floor, dot_prod; Default=elem_add | |
| -write_file | Set to 1 to write input and output vectors to file; Default=0 | |
| -read_inp1_file_name | Full filename for reading inputs (order - inp) | |
| -read_inp2_file_name | Full filename for reading inputs (order - inp) | |
| -read_ref_file_name | Full filename for reading reference output | |
| -write_inp1_file_name | Full filename for writing inputs (order - inp) | |
| -write_inp2_file_name | Full filename for writing inputs (order - inp) | |
| -write_out_file_name | Full filename for writing output | |
| -verify | Verify output against provided reference; 0: Disable, 1: Bit exact match; Default=1 | |
| Quantized 8-bit sp | ecific parameters | |
| -output_zero_bias | Output zero bias; Default=127 | |
| -output_left_shift | Output_left_shift; Default=1 | |
| -output multiplier | Output_multiplier; Default=0x7fff | |
| -output activation min | Output_activation_min; Default=0 | |
| -output_activation_max | Output_activation_max; Default=225 | |
| -input1_zero_bias | Input1 zero bias (Only needed in add_asym8u); Default=-127 | |
| -input1_left_shift | Input1_left_shif t(Only needed in add_asym8u); Default=0 | |
| -input1_multiplier | Input1_multiplier (Only needed in add_asym8u); Default=0x7fff | |
| -input2_zero_bias | Input2 zero bias (Only needed in add_asym8u); Default=-127 | |
| -input2_left_shift | Input2_left_shift (Only needed in add_asym8u); Default=0 | |
| -input2_multiplier | Input2_multiplier (Only needed in add_asym8u); Default=0x7fff | |



| Option | Description |
|-------------|--|
| -left_shift | Global left_shift (Only needed in add_asym8u); Default=0 |
| -h | Prints help |

If no command line arguments are given, the Basic Kernels sample testbench runs with default values.

5.8 Sample Testbench for GRU Layer

The NN library GRU layer is provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_gru_testbench.c

5.8.1 Usage

The NN library GRU executable can be run with command-line options as follows.

| Option | Description | Additional Information |
|-----------------|--|--|
| in_feats | Input length (Default=256) | Range: 4-2048 Note: Input length must be multiple of 4 |
| out_feats | Output length (Default=256) | Range: 4-2048 Note: Output length must be multiple of 4 |
| membank_padding | Memory bank padding (Default=1) | Must be 0 or 1 |
| mat_prec | Coefficient precision (Default=16) | Must be 8 or 16 |
| vec_prec | Input precision (Default=16) | Must be 16 |
| verify | Verify output against ref output (Default=1) | Supported values: 0: Disable, 1: Enable |
| input_file | Input file name | |
| filter_path | Path where file containing filter are stored | |
| output_file | File to which output will be written | |
| prev_h_file | File containing context data | |
| ref_file | File which has ref output | |



| Option | Description | Additional Information |
|--------|-------------|------------------------|
| -help | Prints help | |

If no command line arguments are given, the GRU sample testbench runs with default values.

5.9 Sample Testbench for LSTM Layer

The NN library LSTM layer is provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_lstm_testbench.c

5.9.1 Usage

The NN library LSTM executable can be run with command-line options as follows.

| Option | Description | Additional Information |
|------------------|--|--|
| in_feats | Input length (Default=256) | Range: 4-2048 Note: Input length must be multiple of 4 |
| out_feats | Output length (Default=256) | Range: 4-2048 Note: Output length must be multiple of 4 |
| membank_padding | Memory bank padding (Default=1) | Must be 0 or 1 |
| mat_prec | Coefficient precision (Default=16) | Must be 8 or 16 |
| vec_prec | Input precision (Default=16) | Must be 16 |
| verify | Verify output against ref output (Default=1) | Supported values: 0: Disable, 1: Enable |
| input_file | File containing input shape | |
| filter_path | Path where file containing filter are stored | |
| output_file | File to which output will be written | |
| output_cell_file | File to which cell output will be written | |
| prev_h_file | File containing context (previous output) data | |
| prev_c_file | File containing context (previous cell state) data | |
| ref_file | File which has ref output | |
| ref_cell_file | File which has ref cell output | |



| Option | Description | Additional Information |
|--------|-------------|------------------------|
| -help | Prints help | |

If no command line arguments are given, the LSTM sample testbench runs with default values.

