

Hailo-8™: The World's Top Performing Al Processor for Edge Devices

Enables Data-class AI Applications in an Embedded Power Envelope



## **About Hailo**



A leading AI chipmaker for edge devices, founded in 2017

1st generation in MP



Headquartered in Israel with offices in USA, Germany, Japan, China, Korea, Taiwan



Patented structure-defined dataflow architecture



190 + employees with extensiveexperience from leading tech companies



Total \$224M funding including Strategic Investors

NEC & ABB



A growing worldwide partner ecosystem





**Awards Honoree** 













## **Intelligence Become a Necessity**

Hailo's powerful and scalable AI technology enables new capabilities in various markets



#### **Automotive**

Autonomous Vehicles, ADAS



## ITS (Intelligent Transportation System)

Traffic control, Tolling, Law enforcement



#### **Smart City**

Public safety & security



#### **Smart Retail**

Cashierless Store, Inventory
Management



#### **Smart Home**

Security,
Assisted Living



**Industry 4.0** 

**Factory Automation** 



## Deep Learning at the Edge with Hailo-8™

#### **Use-case Examples:**





















**Device Examples:** 











**Intelligent Cameras** 



## **Hailo-8™ Highlights**

#### The World's Most Powerful and Efficient Edge Al Processor



#### **High Performance**

26 TOPS

Efficient AI architecture



HNC18BC21BH P64R88.00.N 27NS11

#### **Power Efficiency**

**Typical Power** 

Consumption: 2.5W





#### **Comprehensive SW Tools**

Mature dataflow compiler

Efficient RT library







## Industrial & Automotive

Grades

Industrial: -40°C to 85°C

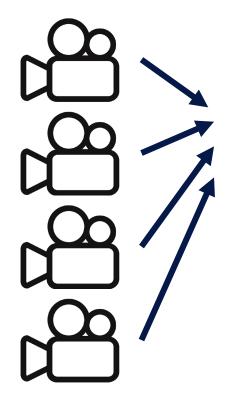
Automotive: -40°C to 105°C

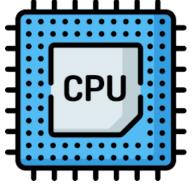


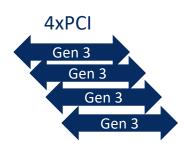




## Hailo-8™ System Usage









#### **Host processors support**

- Intel X86 Celeron, i3, i5, i7, Atom, Xeon, ...
- ▶ AMD X86
- ARM based
  - ▶ i.MX8
  - ► Layerscape (LX2160)
  - ▶ S32G
  - Raspberry Pi
  - FPGA SoC Xilinx Zynq
  - Renesas R-CAR V3H/V4H
  - SocioNext SC2A11

#### Flexibility & Scalability

- Performance scalability (1x to 12x Hailo-8
   → 26 to 312 TOPS)
- ► Host processor type (X86 & ARM)
- ▶ Interface w/Host (PCIe / Ethernet)

## **Hailo-8™ Product Offering**

#### Hailo-8<sup>™</sup> Al Processor

- ▶ 26 TOPS
- Industry-leading power efficiency
- ▶ 17 x 17 FCBGA

# HNILD HNC18BC21BH P64R88.00.N 27NS11 2027

#### Hailo-8<sup>™</sup> M.2 Al Acceleration Module

- PCle Interface
- M.2 form factor
  - M.2 Key M 2242/2260/2280
  - M.2 Key B+M 2242/2260/2280
  - M.2 Key A+E 2230
- ► Extended temperature support: -40°C to 85°C



M key 4 lanes

B+M key 2 lanes

A+E key 2 lanes

#### Hailo-8R™ mPCle Al Acceleration Module

- PCle Interface
- mPCle form factor 3050
- Extended temperature support: -40°C to 85°C



#### **PCIe Acceleration Card**

- PCle Interface
- Multi-chip configuration (x4, x5, x6)
- ▶ Up to 156 TOPS
- ► Typical power: 35W





