Jumpstart Cloud-connected Computer Vision and Machine Learning Designs







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How ML/Computer Vision Can Drive Better Business Outcomes







Machine Learning and Computer Vision Use Cases



Selection of current Toradex customer applications:

- Violet (flowers) Quality Check camera and conveyor belt
- Pizza Robot several conveyor belts and cameras
- Beef Carcass Quality Classification hanging beef carcass passing in front of a camera
- Production Line Monitoring 2D/3D cameras for automated visual inspection
- Smart Street Lights cameras and sensors on streetlights
- Livestock Classification cattle scale combined with cameras

- Seedling Monitoring camera mounted on a tractor
- People Counting Retail Analytics stereo and mono cameras
- Predictive Maintenance Construction Machines CAN bus messages
- Laboratory Equipment Cell Monitoring
- Smart Water Spray for Pine Tree seedlings
- Retinal Camera measuring eye at the doctor
- Camera Monitoring Environment around construction machines, snowplows

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Poll: What is your experience with Computer Vision?

- No experience ٠
- Basic knowledge ٠
- Developed proof of concept •
- Computer vision products in production ٠







Why Edge Compute?



- Works when the cloud is offline
- Avoid network latency

- Keep raw data off the cloud
- Transmit only semantic data

- Process more on the edge
- Store less in a data center
- Avoid expensive backhaul cost (e.g. cellular)







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All the Elements Exist











Get Started in a Few Clicks Apalis iMX8 AI Vision Reference Kit



https://www.toradex.com/imx8-embedded-vision-starter-kit







Demo









TYPICAL TECHNICAL WORKFLOW

Poll: What is your field of expertise? (Multiple Choice)

- Hardware Development
- Embedded Software Development
- Cloud Application Development
- Machine Learning





Tasks to create a production-ready connected device with computer vision and machine learning

- Define the problem to solve, e.g. recognize pasta
- Define architecture, build the proof-of-concept
- Collect training data (best to collect via production setup)
- Train the model
- Optimize, deploy and run the model at the edge device
- Build the hardware
- Integrate all peripherals such as cameras, motor controllers,... (HW/SW)
- Develop cloud backend
- Implement secure user management
- Design user interfaces













System Overview









Example Reference Kit Deployment









Allied Vision Alvium MIPI CSI-2 Camera



Industrial Grade

- Single Board PCB high shock and vibration resistance
- High precision lens mount alignment
- Long-term availability

Flexibility

- Large variety of sensors up to 1.1"
- Unified interface integrate one, integrate all
 - Various housing and mounting options



ISP integrated

- Same functionality regardless of sensor
- Powerful features (e.g. 5x5 demosaicing)
- High image quality

Resource friendly

- Low overhead CSI-2 interface
- Integrated ISP use board performance elsewhere
- Open source driver







Allied Vision Alvium MIPI CSI-2 Camera



Alvium 1500 C-500c camera

| Camera Model | 1500 C-500c |
|-----------------|--|
| Sensor | ON Semi AR0521 color |
| Resolution [MP] | 5.0 |
| Pixels | 2592x1944 |
| Pixel Size [µm] | 2.20 |
| Optical Format | 1/2.5" |
| Shutter Type | Rolling |
| Max. Frame Rate | 67 |
| Interface | MIPI CSI-2 D-PHY with 1,2 or 4 lanes and 1.5GBit/s per lane |
| Lens Mount | S- / M12-mount |
| Included Lens | Allied Vision S-mount, 4.1mm, f/3.0, integrated IR cut filter |



Alvium Cameras are scalable, several pin compatible cameras are available







Collect Training Data and Train the Model

Collect Training Data

- 3000 tagged pictures
- 5 classes
- Ideally use final camera setup

Train Model

- MobileNet SSD
- Input Size 224x224
- GluonCV for MXNet (alternative TensorFlow)
- Train in Cloud or on a PC

Documentation

https://developer.toradex.com/knowledge-base/train-ssd-for-imx8-boards



me/denis/Pasta Demo Dataset/VOC2019/IPEGImad









Challenges for Machine Learning at the Edge

Development is done on powerful machines (Cloud or X86 PCs with GPUs) Focus on simple development not performance

