



## The Smart City in Motion

Edge/AI in intelligent transportation







Philip Bockrath, Markus Levy, David Steele November 17, 2020

#### Al Virtual Tech Talks Series

Date	Title	Host
November 17, 2020	The Smart City in Motion - AI in intelligent transportation	Clever Devices, NXP, Arcturus
December 8 <sup>th</sup> , 2020	Bringing Spatial AI to embedded devices	SLAMCore



#### Agenda

The Smart City in Motion – Edge/AI in intelligent transportation

- Introduction
  - What is the Smart City
  - How does transportation play a role
- Intelligent Transportation Systems (ITS)
  - Philip Bockrath Clever Devices
- Enabling Intelligence at the Edge
  - Markus Levy NXP Semiconductor
- Developing Systems
  - David Steele Arcturus
- Demos

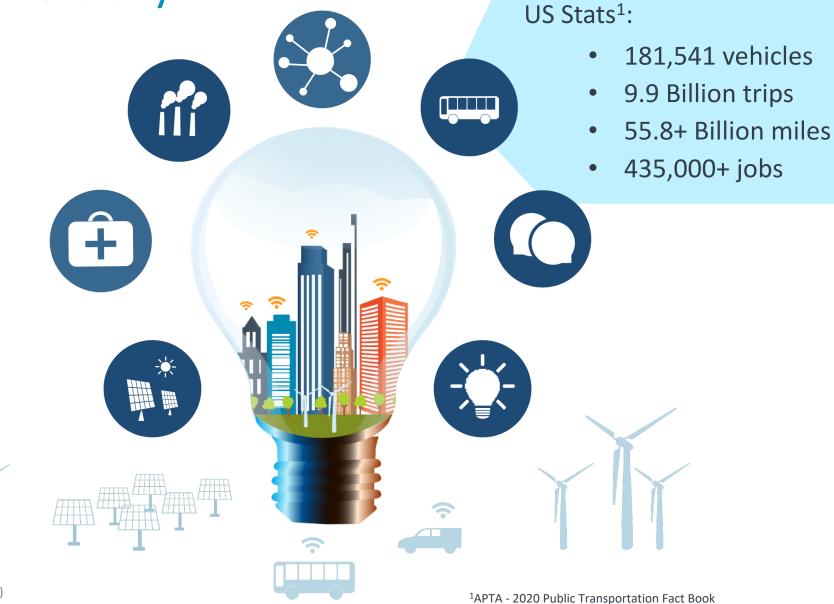


#### What is the Smart City?





#### What is the Smart City?







# Intelligent Transportation Systems (ITS)

#### Presenter

- Philip Bockrath- VP Wireless Communications
  - 26 years in the wireless communications and transit industry



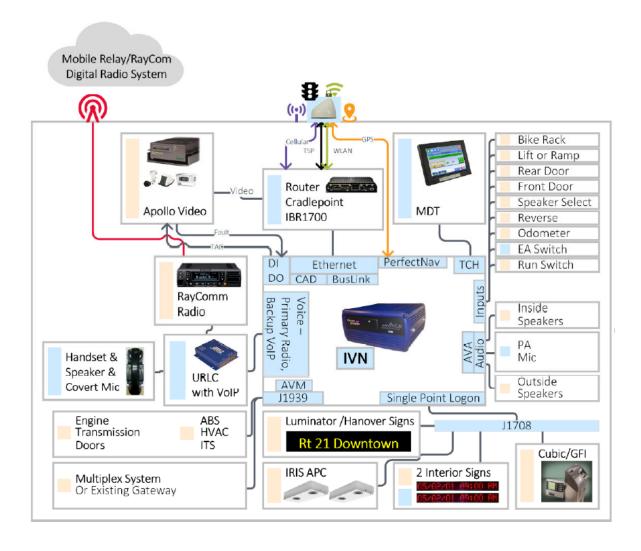


#### It's Just a Bus





#### ITS Just a Bus





#### ITS Just a Bus

- APC- Automatic Passenger Counters
- Fare Collections- with real-time validation and fraud detection
- Video Surveillance
- HR/Workforce Management- Who gets paid based on work performed
- AVM-Automatic Vehicle Monitoring-Engine, Transmission, HVAC, Braking, ABS....
- Secure Bus Access
- AVL/RSA- Automatic Vehicle Location/ Route Schedule Adherence
- Voice Communications- Land Mobile Radio and VolP
- Mobile Environmental Sensors
- AVA- Automatic Voice Annunciation and Stop Display for ADA compliance
- Broadband Communications/ Passenger WiFi



#### Infrastructure

- Centralized CAD/AVL and On Time Performance Monitoring
- RTPI- Real-time Prediction Indication to ridership
- Video Surveillance- Monitor Emergencies remotely, dispatch correct personnel, reduce response time.
- Secure Bus Access- Deescalate thefts, hostage situations and terrorist activities
- AVM- Interface to Work Order System, Fix things before there is a breakdown.
- Disruption Management- Real time route and schedule updates based on detours,
   Construction parades, or the unexpected.
- Voice Communications- LMR/VoIP and Autonomous Switching
- Garage- Precise Parked Vehicle Location
- Mobile Environmental Sensors- Temperature, Biological, Nuclear, Hazardous Materials



#### **AVM**

- What if you had a brilliant mechanic on every bus?
  - 17,000 Unique Fault and Data Points- Not CEL, Actionable Data.
- Reduce Road Calls by 40%
- 90% Reduction in catastrophic engine failures
- Reduce negative social media posts & angry customer service calls





#### **AVM-Use Cases**

#### **Use Case 1**

**Problem:** Complaints about air conditioning in buses in summer. Vehicles in question not creating faults so agency couldn't easily identify which vehicles were not cooling properly. Customers upset and creating angry social media posts.

**Solution**: Create a report that identifies outliers to desired temperatures on all vehicles. Repair only those vehicles that fall outside desired temperatures. Tie to work order management system.

