

IMXTFLUG

i.MX TensorFlow Lite on Android User's Guide

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User guide

Document information

| Information | Content |
|-------------|--|
| Keywords | This document provides the i.MX TensorFlow Lite information on the Android platform. |
| Abstract | Android, i.MX, automotive-12.0.0_2.1.0 |



1 Neural Network Runtime Overview

The chapter provides an overview of the NXP eIQ software stack for use with the NXP Neural Network Accelerator IPs (GPU or NPU). The following figure shows the data flow between each element. The key part of this diagram is the Neural Network Runtime (NNRT), which is a middleware bridging various inference frameworks and the NN accelerator driver. The NNRT supplies different backends for Android NN HAL, Arm NN, ONNX, and TensorFlow Lite allowing quick application deployment. The NNRT also empowers an application-oriented framework for use with i.MX8 processors. Application frameworks such as Android NN, TensorFlow Lite, and Arm NN can be speed up by NNRT directly benefiting from its built-in backend plugins. This documents focuses on Android NN framework only. Additional backend can be also implemented to expand support for other frameworks.

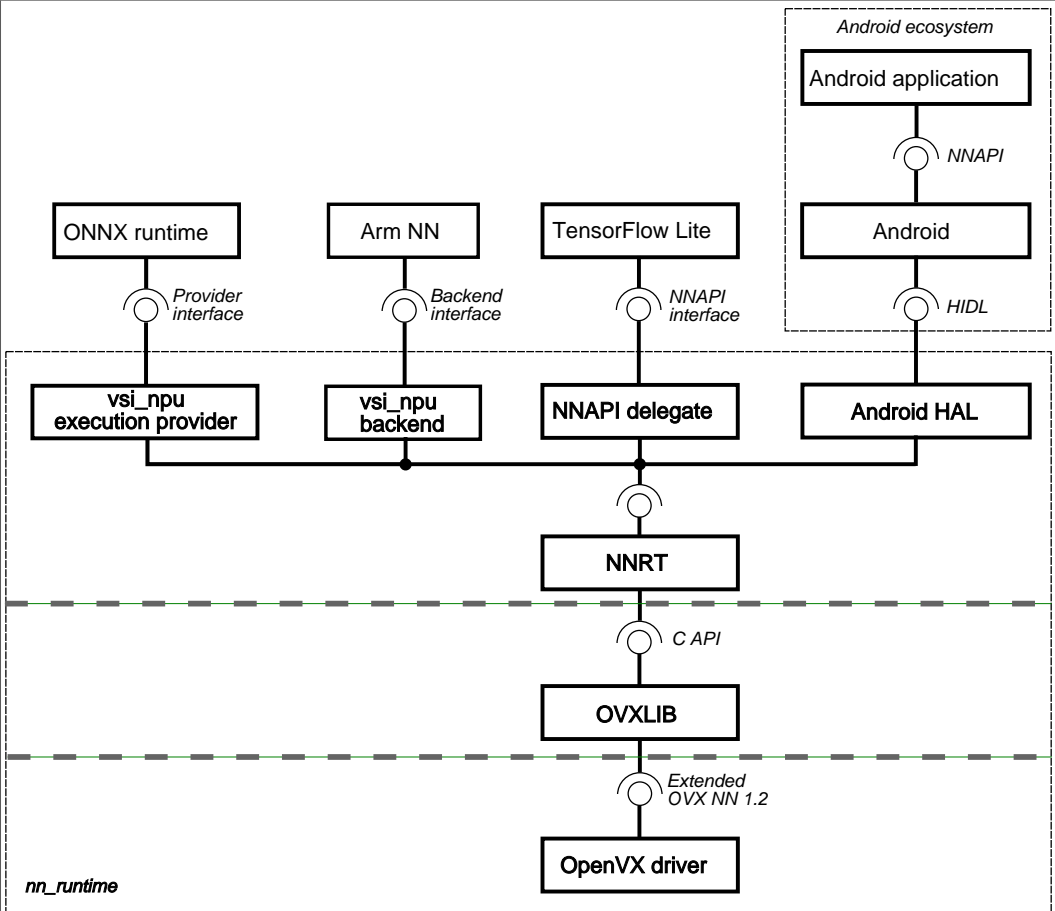


Figure 1. NNRT software architecture

NNRT supports different Machine Learning frameworks by registering itself as a compute backend. Because each framework defines a different backend API, a lightweight backend layer is designed for each. For Android NN, the NNRT follows the Android HIDL definition. It is compatible with v1.3 HAL interface.

In doing so, NNRT unifies application framework differences and provides an universal runtime interface into the driver stack. At the same time, NNRT also acts as the heterogeneous compute platform for further distributing workloads efficiently across i.MX 8 series compute devices, such as NPU, GPU and CPU.

2 TensorFlow Lite

TensorFlow Lite is a light-weight version of and a next step from TensorFlow. TensorFlow Lite is an open-source software library focused on running machine learning models on mobile and embedded devices (available at www.tensorflow.org/lite). It enables on-device machine learning inference with low latency and small binary size. TensorFlow Lite also supports hardware acceleration using Android OS Neural Networks API (NNAPI).

Features:

- TensorFlow Lite v2.4.0
- Multithreaded computation with acceleration using Arm Neon SIMD instructions on Cortex-A cores
- Parallel computation using GPU/NPU hardware acceleration (on shader or convolution units)
- C++ and Python API (supported Python version 3)
- Per-tensor and Per-channel quantized models support

2.1 TensorFlow Lite software stack

The TensorFlow Lite software stack is shown on the below picture. The TensorFlow Lite supports computation on the following HW units:

- CPU Arm Cortex-A core
- GPU/NPU hardware accelerator using the Android NN API driver