5.10 Sample Testbench for CNN Layer

The NN library CNN layer is provided with a sample testbench application. The supplied testbench consists of the following files:

- Testbench source files (test/src)
 - xa_nn_cnn_testbench.c

5.10.1 Usage

The NN Library CNN executable can be run with command-line options as follows.

| Option | Description |
|----------------------|---|
| -input_height | Input height (Default=16) |
| -input_width | Input width (Default=16) |
| -input_channels | Input channels (Default=4) |
| -kernel_height | Kernel height (Default=3) |
| -kernel_width | Kernel width (Default=3) |
| -out_channels | Out channels (Default=4) |
| -channels_multiplier | Channel Multiplier (Default=1) |
| -x_stride | Stride in width dimension (Default=2) |
| -y_stride | Stride in height dimension (Default=2) |
| -x_padding | Left padding in width dimension (Default=2) |
| -y_padding | Top padding in height dimension (Default=2) |
| -out_height | Output height (Default=16) |
| -out_width | Output width (Default=16) |
| -bias_shift | Bias shift (Default=7) |
| -acc_shift | Accumulator shift (Default=-7) |
| -out_data_format | Output data format, 0 (SHAPE_CUBE_DWH_T), 1 |



| Option | Description |
|----------------------|---|
| | (SHAPE_CUBE_WHD_T); (Default=0) |
| -inp_precision | 8, 16, -1(single precision float); (Default=16) |
| -kernel_precision | 8, 16, -1(single precision float); (Default=8) |
| -out_precision | 8, 16, -1(single precision float); (Default=16) |
| -bias_precision | 8, 16, -1(single precision float); (Default=16) |
| -frames | Positive number; (Default=2) |
| -kernel_name | conv2d_std, conv2d_depth, conv1d_std; (Default= conv2d_std) |
| -write_file | Set to 1 to write input and output vectors to file; (Default=0) |
| -read_inp_file_name | Full filename for reading inputs (order - input, kernel, bias, (pointwise kernel, pointwise bias for depth separable)) |
| -read_ref_file_name | Full filename for reading reference output |
| -write_inp_file_name | Full filename for writing inputs (order - input, kernel, bias, (pointwise kernel, pointwise bias for depth separable)) |
| -write_out_file_name | Full filename for writing output |
| -verify | Verify output against provided reference; 0: Disable, 1: Bit exact match; Default=1 |
| -help | Prints help |

If no command line arguments are given, the CNN sample testbench runs with default values.

5.11 Sample Testbenches for Neural Network Examples

Along with the NN library this package includes two samples testbenches for NN use-case examples, $xa_nn_model_conv_test$ and $xa_nn_model_tiny_conv_test$. Both the applications consist of a pre-trained neural network model stored as read-only data. The testbenches use the NN library kernels for inference of the pre-trained neural network. The neural networks were trained using the Simple Audio Recognition tutorial in TensorFlow [2]. The test application uses a small convolutional neural network to recognize a word from the input spectrogram given as input. Currently, only single precision float processing is used. The input spectrogram is generated externally by extracting the speech features from an audio file(.wav) and they are stored as the .bin input files. The information related to the details of the NN model has been given in the testbench. Both the applications can work as a yes-no recognizer or a ten-word recognizer based on the selected model (-model).

The xa_nn_model_tiny_conv_test application consists of the following layers:

- Input
- Standard 2D Convolution
- ReLU
- Fully Connected
- Softmax

The xa_nn_model_conv_test application consists of the following layers:

- Input
- Standard 2D Convolution
- ReLU
- Maxpool
- Standard 2D Convolution
- ReLU
- Fully Connected
- Softmax

The supplied testbenches consist of the following files:

- Testbench source files (test/src)
 - xa_nn_model_tiny_conv_testbench.c
 - xa_nn_model_conv_testbench.c
- Testbench source files containing weights of the models (test/src)
 - tiny_conv2d_ker_bias.c
 - tiny_fc_ker_bias.c

- conv_conv2d_ker_bias.c
- conv_fc_ker_bias.c
- Additional Testbench include files (test/include)
 - tiny_conv2d_ker_bias.h
 - tiny_fc_ker_bias.h
 - conv_conv2d_ker_bias.h
 - conv_fc_ker_bias.h
- Testbench input files (test/test_inp)

Following is the naming convention for the input files:

- [NN model]_[word model]_[input word(s)].bin
 - tiny_conv_Ten_Word_stop.bin
 - tiny_conv_Ten_Word_stop_right.bin
 - tiny_conv_Yes_No_yes.bin
 - tiny_conv_Yes_No_yes_no.bin
 - conv_Ten_Word_down_on.bin
 - conv_Ten_Word_off.bin
 - conv_Yes_No_no.bin
 - conv_Yes_No_no_no.bin

5.11.1 Usage

The NN Library NN Model testbenches executable can be run with command-line options as follows.

```
$ xt-run [--mem_model] [--turbo] xa_nn_model_conv_test [options]
$ xt-run [--mem_model] [--turbo] xa_nn_model_tiny_conv_test
[options]
```

| Option | Description |
|---------------------|--|
| -read_inp_file_name | Full filename for reading input spectrogram. |
| -model | Yes_No, Ten_Word; (Default= |
| | Yes_No) |
| -precision | -1 for FLOAT32; (Default=-1 |
| - | FLOAT32) |
| -frames | Data frames to be processed. |
| | Should be a positive number. |
| | (Default=1) |
| -help | Shows help |



6. References

- [1] Reference Wiki page for GRU. https://en.wikipedia.org/wiki/Gated_recurrent_unit
- [2] Simple Audio Recognition tutorial in TensorFlow: https://www.tensorflow.org/tutorials/sequences/audio_recognition
- [3] <u>TensorFlow Lite for Microcontrollers</u>