**Results:** No need to analyze every vehicle saving time/money. Improved customer satisfaction.





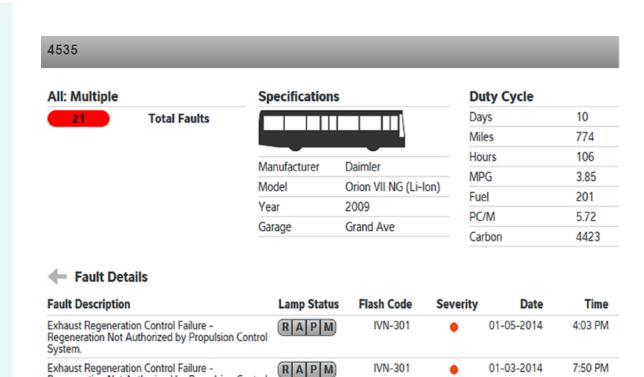
#### **AVM-Use Cases**

#### Use Case 2:

**Problem:** Agency spending significant sums on catastrophic engine failures.

**Solution**: Predictive analysis enables agency to address concerns before they require a completely new engine.

**Results:** Reduce the number of failures dramatically by addressing problems before they require complete engine overhauls. Saved over \$5.5M(US) by reducing blanket manufacturer contracts from \$6M (US) to \$.5M (US) per year.



Regeneration Not Authorized by Propulsion Control



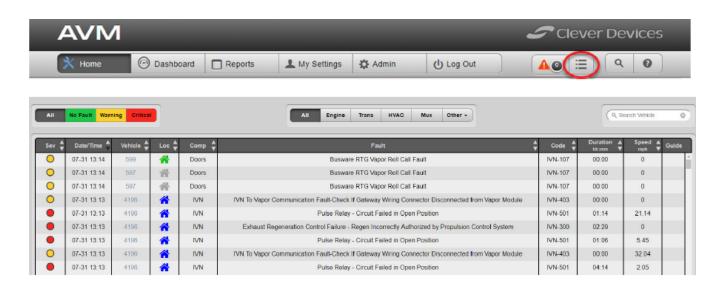
#### **AVM-Use Cases**

#### **Use Case 3**

**Problem:** Vehicles with undiagnosed maintenance issues not addressed until following day leading to increasing road calls.

**Solution**: MAN (Maintenance Action Necessary) audio announcement made upon pull-in triggering crew that repair required.

**Results:** Vehicle is repaired and already on the road before morning report even generated reducing likelihood of road call/frustrated customer.





#### Secure Bus Access

#### Use Case 4:

#### **Problems:**

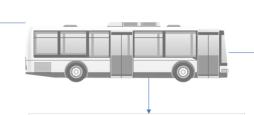
- Theft/Unauthorized Access
- Hi-Jacking with the intent to cause harm to those onboard or on the street
- Malicious actions of a disgruntled employee
- Joyriders

#### **Solutions:**

- Secure Operator Log In with PIN to start engine
- Seat Vacancy Triggers- automatically log off the system if driver leaves seat rendering the bus immovable.
- Remote vehicle shut off brings vehicle to a safe stop
- Speed threshold breach locks out the transmission

#### **ARM**

- · Seat Vacancy Triggers
- Left/Right Signals Alternate
- Alert Message displayed on the interior destination signage
- On-board announcement can be made
- Headlamps and hazard lights will flash



#### SYSTEM LOG ON

- Secure Operator Pin required to start engine
- · Pin matched to employee ID
- If validation fails, transmission with not engage
- Multiple failed attempts must call dispatch to verify pin

#### **DISABLE**

- Brake Lights Illuminate
   as bus de-celerarates
- Door Opens when bus stops
- Stop Engine and Brake Indicators Flash
- Brake and Accelerator interlocks are <u>engaged</u> and signal sent to ABS Module
- Transmission placed in neutral
- Headlights and hazards flash



#### Secure Access-Continued

#### Use Case 4:

**Add Facial Recognition Discussion** 

#### **Process**

- User Selects Traditional log in or Facial Recognition
- Silhouette is shown that allows user to move correct distance from camera.
- User image is validated
- User is logged on to application









