



How to develop edge AI camera applications simpler, faster, and more affordably

Shyam Jagannathan, TI

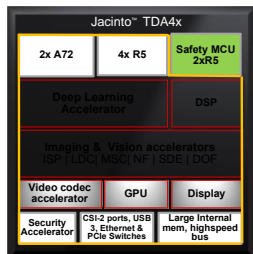
Manisha Agrawal, TI

Agenda

- Recap
- Edge AI SDK
 - Architecture overview
 - Example camera inferencing application dataflow
 - GStreamer plugin designs
 - SDK roadmap and performance
- Demonstration
- Call to action

TI edge AI | revolutionizing applications from factory to home

Processor for practical edge AI



- High-speed image acquisition
- Low-latency, low-power vision and AI processing

ti.com/edgeai

Learn with Free Cloud Tool



ti.com/edgeaicloud

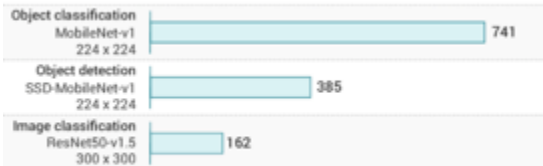
Build with 8 TOPS starter kit



P/N: SK-TDA4VM: <\$250

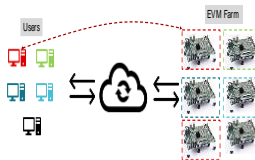
Energy efficient AI architecture

MLPerf inference benchmarks



Get started for free

- Example scripts
- TI Model Zoo
- Training videos



Fast Development Cycle

Industry standard APIs

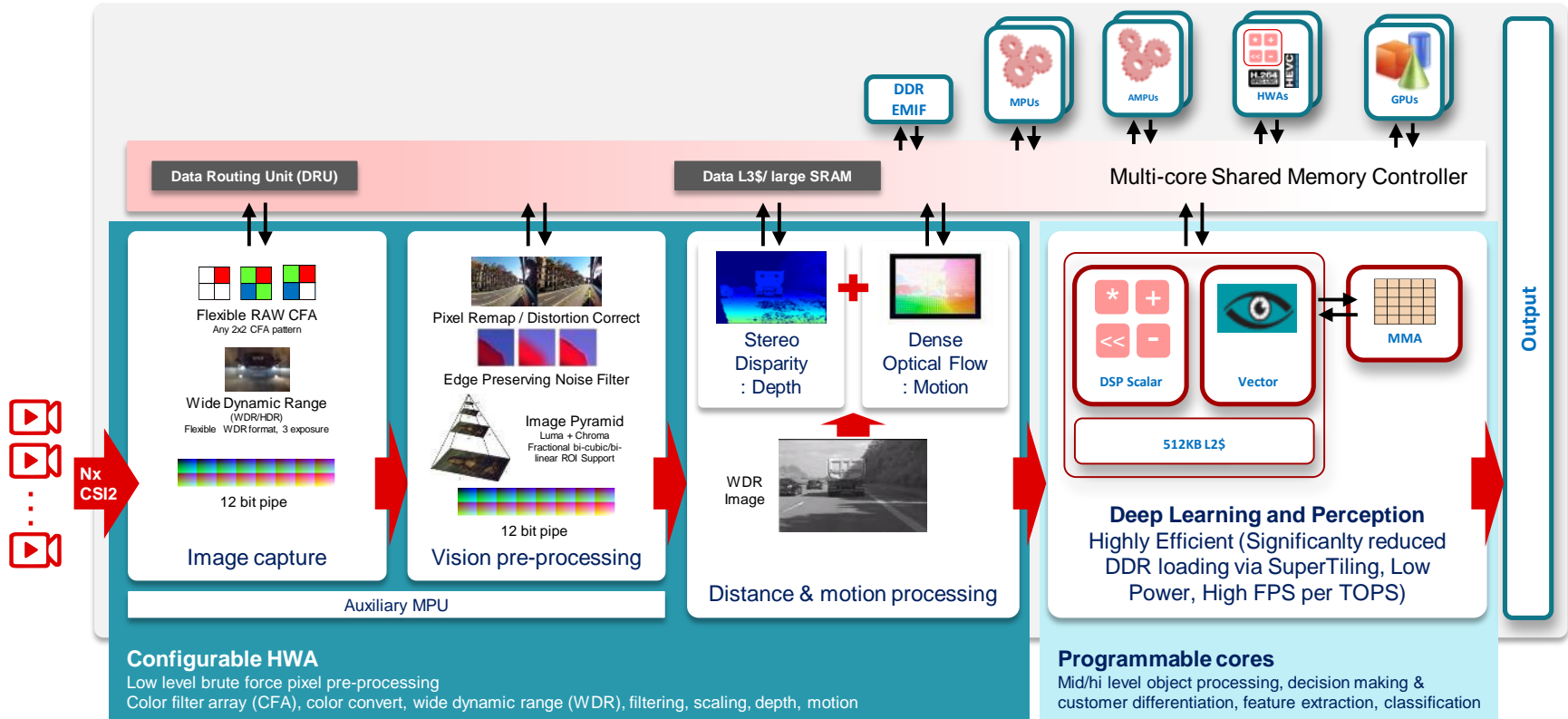


3P Eco-system

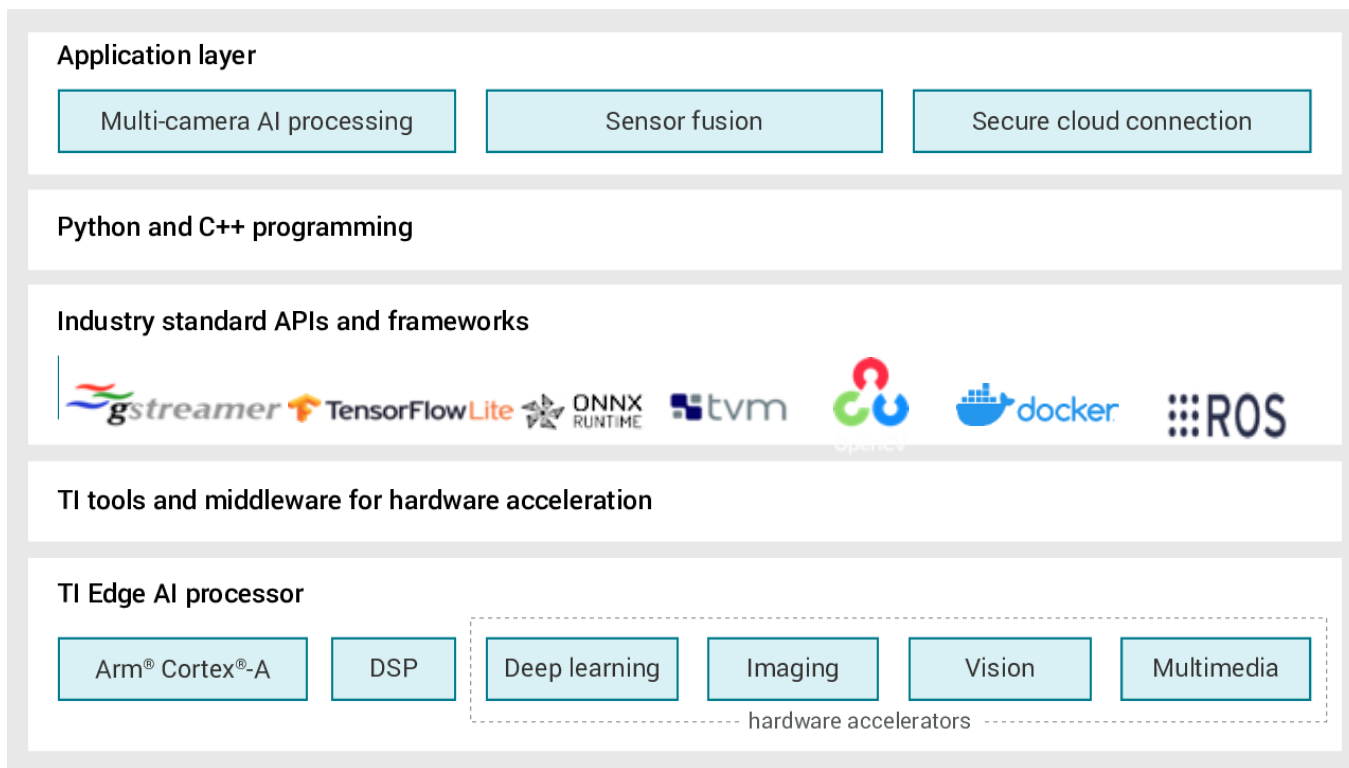


ti.com/edgeai for all the resources you have to get started!