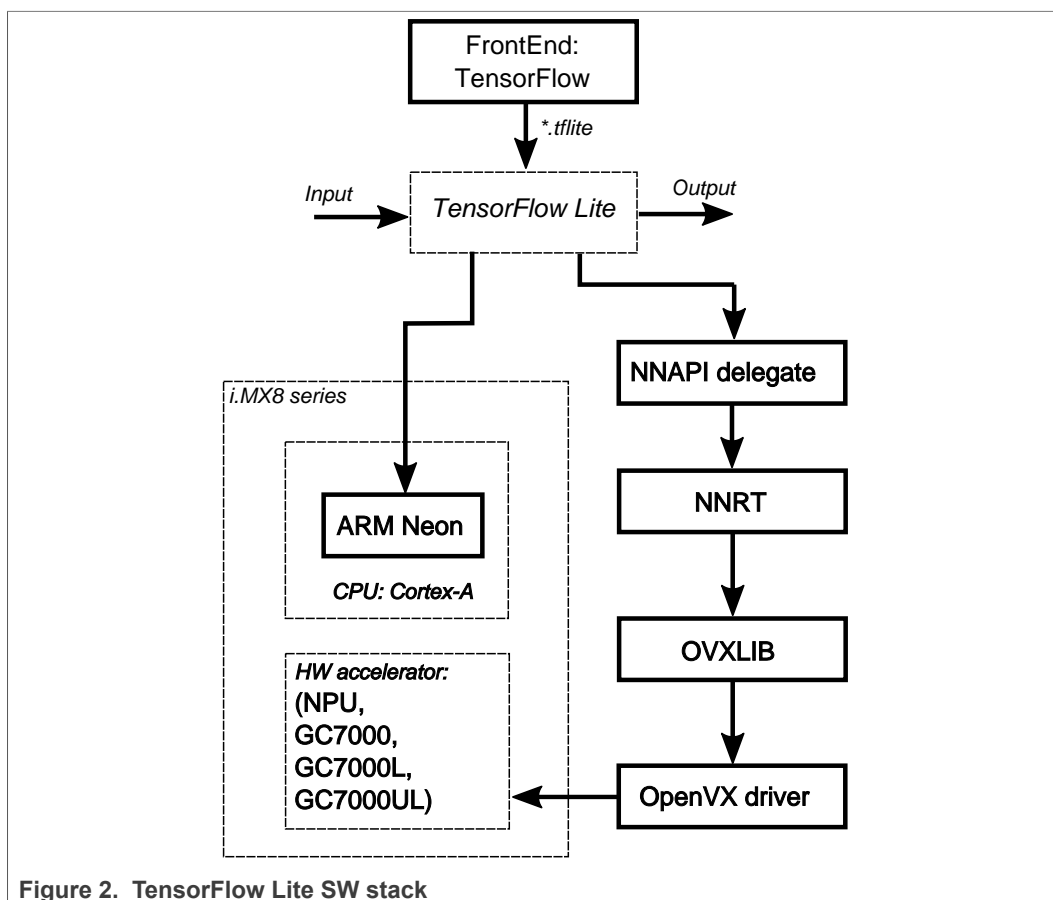


Figure 2. TensorFlow Lite SW stack

Note:

The TensorFlow Lite library uses the Android NN API driver implementation from the GPU/NPU driver for running inference using the GPU/NPU hardware accelerator. The implemented NN API version is 1.3, which has limitations in supported tensor data types and operations, compared to the feature set of TensorFlow Lite. Therefore, some models may work without acceleration enabled, but may fail when using the NN API. For the full list of supported features, see the NN HAL versions section of the NN API documentation: <https://source.android.com/devices/neural-networks#hal-versions>.

The first execution of model inference using the NN API always takes many times longer, because of model graph initialization needed by the GPU/NPU hardware accelerator. The iterations following the graph initialization are performed many times faster.

The NN API implementation uses the OpenVX library for model graph execution acceleration on the GPU/NPU hardware accelerator. Therefore, OpenVX library support must be available for the selected device to be able to use the acceleration. For more details on the OpenVX library availability, see the i.MX Graphics User's Guide (IMXGRAPHICUG).

The GPU/NPU hardware accelerator driver support both per-tensor and per-channel quantized models. In case of per-channel quantized models, performance degradation varies from slight differences, depending on the model used. This is caused by a hardware limitation, which is designed for per-tensor quantized models.

The TensorFlow Lite Converter V2 uses Quantize and Dequantize nodes to encapsulate some operation during quantization. Typically, the input and output tensor are followed/preceded by these nodes. As they are not fully supported by NN API their execution falls back to CPU. This causes the computational graph segmentation, leading to performance degradation. Because Android Tensorflow-lite benchmark program needs to interact with Vsi_Npu through HAL and RPC call, it introduces additional overhead for inference time while comparing with the Tensorflow-lite benchmark on the Linux OS.

2.2 Running benchmark applications

Benchmark application performs a simple TensorFlow Lite model inference and prints benchmarking information. For details, see <https://github.com/tensorflow/tensorflow/tree/v2.4.0/tensorflow/tools/benchmark>.

To build, install and run it, follow the steps below:

1. Download the TensorFlow source code from <https://github.com/tensorflow/tensorflow/tree/v2.4.0>.
2. See <https://github.com/tensorflow/tensorflow/tree/master/tensorflow/examples/android> to edit the WORKSPACE to configure the Android NDK/SDK.
 - Bazel version: 3.0.0 or later version
 - Android SDK API level: 31 (compatible with Android 12)
 - Android build tools version: 30.0.0 or later version
 - Android NDK API level 21
3. Build for your specific platform, for example,

```
bazel build -c opt --config=android_arm64 tensorflow/lite/
tools/benchmark:benchmark_model
```

4. Use a USB cable to connect the board with the machine. Push the binary to the board with ADB push (make the directory if required):

```
adb push bazel-bin/tensorflow/lite/tools/benchmark/  
benchmark_model /data/local/tmp
```

5. Make the binary executable.

```
adb shell chmod +x /data/local/tmp/benchmark_model
```

6. Push the compute graph that you need to test. For example,

```
adb push mobilenet_quant_v1_224.tflite /data/local/tmp
```

7. Run the benchmark. For example,

```
adb shell /data/local/tmp/benchmark_model --graph=/data/  
local/tmp/mobilenet_quant_v1_224.tflite --num_threads=4 adb  
shell /data/local/tmp/benchmark_model --graph=/data/local/  
tmp/mobilenet_quant_v1_224.tflite --use_nnapi=true
```

Benchmarking instructions:

To run the benchmark with computation on CPU with XNNPACK, use the following command line arguments:

```
adb shell /data/local/tmp/benchmark_model --graph=/data/  
local/tmp/mobilenet_v2_1.0_224_quant.tflite --num_threads=4 --  
use_xnnpack=true
```

The output of the benchmarking application should be similar to:

```
STARTING!  
Min num runs: [50]  
Min runs duration (seconds): [1]  
Max runs duration (seconds): [150]  
Inter-run delay (seconds): [-1]  
Num threads: [4]  
Benchmark name: []  
Output prefix: []  
Min warmup runs: [1]  
Min warmup runs duration (seconds): [0.5]  
Graph: [/data/local/tmp/mobilenet_v2_1.0_224_quant.tflite]  
Input layers: []  
Input shapes: []  
Input value ranges: []  
Input layer values files: []  
Use legacy nnapi : [0]  
Allow fp16 : [0]  
Require full delegation : [0]  
Enable op profiling: [0]  
Max profiling buffer entries: [1024]  
CSV File to export profiling data to: []  
Max number of delegated partitions : [0]  
Use gpu : [0]  
Allow lower precision in gpu : [1]  
Use Hexagon : [0]  
Hexagon lib path : [/data/local/tmp]  
Hexagon Profiling : [0]  
Use nnapi : [0]  
Use xnnpack : [0]
```

```
Loaded model /data/local/tmp/mobilenet_v2_1.0_224_quant.tflite
INFO: Initialized TensorFlow Lite runtime.
The input model file size (MB): 3.57776
Initialized session in 2.975 ms.
Running benchmark for at least 1 iterations and at least 0.5
seconds but terminate if exceeding 150 seconds.
count=16 first=35481 curr=32384 min=32038 max=35481 avg=32465.5
std=787
Running benchmark for at least 50 iterations and at least 1
seconds but terminate if exceeding 150 seconds.
count=50 first=32623 curr=32300 min=32056 max=32895 avg=32283.4
std=136
Average inference timings in us: Warmup: 32465.5, Init: 2975,
Inference: 32283.4
Note: as the benchmark tool itself affects memory footprint,
the following is only APPROXIMATE to the actual memory
footprint of the model at runtime. Take the information at
your discretion.
Peak memory footprint (MB): init=2.46484 overall=5.73047
```

To run the inference using the GPU/NPU hardware accelerator, add the `--use_nnapi=true` command line argument:

```
For NPU:
adb shell /data/local/tmp/benchmark_model
--graph=/data/local/tmp/mobilenet_v2_1.0_224_quant.tflite
--use_nnapi=true --nnapi_accelerator_name=vsi-npu
For GPU:
adb root adb shell setprop vendor.USE_GPU_INFERENCE 1 adb
shell /data/local/tmp/benchmark_model
--graph=/data/local/tmp/mobilenet_v2_1.0_224_quant.tflite --
use_nnapi=true
```