## Enabling Intelligence at the Edge

#### Presenter



#### Markus Levy

- Director of Machine Learning Technologies,
- NXP Semiconductor



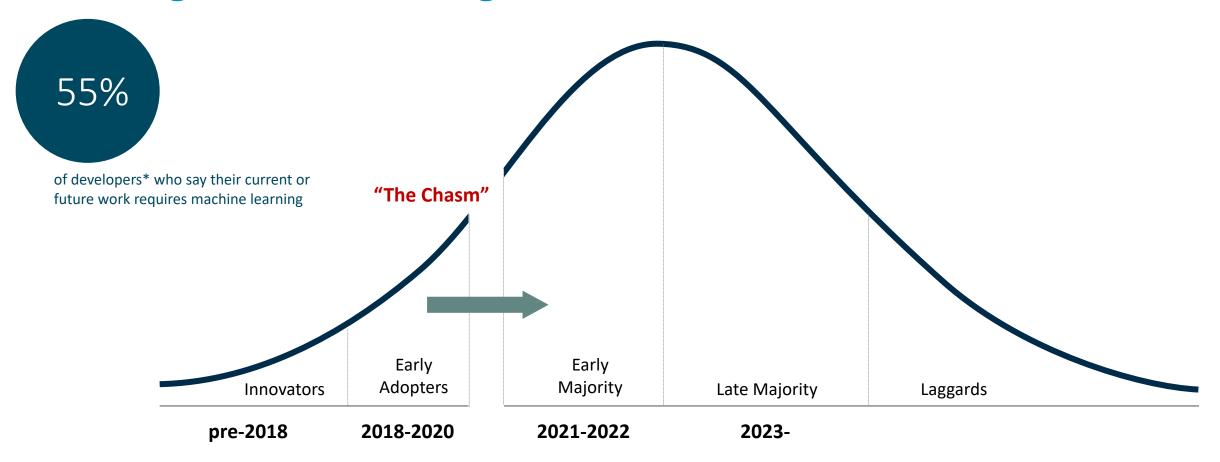




#### **Enabling Edge Intelligence**

Markus Levy - Director of ML Technologies, NXP

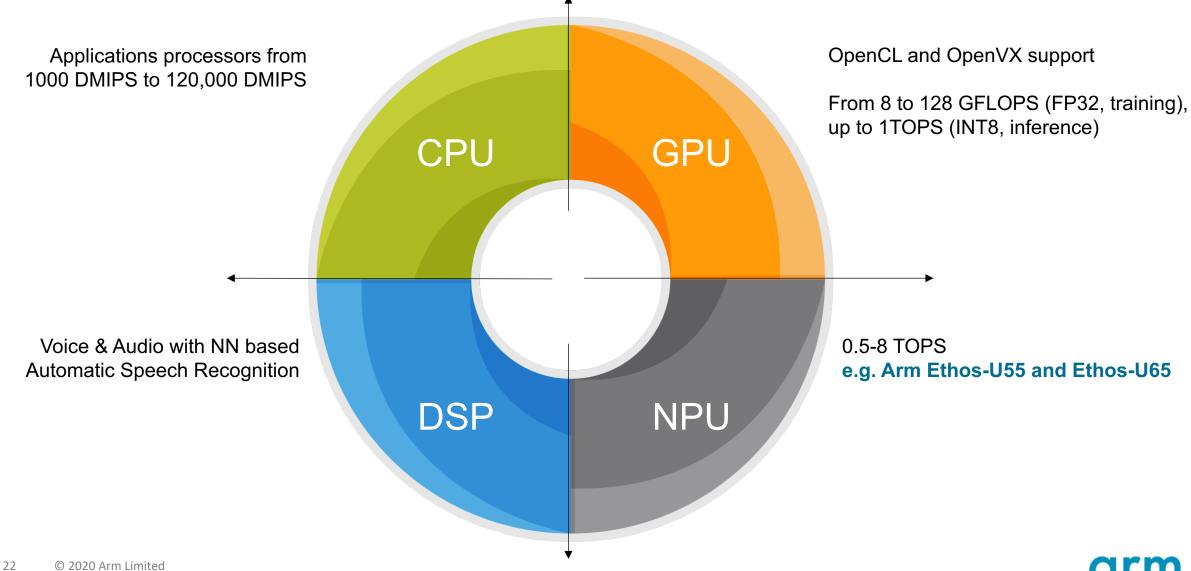
## Machine Learning Adoption Life Cycle – The Big Wave is Coming!



"MACHINE LEARNING FOR ALL, NOT JUST A SELECT FEW"



#### Inference Processing at the Edge – NXP's Compute engines



#### i.MX RT MCUs

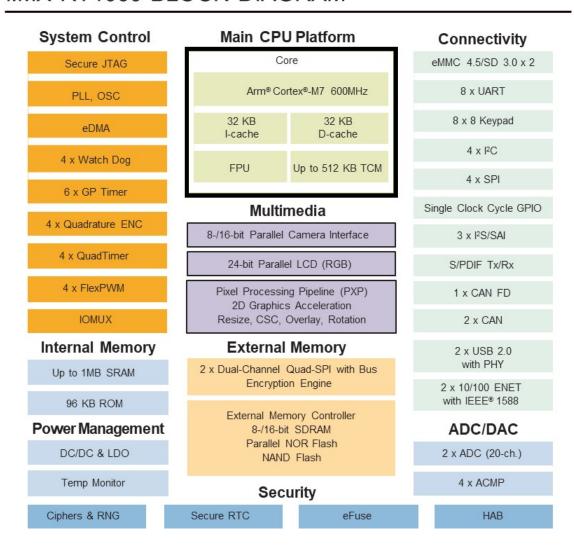
- 600 MHz Arm Cortex-M7 core
- 1 MB of SRAM
- 8-/16-bit Parallel camera interface including PXP

i.MX RT1060

- Next generation 1000 MHz Arm Cortex-M7 + 400 MHz Cortex-M4 cores
- 2 MB SRAM with 512 kB of TCM
- PXP and MIPI-CSI



#### i.MX RT1060 BLOCK DIAGRAM



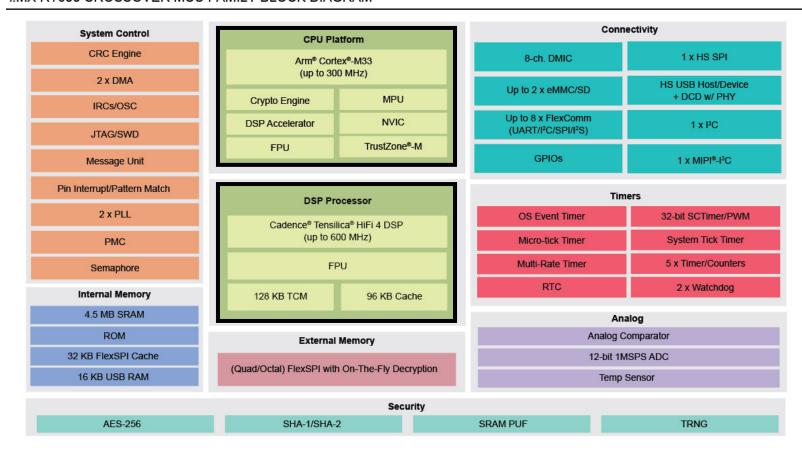


#### i.MX RT600 MCUs

- 300 MHz Arm Cortex-M33 core
- 600 MHz DSP
- 4.5 MB of SRAM
- Audio and sensor processing



#### i.MX RT600 CROSSOVER MCU FAMILY BLOCK DIAGRAM





#### i.MX 8M Plus Machine Learning Compute Engines

#### Machine Learning Accelerator (1GHz)

 Primary Use: Multi-camera classification/detection

#### Quad Arm® Cortex-A53 (1.8GHz)

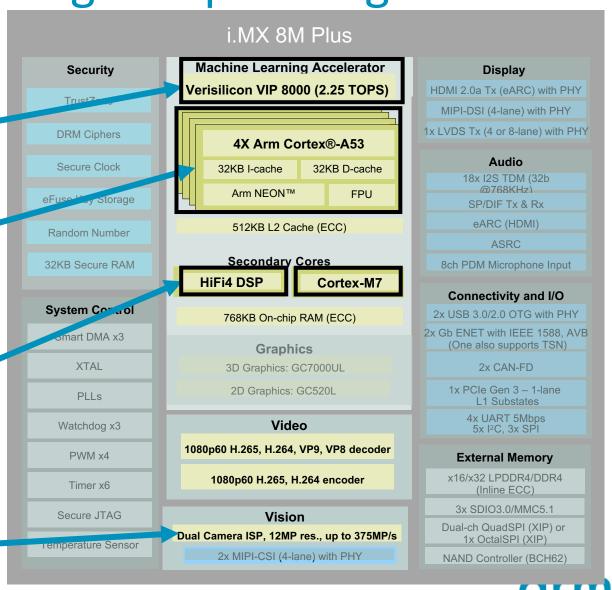
 Primary Use: Speech command recognition, object detect/classification