Efficient data movement | more system level performance

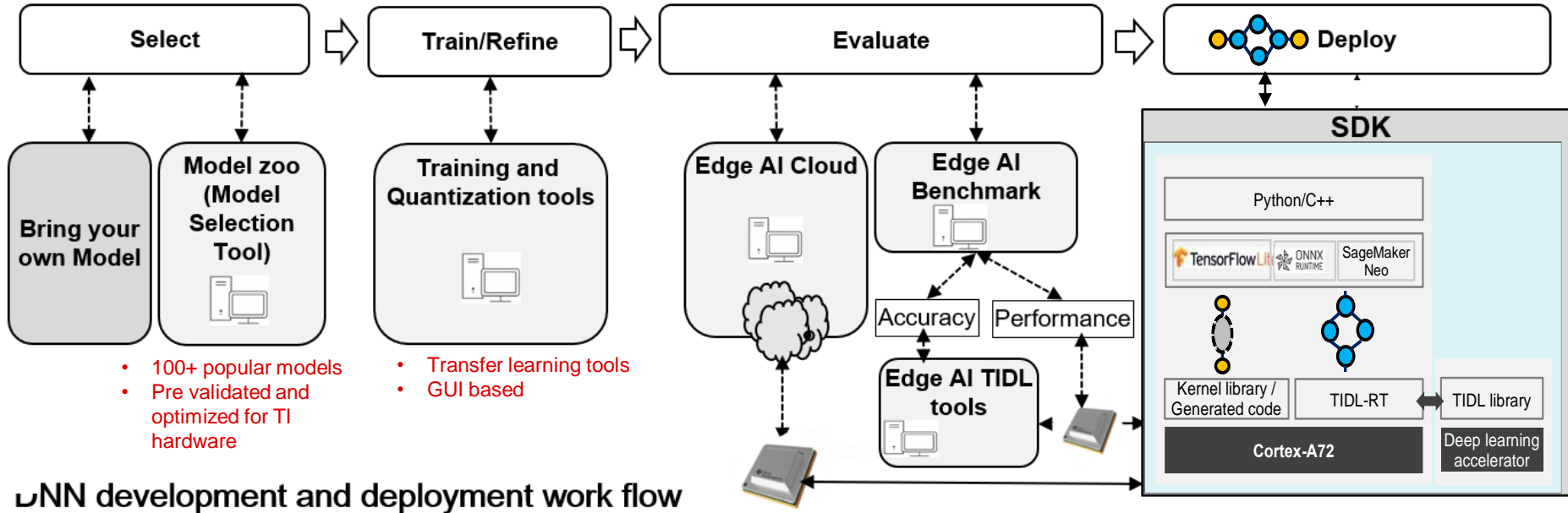


It is easy to develop | With industry standard APIs



Full software from TI makes applications and demo development much easier!

Extensive tools | Faster DL model development & deployment



Edge AI Starter Kit | What you can build

Make factories, cities and home - smart and safe

Learn through Academy

www.ti.com/edgeaiacademy

Fundamentals

Learning

Part 1: Introduction to AI

Learn about AI applications, AI functions

[Get started >](#)

Learning

Part 2: Understanding an AI System

Learn about Deep learning system architecture

[Get started >](#)

Learning

Part 3: SW Architecture

Learn the details of SW programming environment

[Get started >](#)

Step-by-step code development

Hands-on-coding

Part 4: Building "Hello-World" AI application

Build your first AI app on a PC and port it to TDA4VM

[Get started >](#)

Hands-on-coding

Part 5: Deep Learning Deployment Demystified

Model compilation without

[Get started >](#)

Hands-on-coding

Part 6: Putting it all together: end-to-end AI application development

Video in, Analytics, Video Out

[Get started >](#)

Explore, build and contribute to projects

www.ti.com/edgeaiprojects

Smart cameras and AI Boxes



Hello AI: Classification



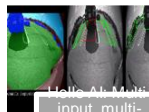
Hello AI: Object detection



Hello AI: Semantic segmentation



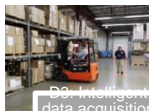
Hello AI: Single input, multi-



Hello AI: Multi input, multi-



AWS: People counter IoT



D3: Intelligent data acquisition

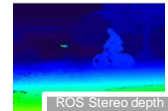


Ignitarium: People protection



Intelligent multi-channel AI server

Robotics



ROS: Stereo depth estimation



ROS: Semantic segmentation



ROS: 3D obstacle detection



ROS: Visual localization



Autonomous navigation



Kudan SLAM

Customers, Third-party, Community & Hobbyist

Edge AI SDK | Overview

EdgeAI applications

- Deep learning Python/C++ demo applications on Yocto/Docker
- TFLite runtime, ONNX runtime, Neo-AI-DLR
 - edgeai-tidl-tools – Standalone examples, Jupyter notebooks
 - edge_ai_apps – GStreamer based Deep Learning demos
 - edgeai-gst-plugins – GStreamer custom TI plugins
 - Gstreamer
 - OpenCV