## Hailo-8™ M.2 Starter Kit

- ▶ Al accelerator module for developing and prototyping edge Al applications and specifically for video analytics solutions
  - ► M.2 module with Hailo-8<sup>™</sup> Al accelerator processor
  - ▶ Best-in-class real-time performance utilizing the Hailo-8™ 26 TOPS compute power
  - ▶ Industry-leading power efficiency with typical power consumption of 2.5W
  - ▶ Higher cost-efficiency (TOPS/\$) compared with existing solutions
- ▶ Robust software toolchain supports state-of-the-art NN models and applications out-of-the-box
- Suitable for various applications





## **Hailo-8™-Powered Edge AI Solutions**





**MicroSys** 



AIP-LX2160A









**VAC-1100** 



APB-3000AI











OptiPlex 7080



OptiPlex 3070



**NE(COM** 



VTC1021



**NISE-51** 



NISE-52





Xtreme i11



**UPS Squared Pro** 







LEC-2290H



LEC-7242H





**RSC101** 



ebox710-521-fl

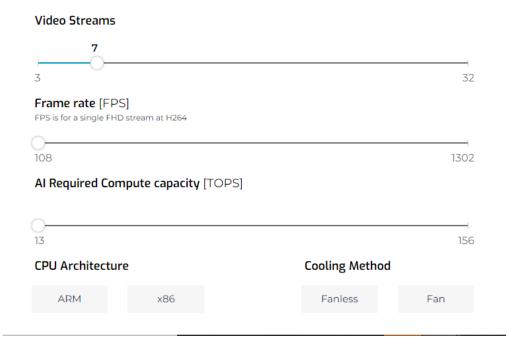




#### **Platform Selection Guide**

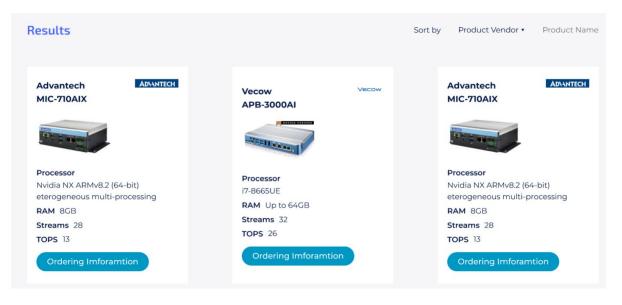


#### **Platform Selection Guide**



Quickly find a H/W platform with Hailo inside

- Based on the database maintained by BD
- Clear criteria for selection and de-selection



https://hailo.ai/product/platform-selection/



## **Hailo & NXP Joint Offering**

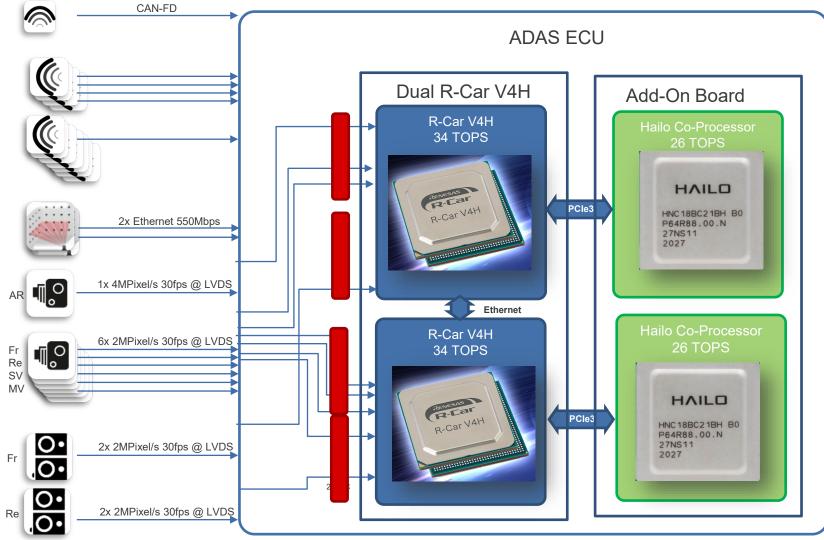
Combining NXP's Arm®-Based Processors with Hailo-8™ AI Processor for a powerful, scalable and efficient AI offering for embedded products