#### Cortex-M7+HiFi4 DSP (800MHz)

 Primary Use: Keyword detection, sensor fusion

Bonus: 2 channel Image Signal Processor (ISP)

 Primary Use: Scaling, dewarping, image enhancement



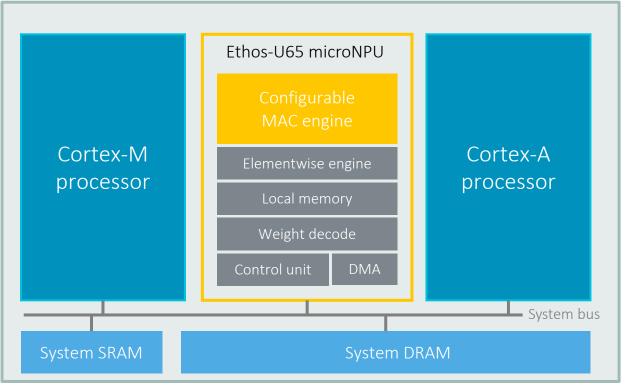
#### Next Gen A-class Based System with Arm® Ethos-U65

HW acceleration for high compute NN + Cortex-M for other operations

Multiple configurations 256/512 MACs/cycle

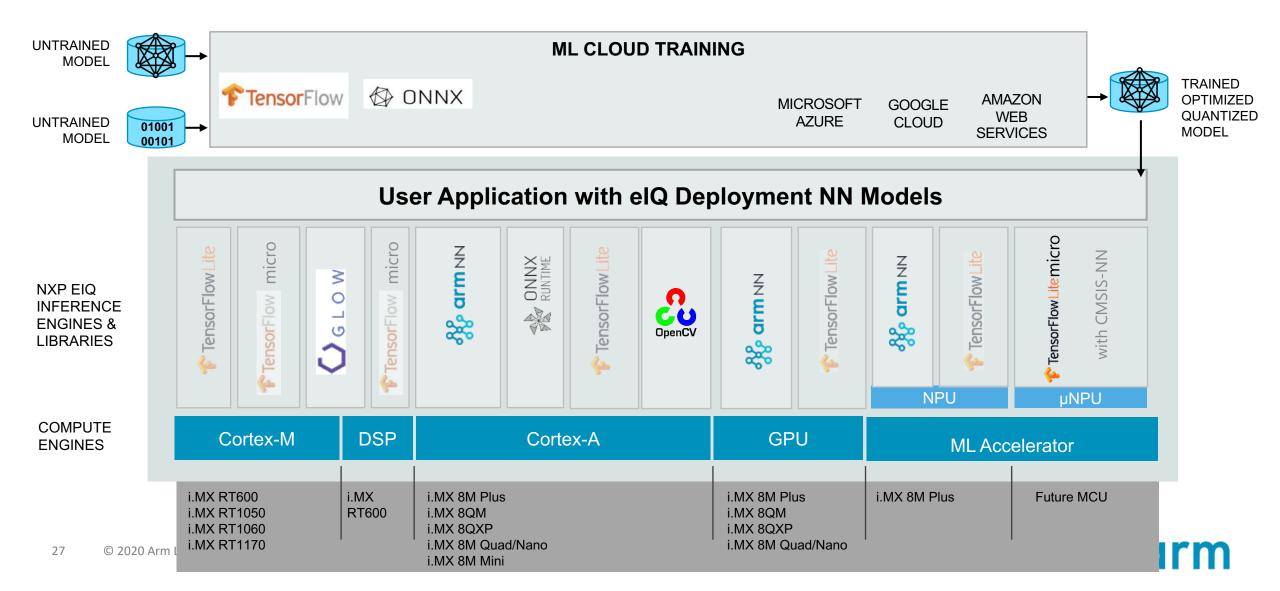
Model compression and on-the-fly weight decompression

Optimization strategies for DRAM and SRAM



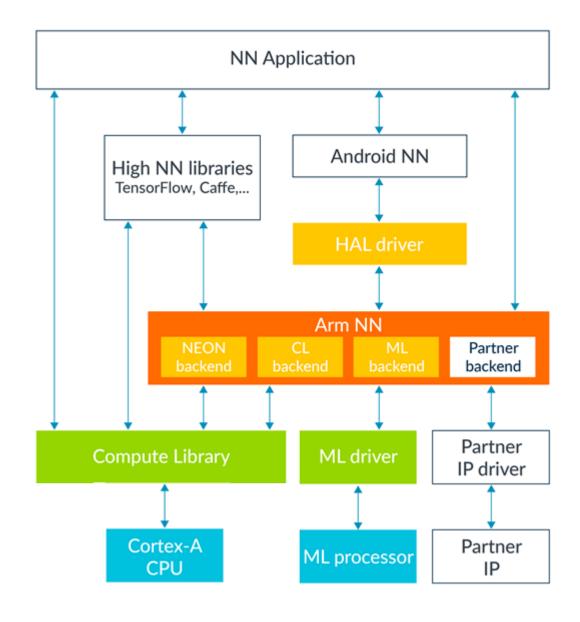


### Flavors of NXP eIQ™ Machine Learning Development Environment



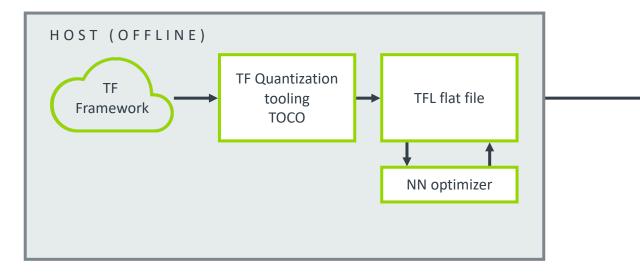
#### elQ - Arm NN

- Inference engine connecting high-level libraries with underlying CPUs, GPUs, and other IP
- NN format parsing support: TensorFlow, TF-Lite, Caffe, ONNX
- A backend maps a graph's layers to the hardware (i.e. driver responsible for executing the compute)