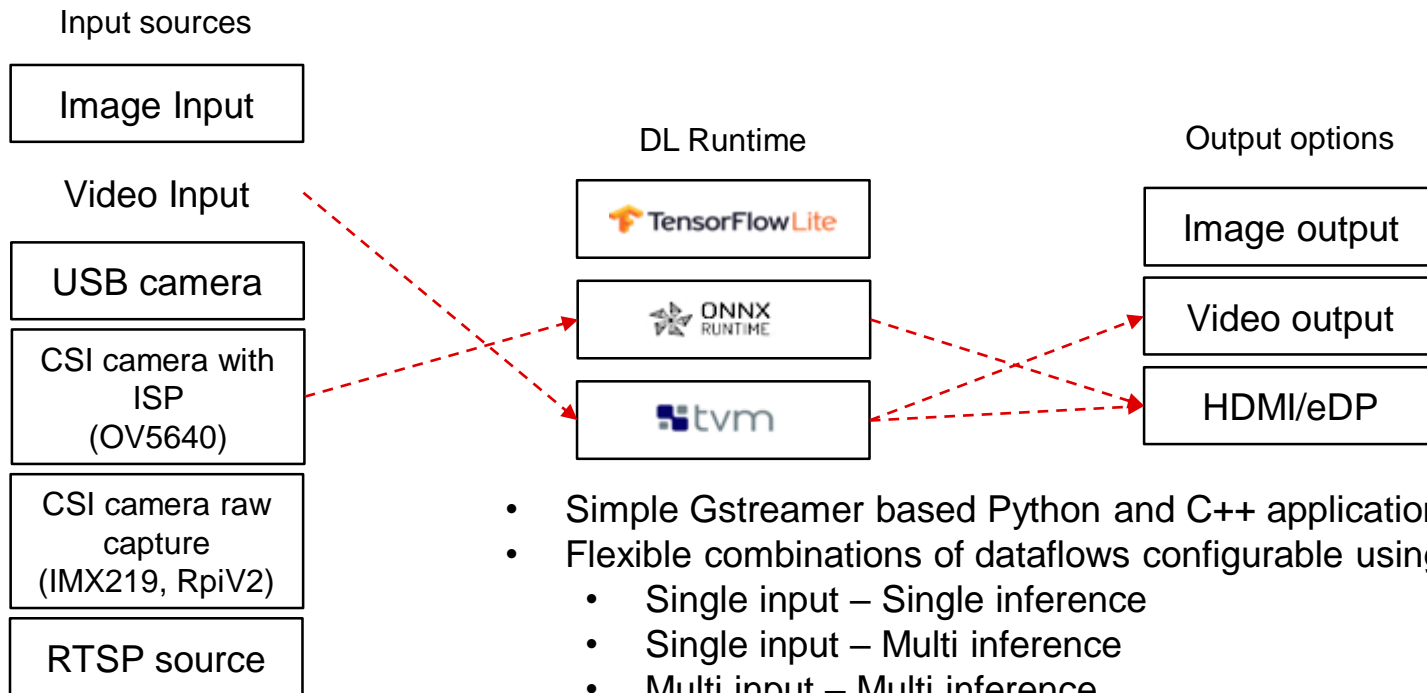
Features supported on LINUX

- Aarch64 Linux OS
- Bootloader, Linux kernel, Filesystem
 - Secure boot, ARM Trusted Firmware
 - Foundational tools and drivers
 - V4L2 Capture driver (CSI, USB)
 - Display driver (DSS)
 - HWA Codecs driver (Decoder, Encoder)
 - Image sensor tuning tool