- Generic edge device designs
  - ▶ Hailo-8 combined with Arm® based NXP® i.MX 8 Series delivers a powerful, power-efficient and cost-effective platform for edge devices
  - Application-ready hardware is available from Kontron
- Automotive driven designs
  - ► Hailo-8<sup>™</sup> combined with Arm<sup>®</sup> based NXP<sup>®</sup> S32 Automotive and NXP® Layerscape® platforms results in a high-performance, scalable, safe and efficient automotive grade solution
  - Application-ready hardware is available from MicroSys





## Hailo & Renesas Joint Autonomous Drive ECU Concept



- Independent scalability in AI and compute allowing flexibility for L2-L4 ADAS designs
- Best-in-class power efficiency enabling passively cooled ECUs
- Cost-efficient solution "pay for what you need"
- Pay as you grow with Hailo Al accelerator roadmap
- Open software ecosystem allowing OEMs/Tiers control and innovation

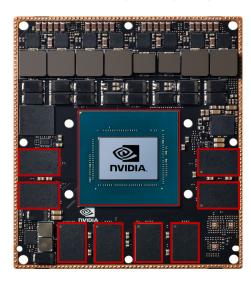
Combining Renesas R-Car V4H with Hailo Al Co-Processor



## **Unprecedented AI Performance**

#### Comparison on Inference Compute Performance

#### **NVIDIA AGX Xavier**



General Purpose GPU
+ External Memory

Hailo-8<sup>TM</sup> M.2 A+E Key



Dedicated AI Chip
No External Memory

#### **ResNet-50 Benchmark**

Device	Total Power [Watt]	Total Power Efficiency [TOPS/W]
Hailo-8™	1.6	3.0
Nvidia Xavier AGX	32	0.14

#### **Conditions:**

- TOPS (8-bit): Xavier 32 TOPS, Hailo-8 26 TOPS
- 224x224 image resolution feed @ 656 FPS
- · 8-bit precision
- Batch size = 1



X15 Better
Area Efficiency

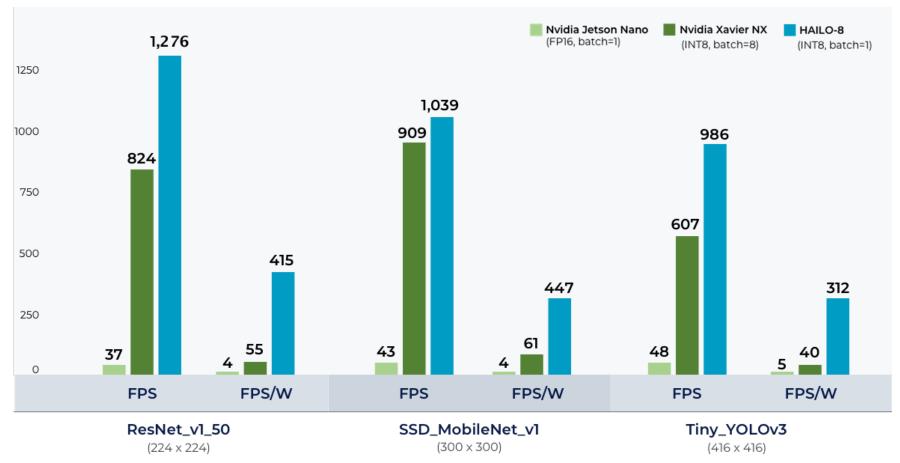


X20 Better
Power Efficiency



## **Unprecedented Performance at the Edge**

#### Hailo-8 offers higher performance and as much as x8 the power efficiency of Nvidia's best edge device



#### Remarks

- SDK version 3.9.0 (June 2021), measured at room temp on a single Hailo-8 device through PCIe interface on a Hailo EVB. System host: Intel® Core™ i5-9400 CPU @ 2.90GHz)
- Xavier NX results are using batch=8 (while Hailo-8 and Jetson Nano are using batch=1) and that Jetson Nano is limited to FP16 (while Hailo-8 and Xavier NX are INT8). Nvidia results for batch=1 and INT8, respectively, are expected to be lower.
- FPS & power figures for Nvidia Jetson Nano and Xavier NX are sourced from the Nvidia website and Github repo, retrieved 12/07/21