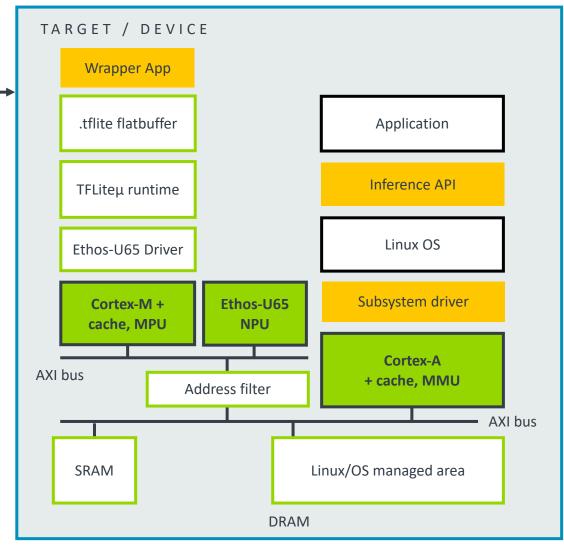




#### **Ethos-U65 Software Flow**



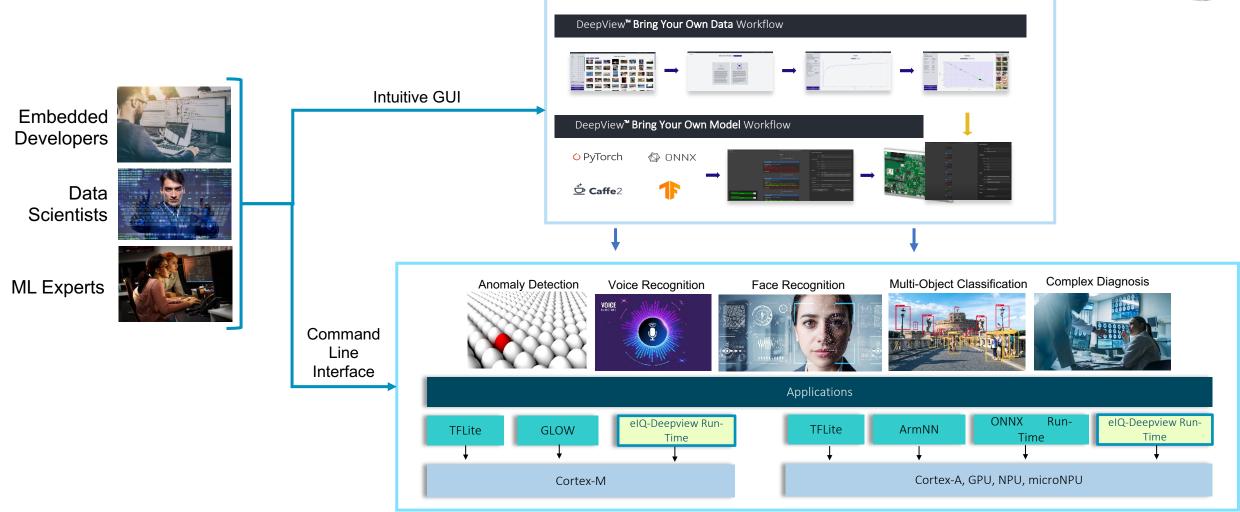
- Next gen Cortex-A based system
- TFLμ-based flow same as Ethos-U55
- Optimization strategies for DRAM and SRAM
- Integration with eIQ





#### Enhanced elQ™ ML Development Environment





Enabled through an investment-based exclusive strategic partnership with Au-Zone Technologies. Available Q1/2021



#### DeepView<sup>™</sup> Bring Your Own Data Workflow





**Data Curation** 

**Model Selection** 

Model Training, Optimization, Quantization

Model Validation

#### DeepView<sup>™</sup> Bring Your Own Model Workflow



**Ö** Caffe2















Public or Proprietary Model

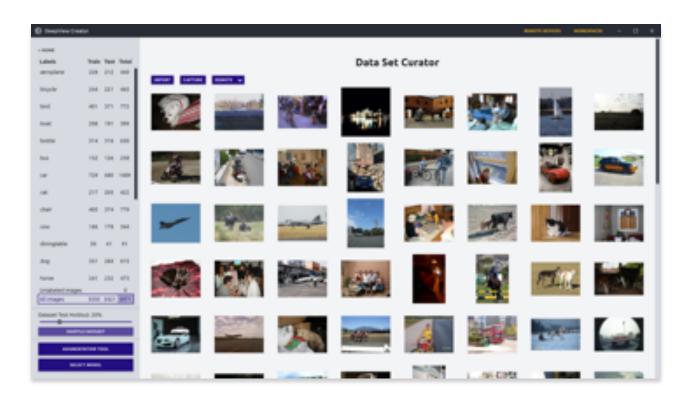






#### **Data Set Curator**

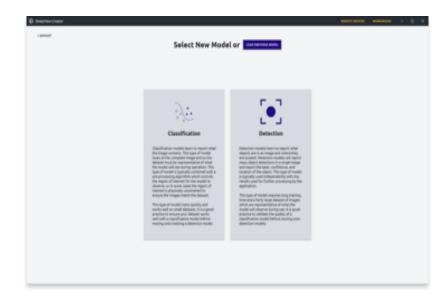
- Image import/capture
  - Label, Annotation
- Augmentation tool
  - Horizontal & vertical flip
  - Random cropping
  - Random image height/weight expansion
  - Random rotation
  - Random Shear
  - Contrast, brightness, saturation
- Shuffler for training and test set

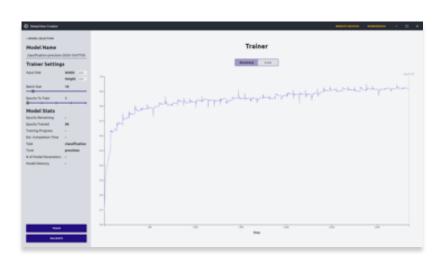




#### Model selection and training

- Classification Models
- Detection Models
- Model tuner
  - Performance
  - Balanced
  - Precision
- Model Training, Optimization, Conversion, Quantization & Deployment











### **Developing Systems**

#### Presenter



#### **David Steele**

- Director of Innovation, Arcturus
- 20 years experience with edge systems and enablement





#### Looking at a Use case

#### **Key Objectives**

- Identify people
- Provide localization
- Identify packages
- Report analytics / situational awareness