Features supported on HWA and RTOS

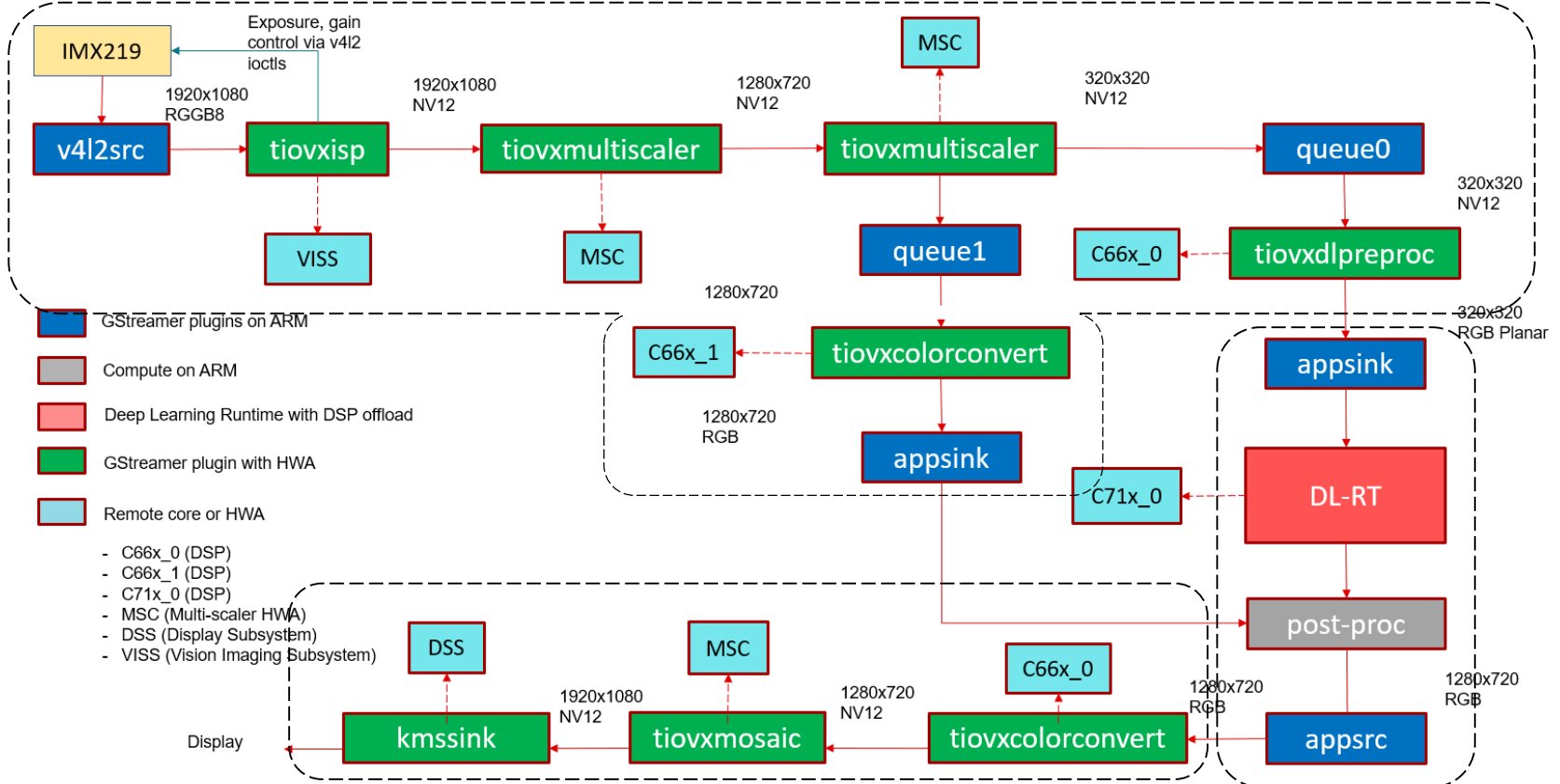
- Remote core software running RTOS
- TI OpenVx framework and libraries
 - Vision Hardware accelerator drivers (VPAC/DMPAC)
 - TI Deep Learning Runtime libraries
 - Optimized DSP libraries (MMALIB, TIADALG, VXLIB)
 - AUTOSAR MCAL and tools for MCU SW
 - Safety Software Diagnostic Libraries (SDL)
 - Baremetal and RTOS low-level drivers (PDK)

Edge AI SDK | Flexible use cases

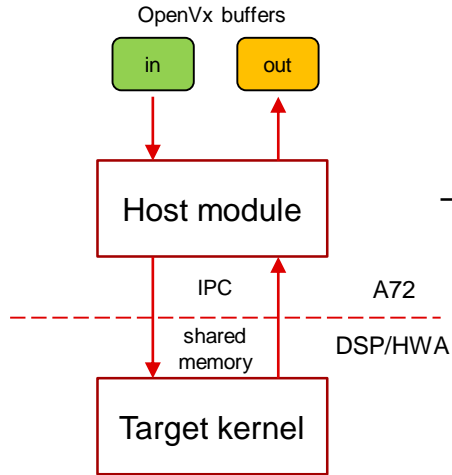


- Simple Gstreamer based Python and C++ application
- Flexible combinations of dataflows configurable using YAML
 - Single input – Single inference
 - Single input – Multi inference
 - Multi input – Multi inference
- Pre-validated with over 100+ models from edgeai-modelzoo
- End-to-End Zero data copy pipelines