## Hailo-8™ Unprecedented AI Performance and Power Efficiency







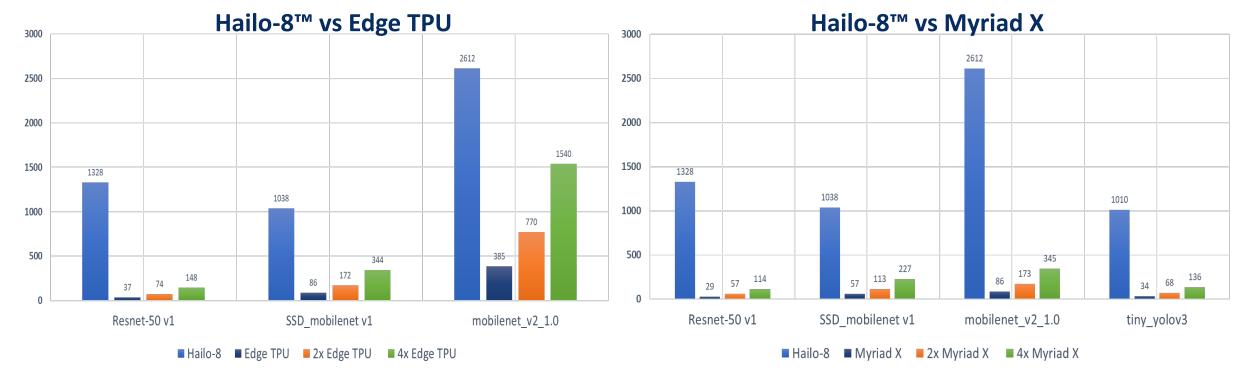
	Intel Myriad X	Google Edge TPU	Hailo-8™	Hailo-8™ outperforms
Performance	87	385	2,613	x30 vs. Myriad X
FPS	, and the second se	x6 vs. Edge TPU		
Power Efficiency	35	275	1,267	x30 vs. Myriad X
FPS/W				x4 vs. Edge TPU

#### The Hailo-8™ M.2 Al Acceleration module unprecedented Al capabilities

Provides the scalability to run advanced video analytics DL models in high-resolution & high-frame rate



## Hailo-8™ Unprecedented Performance at the Edge



Hailo-8™ **outperforms** 

x10 vs. Edge TPU

x2 vs. 4 Edge TPU devices

Hailo-8™ **outperforms** 

x26 vs. Myriad X

x6 vs. 4 Myriad X devices

- Hailo-8 figures are based on SDK Q1 2022 version, measured at room temperature on Hailo-8 device through PCIe interface on a Hailo-8 evaluation board (system host: Intel Core i5-9400 CPU @ 2.90GHz)
- Edge TPU figures are for batch=1 and INT8, while Myriad X is batch=1 and FP16
- Intel Myriad X figures sourced from: https://docs.openvinotoolkit.org/latest/openvino\_docs\_performance\_benchmarks\_openvino.html, retrieved April 2022
- Google Edge TPU figures sourced from here and here retrieved April 2022; FPS is converted from latency in ms (1 divided by ms/1000)



## Hailo-8™ Measured Benchmarks

Model	Туре	Input Resolution	FPS	Total Power [W]	FPS/W
ResNet-50 v1	Classification	224x224	1,328	3.1	428
MobileNet_v2_1.0	Classification	224x224	2,613	2.1	1,267
MobileNet_v3 <sup>4</sup>	Classification	224x224	3,519	1.9	1,852
RegNetx_800mf	Classification	224x224	2,462	2.0	1,254
EfficientNet_M	Classification	240x240	891	3.2	278
SSD_MobileNet_v1	Object Detection	300x300	1,055	2.3	453
Tiny_YOLOv3	Object Detection	416x416	1,010	3.2	315
YOLOv3 <sup>5</sup>	Object Detection	608x608	60	4.3	14
YOLOv4 <sup>5</sup>	Object Detection	512x512	70	3.04	23
YOLOv5m	Object Detection	640x640	218	4.2	53