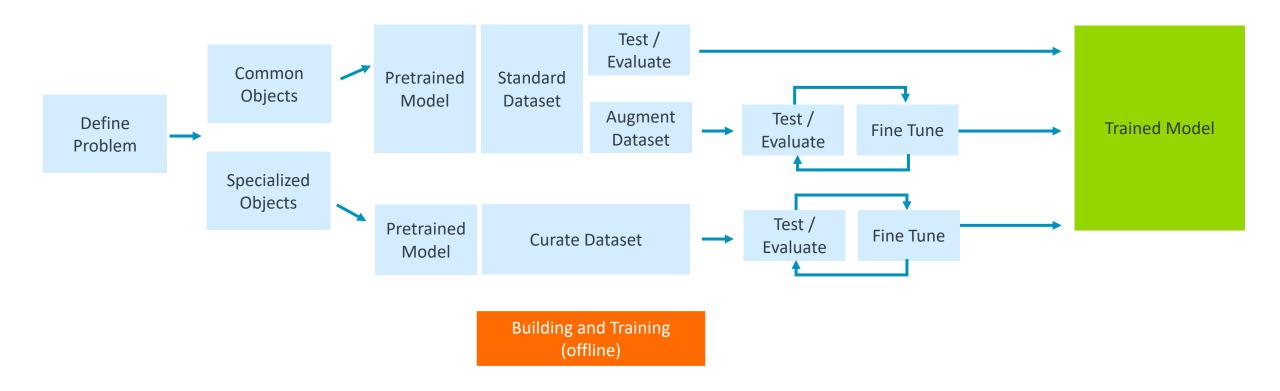






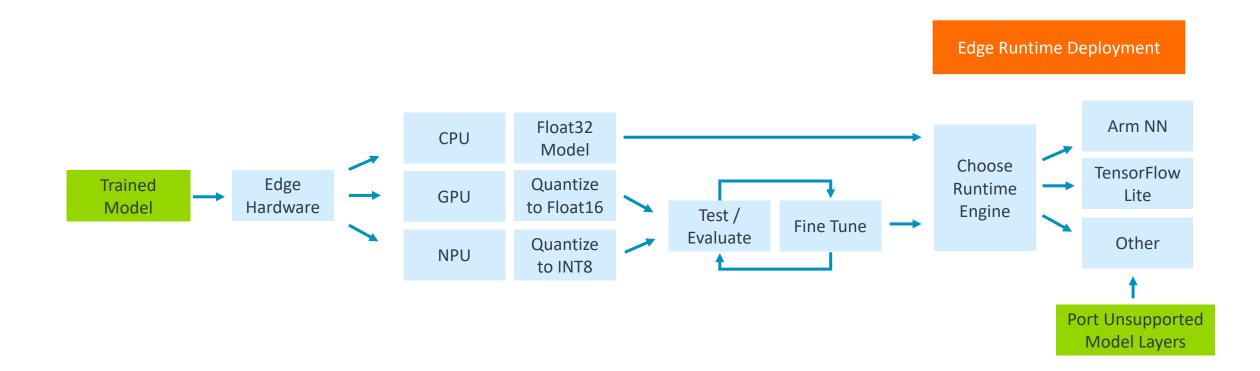


# **Model Selection and Training**





# **Edge Runtime Optimization**

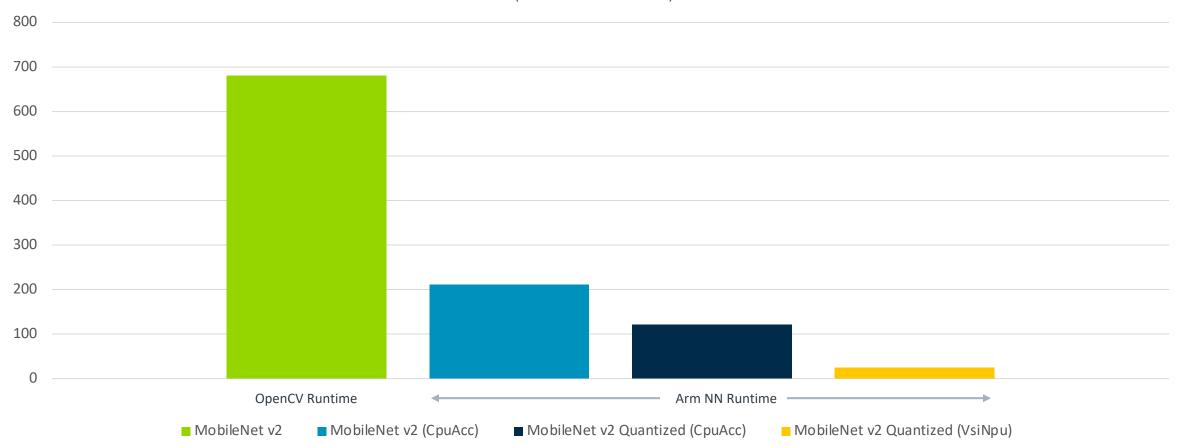




### **Model Acceleration**

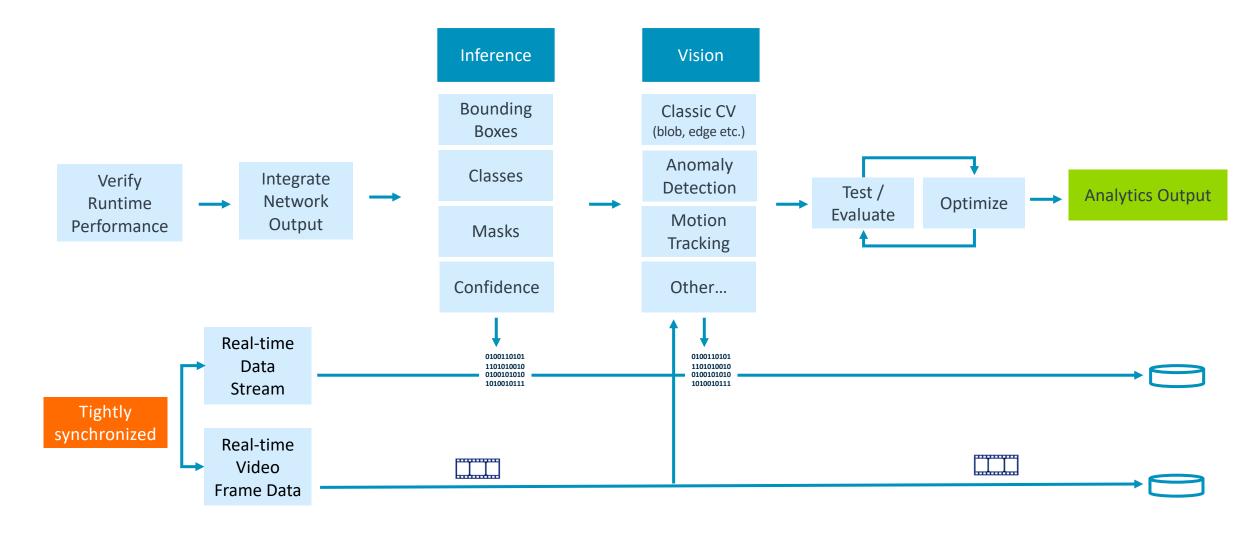
#### Inference Performance in mS

(lower number is better)



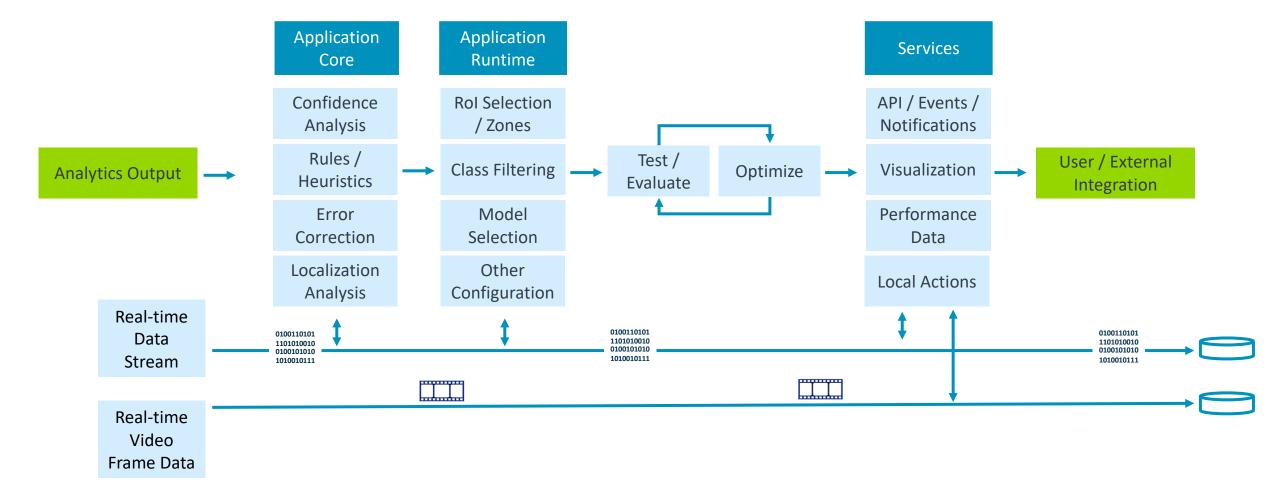