Edge AI SDK | Camera application end-to-end acceleration dataflow

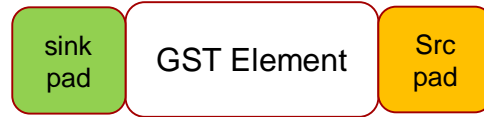


Edge AI SDK | Custom GStreamer elements using OpenVx



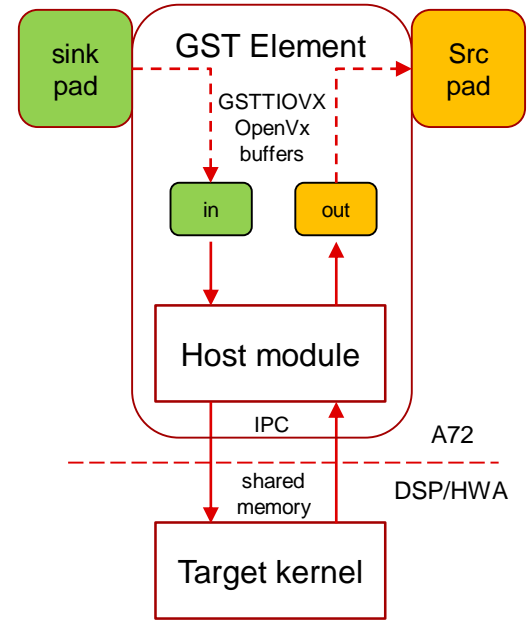
Typical OpenVx Node

+



Typical GStreamer Element

=



GStreamer element using OpenVx to access DSP/HWA

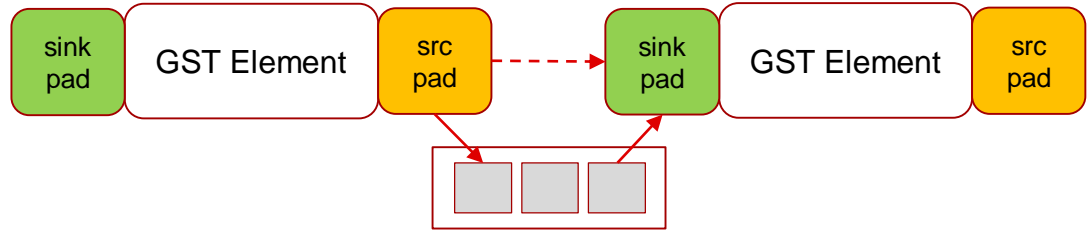
Edge AI SDK | Custom GStreamer foundational elements

Custom GStreamer Buffer Pool

GstBufferPool

- GstTIOVXBufferPool
 - GstImageBufferPool
 - GstTensorBufferPool
 - GstRawImageBufferPool

Enables zero buffer copy dataflows



Negotiated Buffer Pool
Created using TIOVX allocator

Custom GStreamer elements

- GstElement
 - GstBaseTransform
 - GstTIOVXSiso
 - GstTIOVXSiMo
 - GstTIOVXMiso

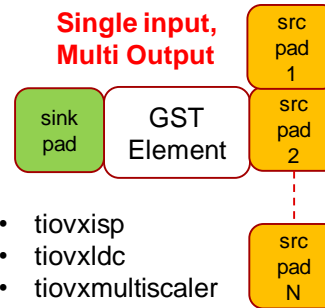
Defines generic classes for mapping
different OpenVx modules

Single input, Single Output



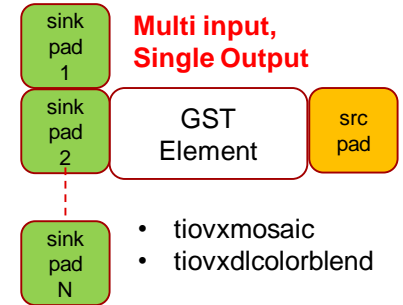
- tiouvcolorconvert
- tiovxdpreproc

Single input, Multi Output



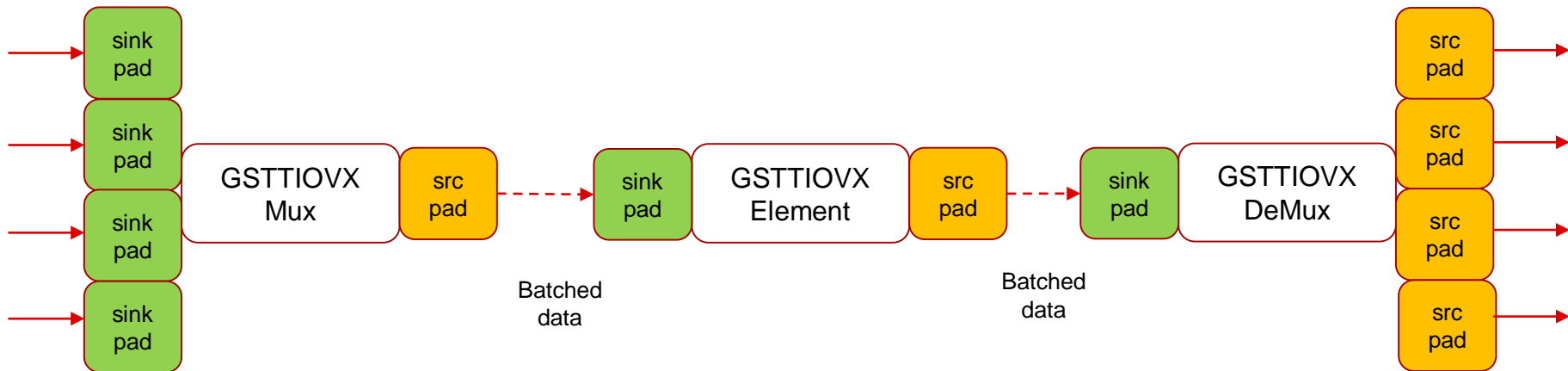
- tiovxisp
- tiovxldc
- tiovxmultiscaler