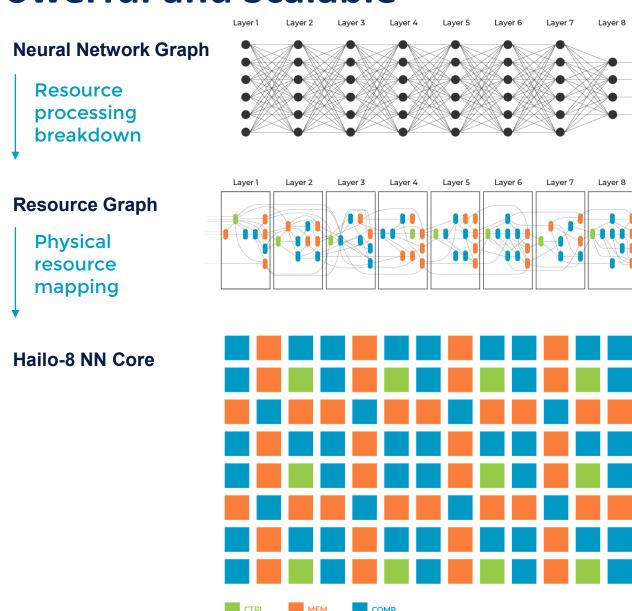
#### Notes:

- 1. Based on Dataflow compiler version 3.18.0 (Q2 2022)
- 2. Measurements were taken at room temperature through PCle interface on Hailo-8 evaluation board
- 3. System host: Intel(R) Core(TM) i5-9400 CPU @ 2.90GHz
- 4. MobileNet\_v3 the benchmarked model flavor is Mobilenet V3 Large Minimalistic
- 5. Performance figures are for processing 8 simultaneous streams



## Hailo-8™ NN Core: Unique, Powerful and Scalable

- Dataflow vs. decision making
- Physically distributed computation
- Software abstraction allows quickly running a variety of NN models
- Smaller elements lead to Lower power
- >20 patents pending





#### Up to 12 Hailo-8™ Scalability in Edge Devices devices Up to 6 devices Up to 4 devices Up to 2 devices 1 device 1 to 12 devices 312 **156** TOPS 104 **TOPS 52 TOPS** 26 **TOPS 26** to **312 TOPS TOPS** of AI processing



## Falcon-H8: PCIe Accelerator Card with Multiple Hailo-8™

- ▶ Off-the-shelf PCIe for high-performance video analytics systems
  - PCIe accelerator card with x4, x5 or x6 Hailo-8™ devices in a standard PCIe single slot form factor provided by Lanner
  - ▶ Delivers up to **156 TOPS** for video analytics at a typical power consumption of **35W**, no auxiliary power required
  - ▶ Higher cost-efficiency (TOPS/\$) compared with existing solutions



- ▶ A powerful platform for edge AI and video analytics:
  - ▶ High-performance Edge AI Boxes and video analytics servers for Smart Retail, Smart City, and more
  - ▶ Edge servers, industrial PCs and gateways
  - ▶ Industrial and commercial robots
  - Evaluation and prototyping for ADAS/AV sensing



## **Falcon-H8 Performance, Power and Cost**

**NVIDIA T4 PCIe** 



General Purpose GPU

**130 TOPS** 

Power 70W

Falcon-H8 PCIe



**Dedicated AI Processors** 

**156 TOPS** (w/6 Hailo-8™ devices)

**Typical Power 35W** 

#### ResNet-50 Benchmark

	Performance [FPS]	Power [Watt]	Power Efficiency [FPS/W]
Falcon-H8 *1 (4x Hailo-8)	5,313	32	166
Falcon-H8 *1 (6x Hailo-8)	7,692	38	202
Nvidia T4 *1	1,109		
Nvidia T4 *2	3,288	70	47
Nvidia T4 *3	4,909	70	70