The output with GPU/NPU module acceleration enabled should be similar to:

```
STARTING!
Min num runs: [50]
Min runs duration (seconds): [1]
Max runs duration (seconds): [150]
Inter-run delay (seconds): [-1]
Num threads: [1]
Benchmark name: []
Output prefix: []
Min warmup runs: [1]
Min warmup runs duration (seconds): [0.5]
Graph: [/data/local/tmp/mobilenet_v2_1.0_224_quant.tflite]
Input layers: []
Input shapes: []
Input value ranges: []
Input layer values files: []
Use legacy nnapi : [0]
Allow fp16 : [0]
Require full delegation : [0]
Enable op profiling: [0]
Max profiling buffer entries: [1024]
CSV File to export profiling data to: []
Max number of delegated partitions : [0]
Use gpu : [0]
Allow lower precision in gpu : [1]
```

```

Use Hexagon : [0]
Hexagon lib path : [/data/local/tmp]
Hexagon Profiling : [0]
Use nnapi : [1]
nnapi accelerator name: [] (Available: vsi-npu,nnapi-reference)
Use xnnpack : [0]
Loaded model /data/local/tmp/mobilenet_v2_1.0_224_quant.tflite
INFO: Initialized TensorFlow Lite runtime.
INFO: Created TensorFlow Lite delegate for NNAPI.
Applied NNAPI delegate.
The input model file size (MB): 3.57776
Initialized session in 204.722 ms.
Running benchmark for at least 1 iterations and at least 0.5
seconds but terminate if exceeding 150 seconds.
count=1 curr=9329095
Running benchmark for at least 50 iterations and at least 1
seconds but terminate if exceeding 150 seconds.
count=126 first=6650 curr=8304 min=6558 max=17570 avg=7878.48
std=1078
Average inference timings in us: Warmup: 9.3291e+06, Init:
204722, Inference: 7878.48
Note: as the benchmark tool itself affects memory footprint,
the following is only APPROXIMATE to the actual memory
footprint of the model at runtime. Take the information at
your discretion.
Peak memory footprint (MB): init=4.58203 overall=5.01172

```

The benchmark application is also useful to check the optional segmentation of the models if accelerated on GPU/NPU hardware accelerator. For this purpose, the `---enable_op_profiling=true` option can be used.

```

adb shell /data/local/tmp/benchmark_model --graph=/data/local/
tmp/mobilenet_v2_1.0_224_quant.tflite --use_nnapi=true --
enable_op_profiling=true

```

In addition to output presented above, this detailed profiling info is available:

```

Profiling Info for Benchmark Initialization:
===== Run Order =====
[node type]      [start]  [first]  [avg ms]  [%]    [cdf%]  [mem KB]  [times called]
[Name]
ModifyGraphWithDelegate 0.000   194.276  194.276  62.600%  62.600%  2972.000  1
ModifyGraphWithDelegate/0
AllocateTensors      136.266  116.058  58.034   37.400%  100.000%  0.000    2
AllocateTensors/0
===== Top by Computation Time =====
[node type]      [start]  [first]  [avg ms]  [%]    [cdf%]  [mem KB]  [times called]
[Name]
ModifyGraphWithDelegate 0.000   194.276  194.276  62.600%  62.600%  2972.000  1
ModifyGraphWithDelegate/0
AllocateTensors      136.266  116.058  58.034   37.400%  100.000%  0.000    2
AllocateTensors/0
Number of nodes executed: 2
===== Summary by node type =====
[node type]      [count]  [avg ms]  [avg %]  [cdf %]  [mem KB]  [times called]
ModifyGraphWithDelegate 1        194.276  62.600%  62.600%  2972.000  1
AllocateTensors      1        116.068  37.400%  100.000%  0.000    2
Timings (microseconds): count=1 curr=310344
Memory (bytes): count=0
2 nodes observed
Operator-wise Profiling Info for Regular Benchmark Runs:
===== Run Order =====
[node type]      [start]  [first]  [avg ms]  [%]    [cdf%]  [mem KB]  [times called]
[Name]

```

```

TfLiteNnapiDelegate 0.000 6.694 8.080 100.000% 100.000% 0.000 1
[output]:65
===== Top by Computation Time =====
[node type] [start] [first] [avg ms] [%] [cdf%] [mem KB] [times called]
[Name]
TfLiteNnapiDelegate 0.000 6.694 8.080 100.000% 100.000% 0.000 1
[output]:65
Number of nodes executed: 1
===== Summary by node type =====
[Node type] [count] [avg ms] [avg %] [cdf %] [mem KB] [times called]
TfLiteNnapiDelegate 1 8.079 100.000% 100.000% 0.000 1
Timings (microseconds): count=120 first=6694 curr=8315 min=6496 max=17352 avg=8079.66 std=1026
Memory (bytes): count=0
1 nodes observed

```

Using this tool, we do benchmark tests on different hardware delegate of i.MX 8M Plus. The following table shows the results.

Table 1. Comparison of inference time between CPU and NPU on i.MX 8M Plus EVK

| Model Name | 4 X A53 | 1 X A53 | NPU |
|-----------------------------|------------|------------|------------|
| inception_v4_299_quant | 744.424 ms | 2507 ms | 36.163 ms |
| mobilenet_v1_0_25_224_quant | 6.73327 ms | 17.9476 ms | 2.42682 ms |
| mobilenet_v1_0_5_224_quant | 14.1138 ms | 45.0554 ms | 2.82396 ms |
| mobilenet_v1_0_75_224_quant | 25.3732 ms | 86.2732 ms | 3.31951 ms |
| mobilenet_v1_1_0_224_quant | 40.0481 ms | 138.407 ms | 3.99012 ms |
| mobilenet_v2_1_0_224_quant | 32.3174 ms | 104.026 ms | 4.53579 ms |

Note:

All models above were downloaded from: https://www.tensorflow.org/lite/guide/hosted_models#quantized_model.

2.3 VSI profiling on hardware accelerators

This section describes how to enable profiler on VSI NPU, and how to capture logs.

1. Stop the EVK board in U-Boot by pressing **Enter**.
2. Disable SELinux through the U-Boot command lines.

```

u-boot=> setenv append_bootargs
        androidboot.selinux=permissive
u-boot=> boot

```

3. To enable the OEM to unlock the Android device (EVK board), perform the following steps on both the Host and Target:
 - a. On the Target, from **Settings -> About Tablet**, click 10 times on **Build Number**. This enables **Developer options**.
 - b. In **Developer options**, select the **OEM Unlocking** checkbox to enable OEM unlocking.
 - c. On the Android terminal (UART terminal), execute the following command:

```
$ reboot bootloader
```


- d. On the Host, execute the following command:

```
$ sudo fastboot oem unlock
```

After a while, the system prompts that the OEM unlocks successfully. Then you can restart the board.

4. Set properties on the Android terminal. First, execute `adb root` to enter root mode. Then, on the Android terminal, execute the following commands:

```
setprop vendor.CNN_PERF 1
setprop vendor.NN_EXT_SHOW_PERF 1
setprop vendor.VIV_VX_DEBUG_LEVEL 1
setprop vendor.VIV_VX_PROFILE 1
setprop vendor.VSI_NN_LOG_LEVEL 5
```

5. On the Android terminal, find service `/vendor/bin/hw/android.neural.network***vsi-npu***`, and rename it to other name.
6. Use `ps -ef | grep vsi-npu` to find the current service and then terminate it.
7. Restart the service by executing `./<Name you used when renaming it>`, and then keep this terminal for VSI profiler use later. At this time, if you use another Android terminal to do the NPU benchmark test or other tasks, the previous terminal displays the detailed VSI profile.