Multi input, Single Output



- tiovxmosaic
- tiovxdlcolorblend

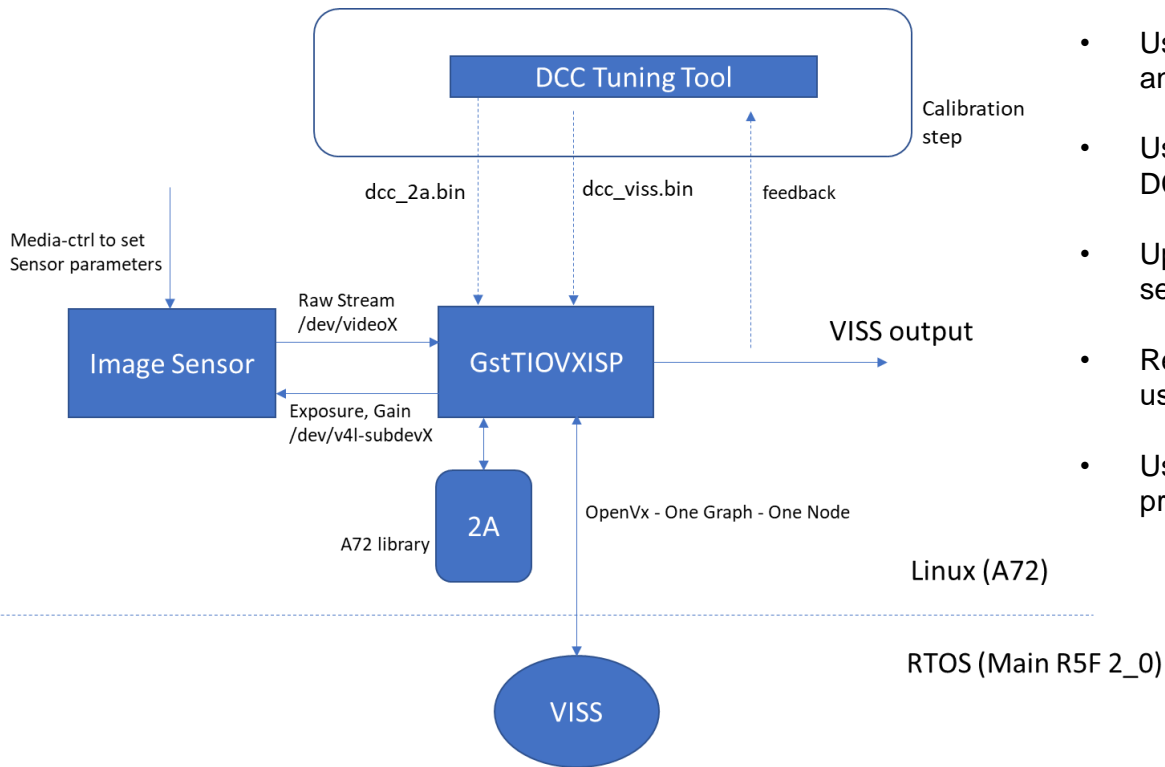
Edge AI SDK | Multichannel support



Features

- Custom Mux and Demux elements batches all inputs and outputs respectively
- Each GSTTIOVX element capable of handling batch of inputs using OpenVx replicate node feature
- A GstTIOVXMux element can be used while connecting a chain of GstTIOVX elements and process in batch
- A GstTIOVXDeMux element is required when the chain encounters a non TIOVX element
- This is mainly done to optimize performance and reduce the number of interrupts from each element to host core