- 224x224 image resolution
- 8-bit precision
- \*1 Batch size = 1
- \*2 Batch size = 8
- \*3 Batch size = 128
- Source: Nvidia T4 performance

Falcon-H8

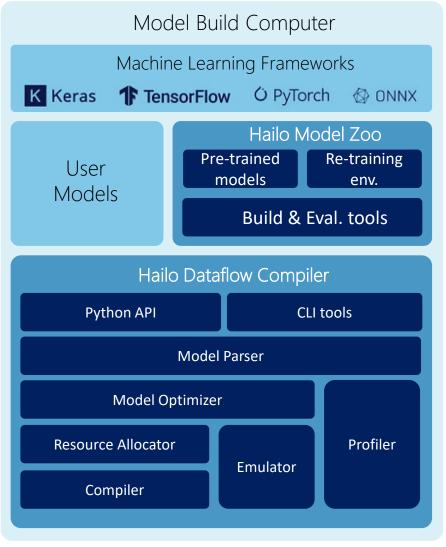




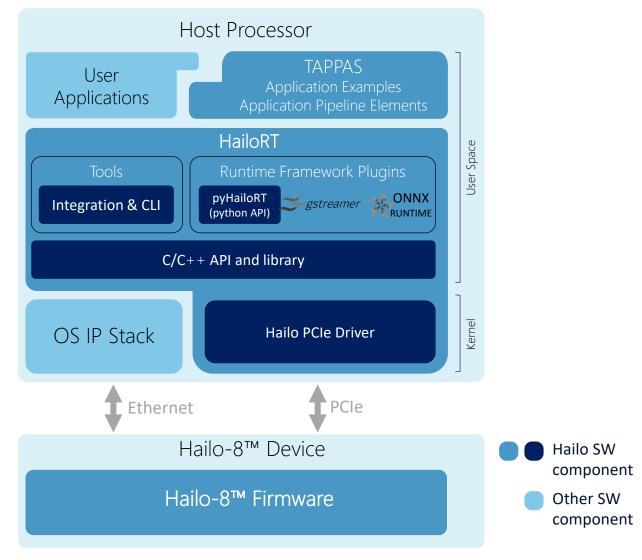
X3 Better
Power Efficiency

## **Hailo Software Toolchain and Developer Tools**

Model Build Environment



Runtime Environment



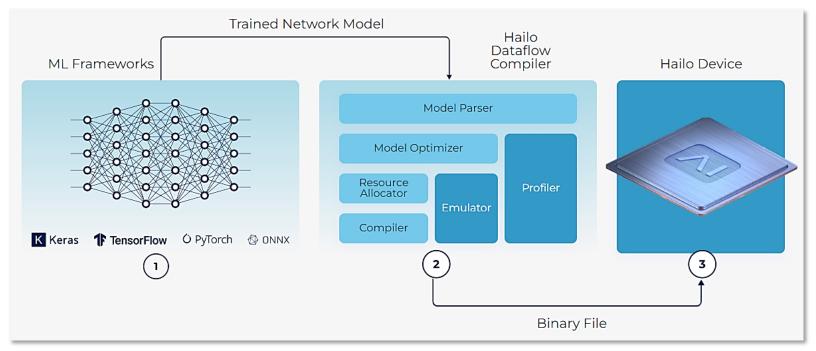


## **Hailo Dataflow Compiler**

Automated software toolset

converting trained models to

Hailo's executable format



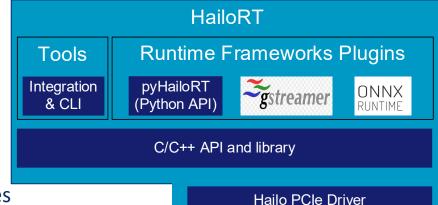
- ▶ Efficient quantization scheme allowing flexibility between performance and accuracy
- ▶ Automated resource allocation for meeting user's requirements in FPS, latency and power consumption
- ▶ Accurate profiling (FPS, power, latency) and bit-exact emulation of expected accuracy
- Supporting multiple Hailo devices and forward compatible