2.4 Running image classification applications

This image classification is with a pre-trained model that can recognize 1000 different types of items from input frames on a mobile camera.

This application uses image classification to continuously classify whatever it sees from the device's back camera. Inference is performed using the TensorFlow Lite Java API. The demo application classifies frames in real time, displaying the top most probable classifications. It allows the user to choose between a floating point or quantized model, select the thread count, and decide whether to run on CPU, both GPU and NPU via NNAPI.

To build, install and run it, see https://github.com/tensorflow/examples/blob/master/lite/examples/image_classification/android/README.md.

In Android studio, find "Tools – SDK Manager". Find "Appearance & Behavior – System Settings – Android SDK". Choose the SDK Version corresponding to the system version, which is used on the board. Click "OK", and then SDK starts to be installed.

When the TFL Classify app is opened, choose "Quantized_MobileNet" from the drop-down menu for Model. In the drop-down menu for Device, choose "CPU" or "NNAPI" to use NPU accelerator as follows.

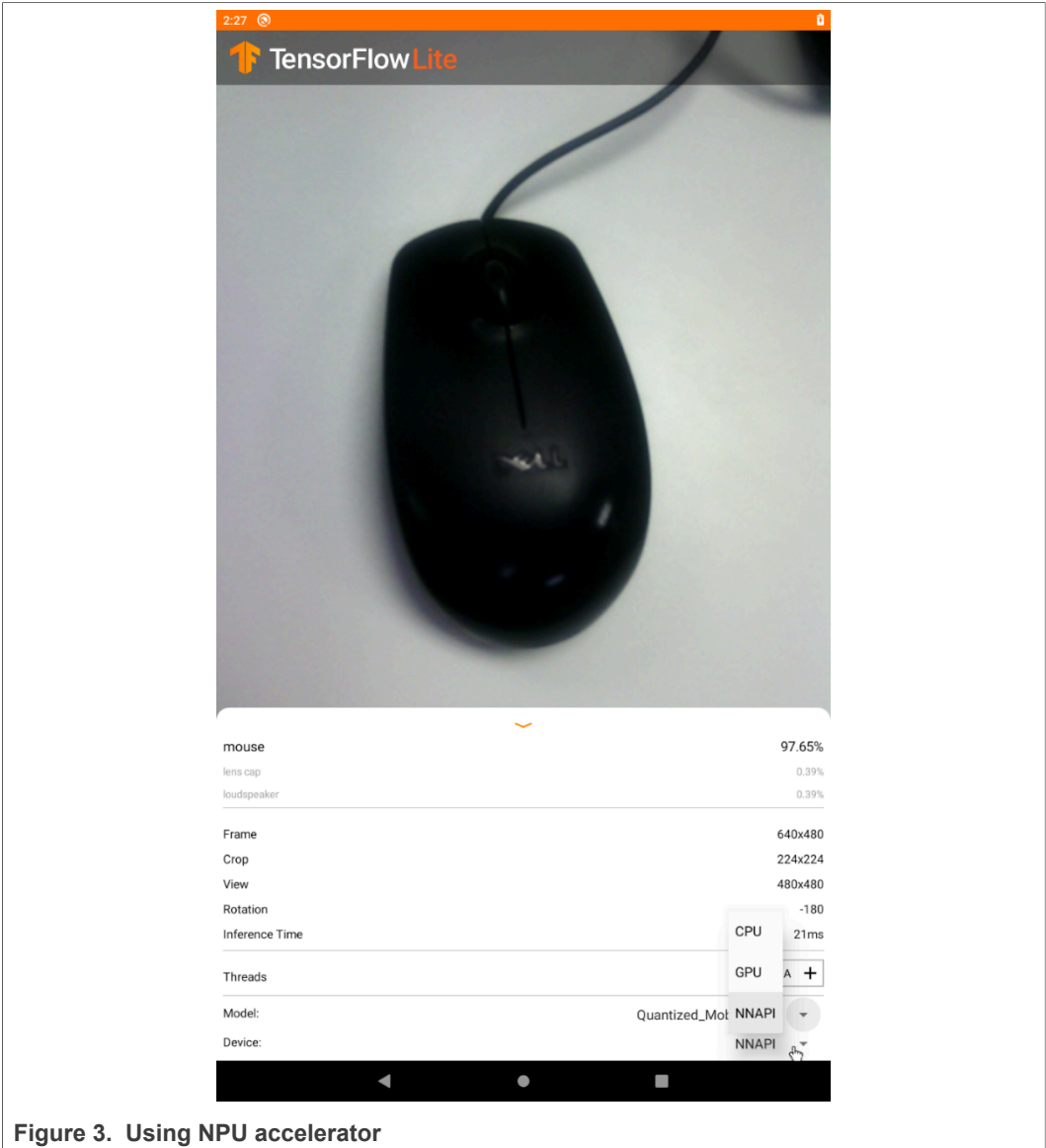


Figure 3. Using NPU accelerator

The following are two pictures using CPU or NNAPI as device. The inference time is different.