Tooling focusing on Cloud use cases

Developers/Data Scientists not familiar with embedded hardware Embedded hardware is fragmented and very heterogeneous

Models are optimized for accuracy not performance







Challenges for Machine Learning at the Edge



This leads to sub optimal solutions at the Device Edge

- Edge devices are powerful systems with high cost and thermal footprint
- Maker devices are used due to good documentation, however issues occur with reliability and maintenance







Amazon SageMaker helps you build, train, and deploy models







Leverage Amazon SageMaker Neo to Optimize the Inference Model for Target Hardware

Train once deploy anywhere with broad hardware support

Developers can train ML models in the cloud and deploy them in the cloud and at the edge

Optimize the inference to run on the i.MX 8QuadMax Applications Processor

Neo leverages the capabilities of the i.MX 8QuadMax for faster performance and lower power

Flexible ML Framework

Start with ML models built using MXNet, TensorFlow, PyTorch or XGBoost



Open-source Neo-AI device runtime and compiler 1/10th the size of original frameworks







One Click Installation of the Image onto Apalis with i.MX 8QuadMax



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One Click Installation of the Cloud Formation Template From Edge \rightarrow Cloud







Device Operating System



Easy-to-use Industrial Linux



Fast time-to-market Ready-to-use Linux distribution



Real-time Optimized real-time option



Simple updates Built-in, automotive-grade, over-the-air update capabilities



Stable Modern continuous integration infrastructure and verification



Secure Frequent updates, accessible security features



Open Source Based on open projects No lock-in

















On-Device User Interface

- GStreamer
- JavaScript
- Vue.js
- Electron











AWS IoT Greengrass extends AWS services onto your devices, so that they can act locally on the data they generate, while still taking advantage of the cloud.



Local Actions & Remote Control

Machine Learning Inference

Extract, Aggregate, Load



software

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Cloud Web UI – Conveyor Belt Dashboard and Live MQTT View

| | NODEL PERFORMANCE | COMPUTE PERFORMANCE | CONVEYOR BELT STATUS | admin Panel |
|------------------|---------------------------------|--------------------------|----------------------|-------------------------|
| Δ | verage System Load | | Average System Load | |
| Lastun | dated time: 2010-11-13 17:54:21 | | | |
| Last up | dated time. 2019-11-13 17.34.21 | | CPU GPU | |
| J load | | | Detailed System Load | |
| | 61.2% | Arm Cortex A72 | Arm Cortex A53 | |
| U memory usage | | 40 60 | 40 60 | 40 60 |
| | 31% | 20 80 | 20 80 | 20 80 |
| bal memory usage | | 0 ^{99.74%} tec | 0 24.54 %100 | 0 ^{46.02} %100 |
| | 34.6% | | | |
| | | Core 1 | Core 3 | Core 5 |
| | System Load | 40 50 | 10 50 | 401.60 |
| | | 20 80 | 20 80 | 20 80 |
| | | 0 ^{100.00} %tec | 0 34.86 %100 | 0 48.50 %100 |
| | | | | |
| | | Core 2 | Core 4 | Core 6 |
| | | | | |
| | | | | |
| | | | | |
| | | | | |





Cloud Web UI – Conveyor Belt Dashboard and Live MQTT View

| | | | e Karthik Ranjan 🗸 |
|--|--------------------------------|---|---------------------|
| Select Board Board-6494595 | Conveyor Belt Statu | s | S reset |
| LEARNING MODEL PERFORMANCE | COMPUTE PERFORMANCE | CONVEYOR BELT STATUS | 2000 CONFIGURATIONS |
| Considence 0 00 0 00 0 00 0 00 0 00 0 00 Conveyer Bel | Conveyor Belt Speed Controller | <pre>{</pre> | Data Logger |
| | | { "confidence": 0, "sk": "last-6494595", "pk": "inference-shell", "last under distant distant" (2000) | v |