Edge AI SDK | Using on-chip ISP



- Bring up the new sensor as v4l2 compliant driver
- Use standard media-ctrl APIs to set sensor parameters and dump raw output
- Use DCC tuning tool to tune the sensor and generate DCC binaries for 2A, VISS, LDC
- Update the GstTIOVXISP element to work with new sensor type, mostly adding the return path to sensor
- Replace 2A library on A72 with custom implementation, use wrapper API's to interface with ISP
- Use V4I2-subdev enumerated for each sensor to program back exposure and gain from 2A result

Current 8.1 SDK supports RpiV2 camera in 8-bit companded mode

Support will be extended to full 10-bit format in 8.2 SDK

FPD Link based IMX390 camera bringup in progress

Edge AI SDK | Performance


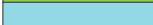
| Model | FPS | Total time (ms) | Inference time (ms) | A72 Load (%) | DDR Read BW (MB/s) | DDR Write BW (MB/s) | DDR Total BW (MB/s) |
|---|-------|-----------------|---------------------|--------------|--------------------|---------------------|---------------------|
| ONR-CL-6150-mobileNetV2-1p4-qat | 30.39 | 33.16 | 3.02 | 11.77 | 1778 | 842 | 2620 |
| TFL-CL-0000-mobileNetV1-mlperf | 30.30 | 33.15 | 2.00 | 9.94 | 1669 | 840 | 2509 |
| TFL-OD-2020-ssdLite-mobDet-DSP-coco-320x320 | 30.37 | 33.16 | 5.01 | 14.14 | 1843 | 913 | 2756 |
| TVM-CL-3410-gluoncv-mxnet-mobv2 | 30.31 | 33.16 | 2.00 | 12.34 | 1695 | 828 | 2523 |

| Model | C71 Load (%) | C66_1 Load (%) | C66_2 Load (%) | MCU2_0 Load (%) | MCU2_1 Load (%) | MSC_0 (%) | MSC_1 (%) | VISS (%) | NF (%) | LDC (%) | SDE (%) | DOF (%) |
|---|--------------|----------------|----------------|-----------------|-----------------|-----------|-----------|----------|--------|---------|---------|---------|
| ONR-CL-6150-mobileNetV2-1p4-qat | 8 | 46 | 34 | 9 | 1 | 30.17 | 0 | 11.26 | 0 | 0 | 0 | 0 |
| TFL-CL-0000-mobileNetV1-mlperf | 5 | 46 | 34 | 9 | 1 | 35.99 | 0 | 11.11 | 0 | 0 | 0 | 0 |
| TFL-OD-2020-ssdLite-mobDet-DSP-coco-320x320 | 16 | 49 | 34 | 8 | 1 | 29.92 | 0 | 11.14 | 0 | 0 | 0 | 0 |
| TVM-CL-3410-gluoncv-mxnet-mobv2 | 7 | 47 | 33 | 8 | 1 | 30.47 | 0 | 11.12 | 0 | 0 | 0 | 0 |

Source : **CSI Camera with VISS (imx219)** Capture
 Framerate : **30 fps** Resolution : **1080p** format : **SRGGB8**

Edge AI SDK | Roadmap

| Sensor & Hardware \ Demo | Image Classification* | Semantic Segmentation* | Object Detection* | Single Input, Multiple Inference* | Multiple Input, Multiple Inference* | HW Decode + Inference* | ISP + Inference* | Inference + HW Encode* | Multi-channel ISP Process | Multi-channel ISP + GPU + Inference* |
|---|-----------------------|------------------------|-------------------|-----------------------------------|-------------------------------------|------------------------|------------------|------------------------|---------------------------|--------------------------------------|
| TDA4VM SK | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| MMCSD/ USB/ PCIe (File Based) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| Ethernet (RTSP Streaming) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| USB Camera (C270/C920/C922) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| YUV Sensor (OV5640) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| Raw Sensor (Rpi v2 IMX219) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| Multi channel with FPDLink (IMX390 + UB953 + UB960) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| DSS (DP, HDMI) | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| HW Acceleration | | | | | | | | | | |
| VPAC: MSC | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| VPAC: ISP + LDC | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| Accelerated Deep Learning | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| DSP Accelerated Pre Processing | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| DSP Accelerated Post Processing | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| HW Decode | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| HW Encode | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |
| GPU | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Available Now | Upcoming | Upcoming |

Legends:  Available Now
 Upcoming

* Integrated Demos with Capture + Pre-Process + Inference + Post Process + Display

Edge AI SDK | Demo

Call to action

- ❑ Get the SK-TDA4VM Starter Kit:
<https://www.ti.com/tool/SK-TDA4VM>

- ❑ Get free support on
www.e2e.ti.com

- ❑ Use free Edge AI Cloud tool today while you wait for the Starter Kit
www.ti.com/edgeaicloud



Build your Edge AI applicaton