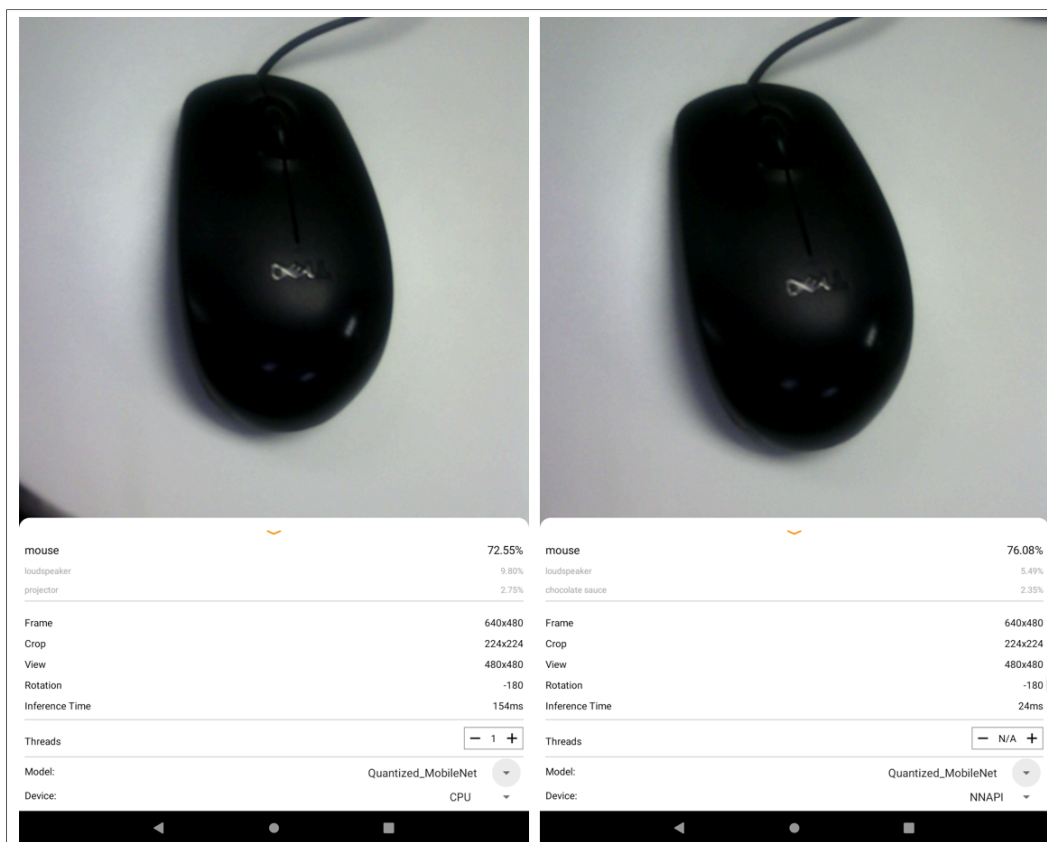


Figure 4. Using CPU or NNAPI as device

The output using logcat should be similar to:

```
1970-01-01 08:00:22.841 375-375/? I/ServiceManagement:
Registered android.hardware.neuralnetworks@1.2::IDevice/vsi-
npu (start delay of 1600ms)
.....
2020-06-16 22:01:24.986 2755-2789/
org.tensorflow.lite.examples.classification D/tensorflow:
ClassifierActivity: Closing classifier.
2020-06-16 22:01:24.990 2755-2789/
org.tensorflow.lite.examples.classification D/
tensorflow: ClassifierActivity: Creating classifier
(model=QUANTIZED_MOBILENET, device=NNAPI, numThreads=4)
2020-06-16 22:01:24.996 2755-2789/
org.tensorflow.lite.examples.classification I/tflite: Created
TensorFlow Lite delegate for NNAPI.
2020-06-16 22:01:24.998 2755-2789/
org.tensorflow.lite.examples.classification I/Manager:
DeviceManager::DeviceManager
2020-06-16 22:01:24.998 2755-2789/
org.tensorflow.lite.examples.classification I/Manager:
findAvailableDevices
2020-06-16 22:01:24.998 2755-2789/
org.tensorflow.lite.examples.classification I/Manager: Found
interface vsi-npu
```

3 Neural network API reference

The neural-network operations and corresponding supported API functions are listed in the following table.

Table 2. Neural-network operations and supported API functions

| Op Category/Name | OpenVX API 1.2 | Android NNAPI 1.2 | TensorFlow Lite 2.4.0 |
|-----------------------|--------------------------------|------------------------------|-----------------------|
| Activation | | | |
| elu | vx_kernel (ELU) | - | - |
| floor | vxTensorRounding Node | ANEURALNETWORKS_FLOOR | FLOOR |
| leaky_relu | vxLeakyReluLayer | - | - |
| prelu | vx_kernel (PRELU) | ANEURALNETWORKS_PRELU | PRELU |
| relu | vxActivationLayer | ANEURALNETWORKS_RELU | RELU |
| relu1 | vxActivationLayer | ANEURALNETWORKS_RELU_N1_TO_1 | RELU1 |
| relu6 | vxActivationLayer | ANEURALNETWORKS_RELU6 | RELU6 |
| relun | vxActivationLayer | - | - |
| swish | - | - | - |
| Hard_swish | - | ANEURALNETWORKS_HARD_SWISH | HARD_SWISH |
| rsqrt | vxActivationLayer | ANEURALNETWORKS_RSQRT | RSQRT |
| sigmoid | vxActivationLayer | ANEURALNETWORKS_LOGISTIC | LOGISTIC |
| softmax | vxSoftmaxLayer | ANEURALNETWORKS_SOFTMAX | SOFTMAX |
| softrelu | vxActivationLayer | - | - |
| sqr | vxActivationLayer | ANEURALNETWORKS_SQRT | SQRT |
| tanh | vxActivationLayer | ANEURALNETWORKS_TANH | TANH |
| bounded | - | - | - |
| linear | - | - | - |
| Dense Layers | | | |
| convolution_relu | vxConvolutionRelu Layer | - | - |
| convolution_relu_pool | vxConvolutionRelu PoolingLayer | - | - |
| fullyconnected_relu | vxFullyConnectedRelu Layer | - | - |

Table 2. Neural-network operations and supported API functions...continued

| Op Category/Name | OpenVX API 1.2 | Android NNAPI 1.2 | TensorFlow Lite 2.4.0 |
|---------------------|---------------------------|-------------------------------|-----------------------|
| Element Wise | | | |
| abs | vxLeakyReluLayer | - | ABS |
| add | vxTensorAddNode | ANEURALNETWORKS_ADD | ADD |
| add_n | vx_kernel (ADDN) | - | ADD_N |
| clip_by_value | vx_kernel (CLIP) | - | - |
| div | vxTensorDivideNode | ANEURALNETWORKS_DIV | DIV |
| equal | vx_kernel (EQUAL) | - | EQUAL |
| exp | vx_kernel (EXP) | - | EXP |
| log | vx_kernel (LOG) | - | - |
| floor_div | vx_kernel (FLOOR_DIV) | - | FLOOR_DIV |
| greater | vx_kernel (GREATER) | ANEURALNETWORKS_GREATER | GREATER |
| greater_equal | vx_kernel (GREATER_EQUAL) | ANEURALNETWORKS_GREATER_EQUAL | GREATER_EQUAL |
| less | vx_kernel (LESS) | ANEURALNETWORKS_LESS | LESS |
| less_equal | vx_kernel (LESS_EQUAL) | ANEURALNETWORKS_LESS_EQUAL | LESS_EQUAL |
| logical_and | vx_kernel (LOGICAL_AND) | ANEURALNETWORKS_LOGICAL_AND | LOGICAL_AND |
| logical_or | vx_kernel (LOGICAL_OR) | ANEURALNETWORKS_LOGICAL_OR | LOGICAL_OR |
| minimum | vx_kernel (MINIMUM) | ANEURALNETWORKS_MINIMUM | MINIMUM |
| maximum | vx_kernel (MAXIMUM) | ANEURALNETWORKS_MAXIMUM | MAXIMUM |
| mul | vxTensorMultiplyNode | ANEURALNETWORKS_MUL | MUL |
| negative | vx_kernel (NEG) | ANEURALNETWORKS_NEG | NEG |
| not_equal | vx_kernel (NOT_EQUAL) | ANEURALNETWORKS_NOT_EQUAL | NOT_EQUAL |
| pow | vx_kernel (POW) | ANEURALNETWORKS_POW | POW |
| real_div | vxTensorDivideNode | - | - |
| select | vx_kernel (SELECT) | ANEURALNETWORKS_SELECT | SELECT |
| square | vxActivationLayer | - | SQUARE |