Detailed Architecture





www.nxp.com

February 2020









NXP and Our Partners Together Serve 26,000+ Customers

Employees in 30+ Countries

Headquartered in Eindhoven, Netherlands ~30,000 Employees

9,000 Patent Families \$8.88B Annual Revenue¹

60+ Year History ~9,000 R&D Engineers

¹ Posted revenue for 2019 – Please refer to the Financial Information page of the Investor Relations section of our website at www.nxp.com/investor for additional information







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NXP Supply Longevity

Industrial applications require product longevity

- Long product lifecycles
- Special product certification

NXP Industrial Application Processors

- 10 and 15 year supply longevity options
- Formal program with products listed at <u>www.nxp.com/productlongevity</u>









NXP Qualification Specifications

Qualification Level

Characteristics

Commercial or Consumer Highest MHz 5-year life, 50% on Typically: 0C to +85C Tj

Industrial Longest operating life 10-year life, 100% always on Typically: -40C to +105C Tj

Automotive Widest temperature range 15-year life, 10% on Typically: -40C to +125C Tj









NXP Applications Processor Comprehensive Security









NXP Scalable Arm[®] Processing Continuum

i.MX 8 Series: Cost-optimized and **Power-optimized Performance** Applications Processors For Control or Media Applications

Crossover MCUs

i.MX RT

Performance

MCU

Arme Cortexe-M cores & Wireless Connectivity

LPC

Functional Integration

i.MXULP i.MX6 i.MX7

Cortex-A cores Voice / Audio

Layerscape

i.MX 8

Graphics

Networks



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Advanced graphics, video, image processing, vision, audio and voice





i.MX 8X Family Safety Certifiable & Efficient Performance



i.MX 8 Family Advanced Graphics, Vision & Performance





























i.MX 8 Family (8QuadMax, 8QuadPlus)

In Production: www.nxp.com/imx8

Multiple Systems in One Processor

- Combine multiple systems into one
- Run-time system partitioning and isolation
- Advanced, programmable security

Multi-Display and Multi-Domain Functionality

- Up to four screens with independent content
- Split media architecture: Rich Graphics, faster deployment
- SafeAssure ASIL-B ready hardware
- Failover capable display and audio controller: Alive during reset or OTA updates

Enabling the New World of Machine Interfaces

- Advanced vision-based HMI systems (gesture, object): Loca and cloud
- Multi-camera support and image stitching
- Multi-domain voice-recognition and audio processing









Sampling: www.nxp.com/imx8MPlus

i.MX 8M Plus Family

Highest performing i.MX 8M processor to date

- First NXP ML accelerator 2.3 TOPS
- 4x Arm Cortex-A53 @ 1.8 GHz
- 1x Cortex-M7 @ 800 MHz for real-time functions
- LPDDR4/DDR4 with Inline Error Correcting Code
- Attach two cameras
 2x MIPI-CSI (4 lanes) with ISP 12MP (2 streams)
- Attach three simultaneous displays
 - 1x HDMI 2.0a Tx (eARC) with PHY
 - 1x LVDS Tx (4 or 8-lane) with PHY
 - 1x MIPI-DSI (4-lane) with PHY
- Video decode AND encode 1080p60 H.265
- 2x GbE Controller; 2x CAN-FD Controller
- 15x15mm FCBGA











https://www.AWS.com

January 2020









AWS IoT architecture fundamentals



AWS IoT services



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AWS IoT Architecture: Edge → Cloud Data Flow View







Achieve business outcomes faster using solutions built by AWS and our Partners



Solutions built by AWS that help you quickly solve problems across common industry use cases.



Accelerate your time to value leveraging the expertise of APN Partners and their pre-built solutions.











AWS Partner Device Catalog

Discover validated Partner hardware and devices that are qualified to work with AWS by default.