### Inference and Vision





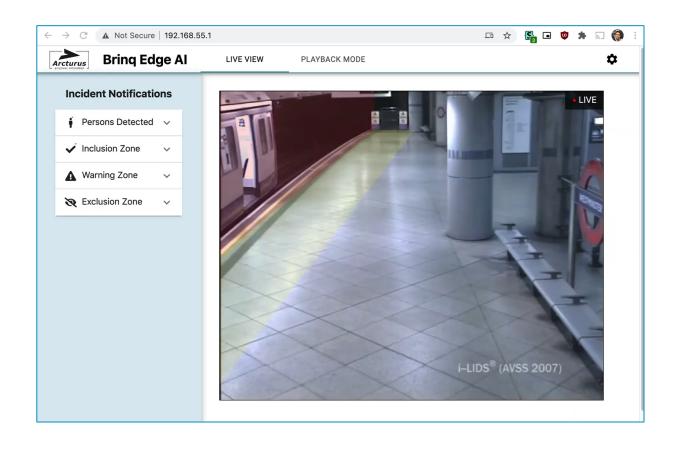
# **Application and Services**





### Video Demo

#### **Boundary Crossing and Tracking**



Localization is provided by using bounding box output and comparing it with predefined zones



# Tracking and Re-identification

Algorithms and Data Analysis

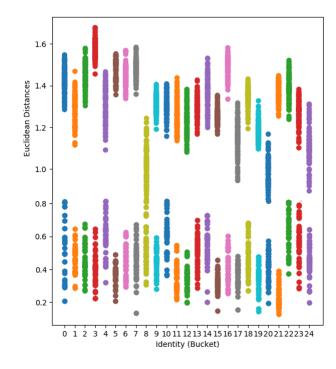
#### **Determining Identity and Association**