Table 2. Neural-network operations and supported API functions...continued

| Op Category/Name | OpenVX API 1.2 | Android NNAPI 1.2 | TensorFlow Lite 2.4.0 |
|------------------------------|---------------------------|--|------------------------------|
| sub | vxTensorSubtractNode | ANEURALNETWORKS_SUB | SUB |
| where | vx_kernel (SELECT) | - | WHERE |
| Image Processing | | | |
| resize_bilinear | vxTensorScaleNode | ANEURALNETWORKS_RESIZE_BILINEAR | RESIZE_BILINEAR |
| resize_nearestneighbor | vxTensorScaleNode | ANEURALNETWORKS_RESIZE_NEAREST_NEIGHBOR | RESIZE_NEAREST_NEIGHBOR |
| yuv_rgb_scale | vxYUV2RGBScaleNode | - | - |
| Matrix Multiplication | | | |
| fullyconnected | vxFullyConnectedLayer | ANEURALNETWORKS_FULLY_CONNECTED | FULLY_CONNECTED |
| matrix_mul | vx_kernel (MATRIXMUL) | - | - |
| Normalization | | | |
| batch_normalize | vxBatchNormalizationLayer | - | - |
| instance_normalize | vx_kernel (INSTANCE_NORM) | - | - |
| l2_normalize | vxL2NormalizeLayer | ANEURALNETWORKS_L2_NORMALIZATION | L2_NORMALIZATION |
| layer_normalize | vx_kernel (LAYER_NORM) | - | - |
| local_response_normalize | vxNormalizationLayer | ANEURALNETWORKS_LOCAL_RESPONSE_NORMALIZATION | LOCAL_RESPONSE_NORMALIZATION |
| Reshape | | | |
| batch_to_space | vxReorgLayer2 | ANEURALNETWORKS_BATCH_TO_SPACE_ND | BATCH_TO_SPACE_ND |
| concat | vxCreateTensorView | ANEURALNETWORKS_CONCATENATION | CONCATENATION |
| crop | vx_kernel (CROP) | - | - |
| depth_to_space | vxReorgLayer2 | ANEURALNETWORKS_DEPTH_TO_SPACE | DEPTH_TO_SPACE |
| expand_dims | vxReshapeTensor | - | EXPAND_DIMS |
| flatten | vxReshapeTensor | ANEURALNETWORKS_RESHAPE | RESHAPE |
| gather | vx_kernel (GATHER) | - | GATHER |
| pad | vxTensorPadNode | ANEURALNETWORKS_PAD | PAD |

Table 2. Neural-network operations and supported API functions...continued

| Op Category/Name | OpenVX API 1.2 | Android NNAPI 1.2 | TensorFlow Lite 2.4.0 |
|-----------------------|-------------------------------|-----------------------------------|-----------------------|
| permute | vxTensorPermuteNode | ANEURALNETWORKS_TRANSPOSE | TRANSPOSE |
| reduce_mean | vxTensorMeanNode | ANEURALNETWORKS_MEAN | MEAN |
| reduce_sum | vxTensorReduceSumNode | - | - |
| reorg | vxReorgLayer | - | - |
| reshape | vxReshapeTensor | ANEURALNETWORKS_RESHAPE | RESHAPE |
| reverse | vxTensorReverse | - | - |
| reverse_squeeze | vxTensorReverse | - | - |
| slice | vxCreateTensorView | - | SLICE |
| space_to_batch | vxReorgLayer2 | ANEURALNETWORKS_SPACE_TO_BATCH_ND | SPACE_TO_BATCH_ND |
| space_to_depth | vxReorgLayer2 | ANEURALNETWORKS_SPACE_TO_DEPTH | SPACE_TO_DEPTH |
| split | vxCreateTensorView | ANEURALNETWORKS_SPLIT | SPLIT |
| squeeze | vxReshapeTensor | ANEURALNETWORKS_SQUEEZE | SQUEEZE |
| stack | vx_kernel (STACK) | - | - |
| strided_slice | vxTensorStrideSliceNode | ANEURALNETWORKS_STRIDED_SLICE | STRIDED_SLICE |
| tensor_stack_concat | vx_kernel (TENSORSTACKCONCAT) | - | - |
| unstack | vx_kernel (UNSTACK) | - | - |
| RNN | | | |
| gru | vx_kernel (GRU_OVXLIB) | - | - |
| gru_cell | vx_kernel (GRUCELL_OVXLIB) | - | - |
| lstm_layer | vxLSTMLayer | - | - |
| lstm_unit | vxLSTMUnitLayer | ANEURALNETWORKS_LSTM | LSTM |
| rnn | vxRNNLayr | ANEURALNETWORKS_RNN | RNN |
| Sliding Window | | | |
| avg_pool | vxPoolingLayer | ANEURALNETWORKS_AVERAGE_POOL | AVERAGE_POOL_2D |
| convolution | vxConvolutionLayer | ANEURALNETWORKS_CONV_2D | CONV_2D |

Table 2. Neural-network operations and supported API functions...continued

| Op Category/Name | OpenVX API 1.2 | Android NNAPI 1.2 | TensorFlow Lite 2.4.0 |
|-----------------------|------------------------------|-----------------------------------|-----------------------|
| deconvolution | vxDeconvolutionLayer | ANEURALNETWORKS_TRANSPOSE_CONV_2D | TRANSPOSE_CONV |
| depthwise_convolution | vxConvolutionLayer | ANEURALNETWORKS_DEPTHWISE_CONV_2D | DEPTHWISE_CONV_2D |
| depthwise_conv1d | vx_kernel (DEPTHWISE_CONV1D) | - | - |
| group_conv1d | vx_kernel (CONV1D) | - | - |
| Log_softmax | vx_kernel (LOG_SOFTMAX) | ANEURALNETWORKS_LOG_SOFTMAX | LOG_SOFTMAX |
| dilated_convolution | vxConvolutionLayer | - | - |
| l2_pool | vxPoolingLayer | ANEURALNETWORKS_L2_POOL | L2_POOL_2D |
| max_pool | vxPoolingLayer | ANEURALNETWORKS_MAX_POOL | MAX_POOL_2D |
| max_pool_with_argmax | vx_kernel (POOLWITHARGMAX) | - | - |
| max_unpool | vx_kernel (UPSAMPLE) | - | - |
| Others | | | |
| argmax | vx_kernel (ARGMAX) | ANEURALNETWORKS_ARGMAX | ARGMAX |
| argmin | vx_kernel (ARGMIN) | ANEURALNETWORKS_ARGMIN | ARGMIN |
| dequantize | vxTensorCopyNode | ANEURALNETWORKS_DEQUANTIZE | DEQUANTIZE |
| quantize | - | ANEURALNETWORKS_QUANTIZE | QUANTIZE |
| image_process | vx_kernel (IMAGE_PROCESS) | - | - |
| region_proposal | vxRPNLayer | - | - |
| roi_pool | vxROIPoolingLayer | - | - |
| shuffle_channel | vx_kernel (SHUFFLE_CHANNEL) | - | - |

4 OVXLIB Operation Support with GPU

This section provides a summary of the neural network OVXLIB operations supported by the NXP Graphics Processing Unit (GPU) IP with hardware support for OpenVX and OpenCL and a compatible Software stacks. OVXLIB operations are listed in the following table.

The following abbreviations are used for format types:

- asym-u8: asymmetric_affine-uint8
- asym-i8: asymmetric_affine-int8
- fp32: float32
- pc-sym-i8: perchannel_symmetric_int8
- h: half
- bool8: bool8
- int16: int16
- int32: int32