Qualified IoT devices in the Partner Device Catalog.

https://devices.amazonaws.com/







TORADEX OVERVIEW

Embedded Computing Made Easy Reliable Arm System on Modules Lowest Cost of Ownership Industry-leading Support Global Presence Close to You Focus customers 100 – 50k pcs a year





WHAT WE DO



Arm System on Modules Reliable Long-term Maintenance Scalable From Stock **™** Torizon



Production-ready Software Yocto-based Linux Windows Embedded Compact Development Tools Long-term Maintenance





Ease-of-use Support Ecosystem

RELIABLE AND EASY-TO-USE EMBEDDED SOLUTIONS FOR YOU

Scalable Product Portfolio







Utilized Products – Toradex



Toradex Apalis iMX8 System on Module

- NXP i.MX 8QuadMax Applications Processor
- 15 years long-term availability
- Ruggedized



Scalable

 Pin-compatible with a wide range of System on Modules

Torizon™

- Easy-to-use industrial Grade Linux
- Focus on your application not the BSP
- Secure, OTA Integrated, Realtime Option



Simple Carrier Board Designs

- Reference Designs, Design Guides
- Pinout Designer Tool



High Quality Partner Ecosystem

- Get to Market Faster with Proven Partner Software and Hardware
- Get help from Trusted Partners with Hardware

and Software Design

- Extensive Support
 - Daily Updated Developer Page
 - Active Community Moderated by Toradex Developers
 - Global Presents with Local Support Engineers







Get to Market Faster – Focus on your Differentiators



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Get Started Now

AWS Partner Device Catalog Overview Search FAQ Partners

Toradex Apalis AI Vision Starter Kit for i.MX8

✓ AWS Device Catalog

https://devices.amazonaws.com/detail/a3G0h0000077JScEAM/Toradex-Apalis-AI-Vision-Starter-Kit-for-i.MX8

✓ Open Source Git Hub https://github.com/toradex/aws-nxp-ai-at-the-edge

✓ One Click Shopping https://www.toradex.com/imx8-embedded-vision-starter-kit

Detailed Step-by-Step Documentation

https://developer.toradex.com/knowledge-base/object-detection-demo-with-aws-sagemaker-neo-and-torizon#How_to_Get_Started

Get Started with embedded computer vision, on-device Al using Amazon SageMaker Neo & AWS IoT Greengrass the simple way.

This kit comes with industrial-grade hardware and software such as a high-performance Apalis System-on-Module with an NXP I.MX 8QuadMax Application Processor, an Ixora carrier board, and an industrial MIPI CIS-2 Camera by AlliedVison.

You will have a reference implementation running in minutes that is able to demonstrate object detection and classification based on the example of pasta shapes. A local user Interface via HDMI screen gives you immediate feedback.

With just a few clicks you can also deploy all cloud services including a web-based user interface for remote monitoring, Amazon DynamoDB for storage of your data, AWS IoT Core to handle the MQTT messages, and user management via Amazon Cognito.

When you are ready to train your own neural network, you will be able to use Amazon SageMaker for training, Amazon SageMaker Neo to compile & optimize your model for the NXP i.MX 8QuadMax, and use AWS IoT Greengrass to deploy it on the edge.

| AWS Service | Device Type |
|---|---|
| AWS IoT Greengrass | Starter Kit |
| Industry | Application |
| Agriculture, Energy / Utilities, Healthcare / Life Sciences, Industrial, Retail, Security, Smart City, Transportation | Building Automation, Connected Vehicle, Fleet Management, Food Service, Heavy Equipment, HMI, Industrial Automation, Irrigation, Machine Learning, Machine Vision, Manufacturing, Marine, Medical Devices, Olf / Gas, Pharmaceuticals, Point-of-Sale, Precision Ag, Predictive Maintenance / Quality, Process Control / Automation, Public Transit, Ralivay, Remote Monitoring, Robotics, Security / Access Control, Tank Monitoring, Traffic Management, UAV, Vending / Kiosks, Video Surveillance, Warehouse |
| Shop now | Product page » |
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✓ 20min 1:1 Developer Session at Toradex Booth 4-410 <u>https://www.toradex.com/ew-2020-session-booking</u>

- ✓ Talk at AWS Booth 5-310, February 26th 16:30
- ✓ Demo at NXP Booth 4A-220







Questions?