#### **Analyzing Visual Appearance**



Different pairs







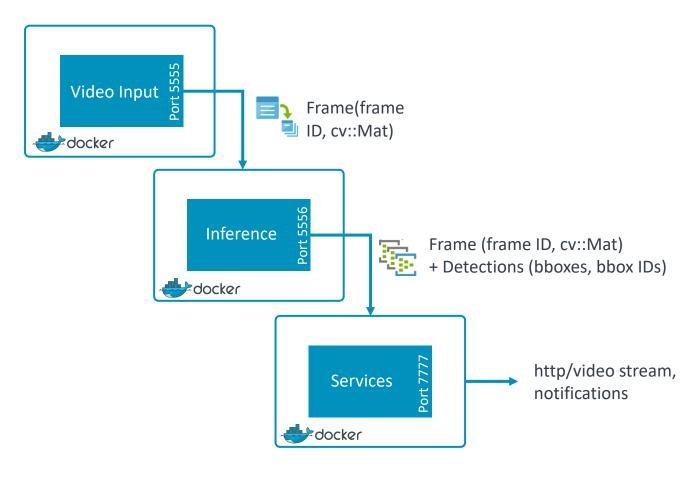
Same pairs

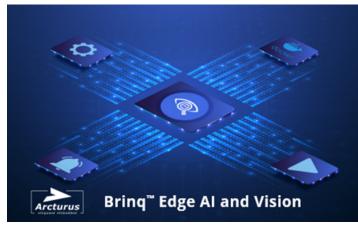
Market1501 Dataset



# Pipeline Design

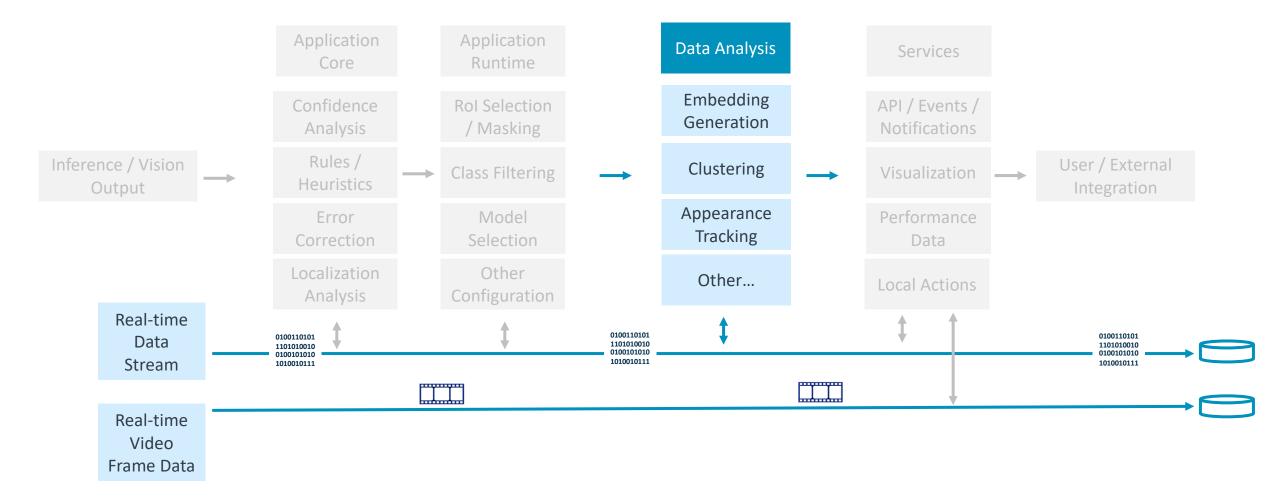
Scalability and Serviceability







# Adding in New Pipeline Node





### Characterization

#### Describing Appearance in Human Terms

#### **Detection and Colour Modeling**



#### **Segmentation Output**

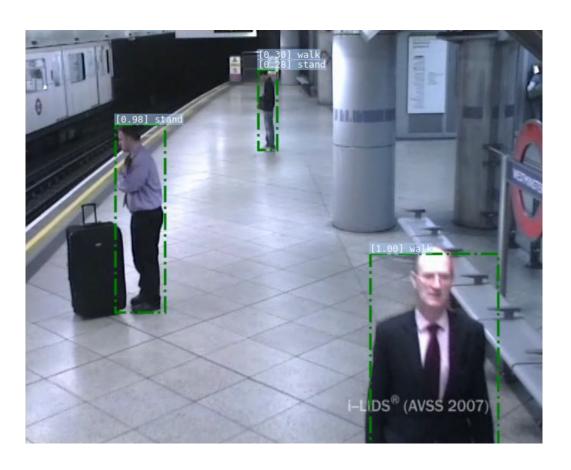




# **Action Recognition**

Normal vs Abnormal Behaviour

#### Normal



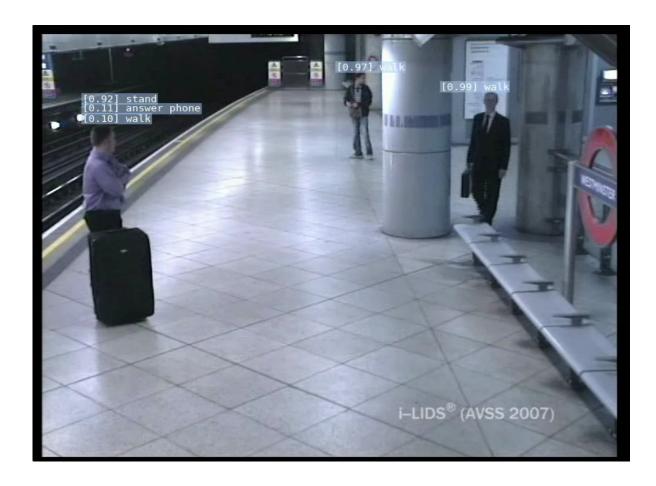
#### **Abnormal**





### Video Demo

#### **Action Recognition**



Action recognition analyzes a sequence of frames to determine behaviour



### Video Demo

#### **Action Recognition**



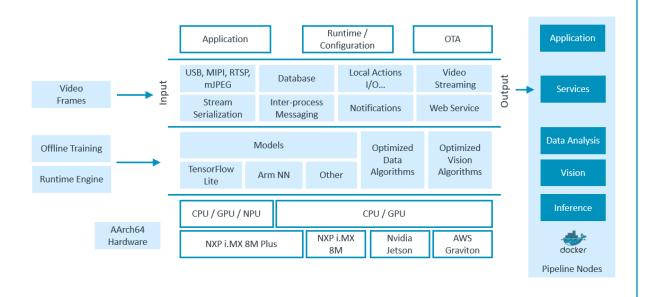
Action recognition analyzes a sequence of frames to determine behaviour



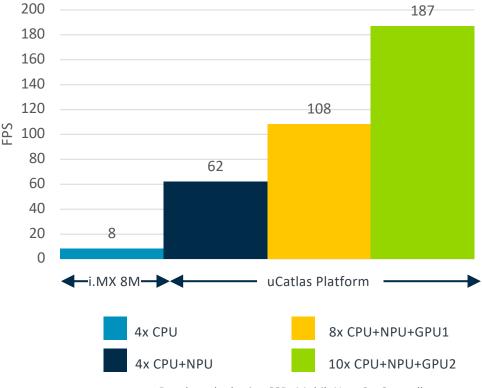
# Bring - Edge AI / Vision

Software and Hardware solutions

#### **Solution Stack**



#### Hardware Performance









# Thank you!

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Don't forget to fill out our survey to be in with a chance of winning an Arduino

Nano 33 BLE board



Register today at: www.tvmconf.org



Thank You Danke Merci 射射 ありがとう Gracias

\* Kiitos 감사합니다 धन्यवाद

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