Table 3. OVXLIB operation support with GPU

| OVXLIB Operations | Tensors | | | Execution Engine | |
|----------------------------|---------|---------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| Basic Operations | | | | | |
| VSI_NN_OP_CONV2D | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| VSI_NN_OP_CONV1D | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| VSI_NN_OP_DEPTHWISE_CONV1D | asym-u8 | asym-u8 | asym-u8 | ✓ | |
| | asym-i8 | asym-i8 | asym-i8 | ✓ | |
| VSI_NN_OP_DECONVOLUTION | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| VSI_NN_OP_FCL | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| Activation Operations | | | | | |
| VSI_NN_OP_ELU | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_HARD_SIGMOID | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|----------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SWISH | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_LEAKY_RELU | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_PRELU | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RELU | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RELUN | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RSQRT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SIGMOID | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SOFTRELU | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SQRT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|-------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_TANH | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_ABS | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_CLIP | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_EXP | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_LOG | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_NEG | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_MISH | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SOFTMAX | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|------------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| VSI_NN_OP_LOG_SOFTMAX | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SQUARE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SIN | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| Elementwise Operations | | | | | |
| VSI_NN_OP_ADD | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SUBTRACT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_MULTIPLY | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_DIVIDE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_MAXIMUN | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_MINIMUM | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|--------------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_POW | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_FLOORDIV | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_MATRIXMUL | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RELATIONAL_OPS | asym-u8 | | bool8 | ✓ | ✓ |
| | asym-i8 | | bool8 | ✓ | ✓ |
| | fp32 | | bool8 | ✓ | ✓ |
| | h | | bool8 | ✓ | ✓ |
| | bool8 | | bool8 | ✓ | ✓ |
| VSI_NN_OP_LOGICAL_OPS | bool8 | | bool8 | ✓ | ✓ |
| VSI_NN_OP_SELECT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| | bool8 | | bool8 | ✓ | ✓ |
| VSI_NN_OP_ADDN | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| Normalization Operations | | | | | |
| VSI_NN_OP_BATCH_NORM | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|-----------------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_LRN | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_LRN2 | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_L2_NORMALIZE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_L2NORMALIZE_SCALE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_LAYER_NORM | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_INSTANCE_NORM | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_BATCHNORM_SINGLE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_MOMENTS | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| Reshape Operations | | | | | |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|-------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| VSI_NN_OP_SLICE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SPLIT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_CONCAT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_STACK | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_UNSTACK | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RESHAPE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SQUEEZE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_PERMUTE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_REORG | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|-------------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SPACE2DEPTH | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_DEPTH2SPACE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_BATCH2SPACE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SPACE2BATCH | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_PAD | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_REVERSE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_STRIDED_SLICE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_CROP | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_REDUCE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|---------------------------|---------|-----------|---------------------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_ARGMX | asym-u8 | | asym-u8/int16/int32 | ✓ | ✓ |
| | asym-i8 | | asym-u8/int16/int32 | ✓ | ✓ |
| | fp32 | | int32 | ✓ | ✓ |
| | h | | asym-u8/int16/int32 | ✓ | ✓ |
| VSI_NN_OP_ARGMIN | asym-u8 | | asym-u8/int16/int32 | ✓ | ✓ |
| | asym-i8 | | asym-u8/int16/int32 | ✓ | ✓ |
| | fp32 | | int32 | ✓ | ✓ |
| | h | | asym-u8/int16/int32 | ✓ | ✓ |
| VSI_NN_OP_SHUFFLECHANNEL | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| RNN Operations | | | | | |
| VSI_NN_OP_LSTMUNIT_OVXLIB | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| VSI_NN_OP_LSTM | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | pc-sym-i8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| VSI_NN_OP_GRUCELL_OVXLIB | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| VSI_NN_OP_GRU_OVXLIB | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|--------------------------|---------|---------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| VSI_NN_OP_SVDF | asym-u8 | asym-u8 | asym-u8 | ✓ | ✓ |
| | asym-i8 | p8 | asym-i8 | ✓ | ✓ |
| | fp32 | fp32 | fp32 | ✓ | ✓ |
| | h | h | h | ✓ | ✓ |
| Pooling Operations | | | | | |
| VSI_NN_OP_ROI_POOL | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_POOLWITHARGMAX | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_UPSAMPLE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| Miscellaneous Operations | | | | | |
| VSI_NN_OP_PROPOSAL | asym-u8 | | asym-u8 | ✓ | |
| | asym-i8 | | asym-i8 | ✓ | |
| | fp32 | | fp32 | ✓ | |
| | h | | h | ✓ | |
| VSI_NN_OP_VARIABLE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_DROPOUT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RESIZE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|----------------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| VSI_NN_OP_DATACONVERT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_A_TIMES_B_PLUS_C | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_FLOOR | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_EMBEDDING_LOOKUP | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_GATHER | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_GATHER_ND | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_TILE | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_RELU_KERAS | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_ELTSWISEMAX | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |

Table 3. OVXLIB operation support with GPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine | |
|-------------------------|---------|--------|---------|------------------|--------|
| | Input | Kernel | Output | OpenVX | OpenCL |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_INSTANCE_NORM | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_FCL2 | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_POOL | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |
| VSI_NN_OP_SIGNAL_FRAME | asym-u8 | | asym-u8 | ✓ | |
| | asym-i8 | | asym-i8 | ✓ | |
| | fp32 | | fp32 | ✓ | |
| | h | | h | ✓ | |
| VSI_NN_OP_CONCATSHIFT | asym-u8 | | asym-u8 | ✓ | ✓ |
| | asym-i8 | | asym-i8 | ✓ | ✓ |
| | fp32 | | fp32 | ✓ | ✓ |
| | h | | h | ✓ | ✓ |

5 OVXLIB Operation Support with NPU

This section provides a summary of the neural network OVXLIB operations supported by the NXP Neural Processor Unit (NPU) IP and a compatible Software stacks. OVXLIB operations are listed in the following table.

The following abbreviations are used for format types:

- `asym-u8`: `asymmetric_affine-uint8`
- `asym-i8`: `asymmetric_affine-int8`
- `fp32`: `float32`
- `pc-sym-i8`: `perchannel_symmetric-int8`
- `h`: `half`
- `bool8`: `bool8`
- `int16`: `int16`
- `int32`: `int32`

The following abbreviations are used to reference key Execution Engines (NPU) in the hardware:

- NN: Neural-Network Engine
- PPU: Parallel Processing Unit
- TP: Tensor Processor

Table 4. OVXLIB operation support with NPU

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|----------------------------|---------|-----------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| Basic Operations | | | | | | |
| VSI_NN_OP_CONV2D | asym-u8 | asym-u8 | asym-u8 | ✓ | | |
| | asym-i8 | pc-sym-i8 | asym-i8 | ✓ | | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | | ✓ |
| VSI_NN_OP_CONV1D | asym-u8 | asym-u8 | asym-u8 | ✓ | | |
| | asym-i8 | pc-sym-i8 | asym-i8 | ✓ | | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | | ✓ |
| VSI_NN_OP_DEPTHWISE_CONV1D | asym-u8 | asym-u8 | asym-u8 | | | ✓ |
| | asym-i8 | asym-i8 | asym-i8 | | | ✓ |
| VSI_NN_OP_DECONVOLUTION | asym-u8 | asym-u8 | asym-u8 | ✓ | | |
| | asym-i8 | pc-sym-i8 | asym-i8 | ✓ | | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | | ✓ |
| VSI_NN_OP_FCL | asym-u8 | asym-u8 | asym-u8 | | ✓ | |
| | asym-i8 | pc-sym-i8 | asym-i8 | | ✓ | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | ✓ | |
| Activation Operations | | | | | | |
| VSI_NN_OP_ELU | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_HARD_SIGMOID | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_SWISH | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|----------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_LEAKY_RELU | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_PRELU | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_RELU | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_RELUN | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_RSQRT | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_SIGMOID | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_SOFTRELU | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_SQRT | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|-----------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_TANH | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_ABS | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_CLIP | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_EXP | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_LOG | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_NEG | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_MISH | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_SOFTMAX | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_LOG_SOFTMAX | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|------------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| | h | | h | | | ✓ |
| VSI_NN_OP_SQUARE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_SIN | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| Elementwise Operations | | | | | | |
| VSI_NN_OP_ADD | asym-u8 | | asym-u8 | ✓ | | |
| | asym-i8 | | asym-i8 | ✓ | | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_SUBTRACT | asym-u8 | | asym-u8 | ✓ | | |
| | asym-i8 | | asym-i8 | ✓ | | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_MULTIPLY | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_DIVIDE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_MAXIMUN | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_MINIMUM | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|--------------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_POW | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_FLOORDIV | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_MATRIXMUL | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_RELATIONAL OPS | asym-u8 | | bool8 | | | ✓ |
| | asym-i8 | | bool8 | | | ✓ |
| | fp32 | | bool8 | | | ✓ |
| | h | | bool8 | | | ✓ |
| | bool8 | | bool8 | | | ✓ |
| VSI_NN_OP_LOGICAL OPS | bool8 | | bool8 | | | ✓ |
| VSI_NN_OP_SELECT | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| | bool8 | | bool8 | | | ✓ |
| VSI_NN_OP_ADDN | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| Normalization Operations | | | | | | |
| VSI_NN_OP_BATCH_NORM | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|------------------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_LRN | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_LRN2 | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_L2_NORMALIZE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_L2_NORMALIZE_SCALE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_LAYER_NORM | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_INSTANCE_NORM | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_BATCHNORM_SINGLE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_MOMENTS | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| Reshape Operations | | | | | | |
| VSI_NN_OP_SLICE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|-------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_SPLIT | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_CONCAT | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_STACK | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_UNSTACK | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_RESHAPE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_SQUEEZE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_PERMUTE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_REORG | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|-------------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_SPACE2DEPTH | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_DEPTH2SPACE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| | bool8 | | bool8 | | | |
| VSI_NN_OP_BATCH2SPACE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_SPACE2BATCH | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_PAD | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_REVERSE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_STRIDED_SLICE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_CROP | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|---------------------------|---------|-----------|---------------------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_REDUCE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_ARGMAX | asym-u8 | | asym-u8/int16/int32 | | | ✓ |
| | asym-i8 | | asym-u8/int16/int32 | | | ✓ |
| | fp32 | | int32 | | | ✓ |
| | h | | asym-u8/int16/int32 | | | ✓ |
| VSI_NN_OP_ARGMIN | asym-u8 | | asym-u8/int16/int32 | | | ✓ |
| | asym-i8 | | asym-u8/int16/int32 | | | ✓ |
| | fp32 | | int32 | | | ✓ |
| | h | | asym-u8/int16/int32 | | | ✓ |
| VSI_NN_OP_SHUFFLECHANNEL | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| RNN Operations | | | | | | |
| VSI_NN_OP_LSTMUNIT_OVXLIB | asym-u8 | asym-u8 | asym-u8 | | ✓ | ✓ |
| | asym-i8 | pc-sym-i8 | asym-i8 | | ✓ | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | ✓ | ✓ |
| VSI_NN_OP_LSTM | asym-u8 | asym-u8 | asym-u8 | | ✓ | ✓ |
| | asym-i8 | pc-sym-i8 | asym-i8 | | ✓ | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | ✓ | ✓ |
| VSI_NN_OP_GRUCELL_OVXLIB | asym-u8 | asym-u8 | asym-u8 | | ✓ | ✓ |
| | asym-i8 | pc-sym-i8 | asym-i8 | | ✓ | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | ✓ | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|--------------------------|---------|-----------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_GRU_OVXLIB | asym-u8 | asym-u8 | asym-u8 | | ✓ | ✓ |
| | asym-i8 | pc-sym-i8 | asym-i8 | | ✓ | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | ✓ | ✓ |
| VSI_NN_OP_SVDF | asym-u8 | asym-u8 | asym-u8 | | ✓ | ✓ |
| | asym-i8 | pc-sym-i8 | asym-i8 | | ✓ | ✓ |
| | fp32 | fp32 | fp32 | | | ✓ |
| | h | h | h | | ✓ | ✓ |
| Pooling Operations | | | | | | |
| VSI_NN_OP_ROI_POOL | asym-u8 | | asym-u8 | | ✓ | ✓ |
| | asym-i8 | | asym-i8 | | ✓ | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | ✓ |
| VSI_NN_OP_POOLWITHARGMAX | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_UPSAMPLE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| Miscellaneous Operations | | | | | | |
| VSI_NN_OP_PROPOSAL | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_VARIABLE | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_DROPOUT | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|----------------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| VSI_NN_OP_RESIZE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_DATACONVERT | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_A_TIMES_B_PLUS_C | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_FLOOR | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_EMBEDDING_LOOKUP | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_GATHER | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_GATHER_ND | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_TILE | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_RELU_KERAS | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |

Table 4. OVXLIB operation support with NPU...continued

| OVXLIB Operations | Tensors | | | Execution Engine (NPU) | | |
|-------------------------|---------|--------|---------|------------------------|----|-----|
| | Input | Kernel | Output | NN | TP | PPU |
| | h | | h | | ✓ | |
| VSI_NN_OP_ELWISEMAX | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_INSTANCE_NORM | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_FCL2 | asym-u8 | | asym-u8 | | ✓ | |
| | asym-i8 | | asym-i8 | | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_POOL | asym-u8 | | asym-u8 | ✓ | ✓ | |
| | asym-i8 | | asym-i8 | ✓ | ✓ | |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | ✓ | |
| VSI_NN_OP_SIGNAL_FRAME | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |
| VSI_NN_OP_CONCATSHIFT | asym-u8 | | asym-u8 | | | ✓ |
| | asym-i8 | | asym-i8 | | | ✓ |
| | fp32 | | fp32 | | | ✓ |
| | h | | h | | | ✓ |

6 Revision History

This table provides the revision history.

Revision history

| Revision number | Date | Substantive changes |
|---------------------------|---------|---|
| android-10.0.0_2.5.0 | 10/2020 | Initial release |
| android-11.0.0_1.0.0 | 12/2020 | i.MX 8M Plus EVK Beta release, and all the other i.MX 8 GA release. |
| android-11.0.0_1.1.0-AUTO | 01/2021 | i.MX 8QuadXPlus/8QuadMax MEK GA release |

Revision history...continued

| Revision number | Date | Substantive changes |
|----------------------|---------|---|
| android-11.0.0_1.2.0 | 03/2021 | i.MX 8M Plus EVK GA release. |
| android-11.0.0_1.2.1 | 06/2021 | i.MX 8M Plus EVK GA release. |
| android-11.0.0_2.2.0 | 07/2021 | i.MX 8M Mini, i.MX 8M Nano, i.MX 8M Plus, and i.MX 8M Quad GA release. |
| android-11.0.0_2.4.0 | 10/2021 | i.MX 8ULP EVK Alpha release, i.MX 8M Mini, i.MX 8M Nano, i.MX 8M Plus, and i.MX 8M Quad GA release. |
| android-11.0.0_2.6.0 | 01/2022 | i.MX 8ULP EVK Beta release, i.MX 8M Mini, i.MX 8M Nano, i.MX 8M Plus, and i.MX 8M Quad GA release. |
| android-12.0.0_1.0.0 | 03/2022 | i.MX 8ULP EVK Beta release, i.MX 8M Mini, i.MX 8M Nano, i.MX 8M Plus, and i.MX 8M Quad GA release. |
| android-12.0.0_2.0.0 | 07/2022 | i.MX 8ULP EVK Beta release, i.MX 8M Mini, i.MX 8M Nano, i.MX 8M Plus, and i.MX 8M Quad GA release. |

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