## **HailoRT Key Software Modules**

Production-grade, light, runtime software precompiled for x86 & AArch64 for the host CPU; Open-source in github

- Runtime frameworks Integration
  - pyHailoRT Python API
  - ▶ Standard frameworks support: GStreamer, ONNX runtime
- Integration Tool
  - for verification of the hardware integration of Hailo-8™ M.2 & mPCle modules
- CLI Tools
- HailoRT Library
  - ► C/C++ API for control and data transfer to/from Hailo device
- PCle Driver
  - External kernel module. Can be installed using DKMS framework
- Yocto Layer
  - ▶ Enables integration of Hailo's software into Yocto environment
  - ▶ Includes recipes for the HailoRT library, pyHailoRT and the PCIe driver



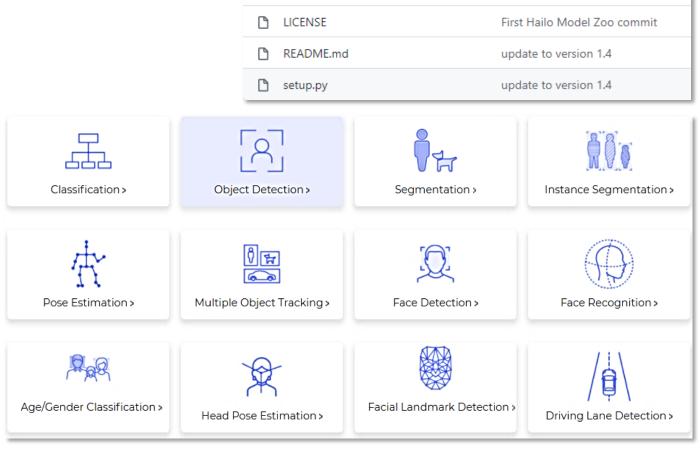




## **Hailo Model Zoo**

A variety of common and state-of-the-art pre-trained models and tasks in TensorFlow and ONNX

- Opensource repository (available on GitHub)
- ▶ Quickly and easily reproduce Hailo-8 performance for evaluation and development
- Models can be re-trained with updated datasets



docs

hailo model zoo

hailo\_models

training

HailoModelZoo Merge pull request #8 from hailo-ai/fix-broken-links ....

new/renamed files for version 1.4

new/renamed files for version 1.4

new/renamed files for version 1.4

fix broken links

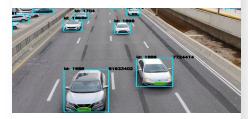


## Hailo Al Template APPlications And Solutions (TAPPAS)

Suite of high-performance, pre-trained template AI tasks and applications elements with production-grade pipeline

- Suitable for variety of categories and industries
- Useful for demos and can be used as reference designs
  - Accelerate time to market by reducing development and deployment effort
  - Model(s) can be easily replaced

**License Plate Recognition** 



Multi Streams Multi Device Object Detection



Multi Person Multi Camera Tracking



Object Detection and Depth Estimation



**Semantic Segmentation** 



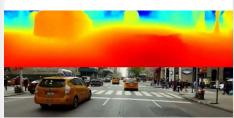
**Pose Estimation** 



Facial Detection & Recognition



**Depth Estimation** 



**Instance Segmentation** 



https://hailo.ai/developer-zone/tappas-apps-toolkit/



#### **Hailo Demos**

#### **Object Detection**

on 15 video streams



## **Detection with High Power Efficiency**



https://hailo.ai/resources/#demos



#### Multi-sensor IVA for Smart City



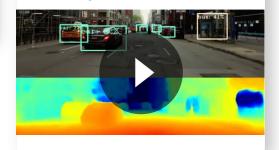
## **Vehicle License Plate Recognition (LPR)**



#### Multiple Object Tracking



**Depth Estimation & Object Detection** 



## Object Detection w/Yolo V5M



#### **Semantic Segmentation**



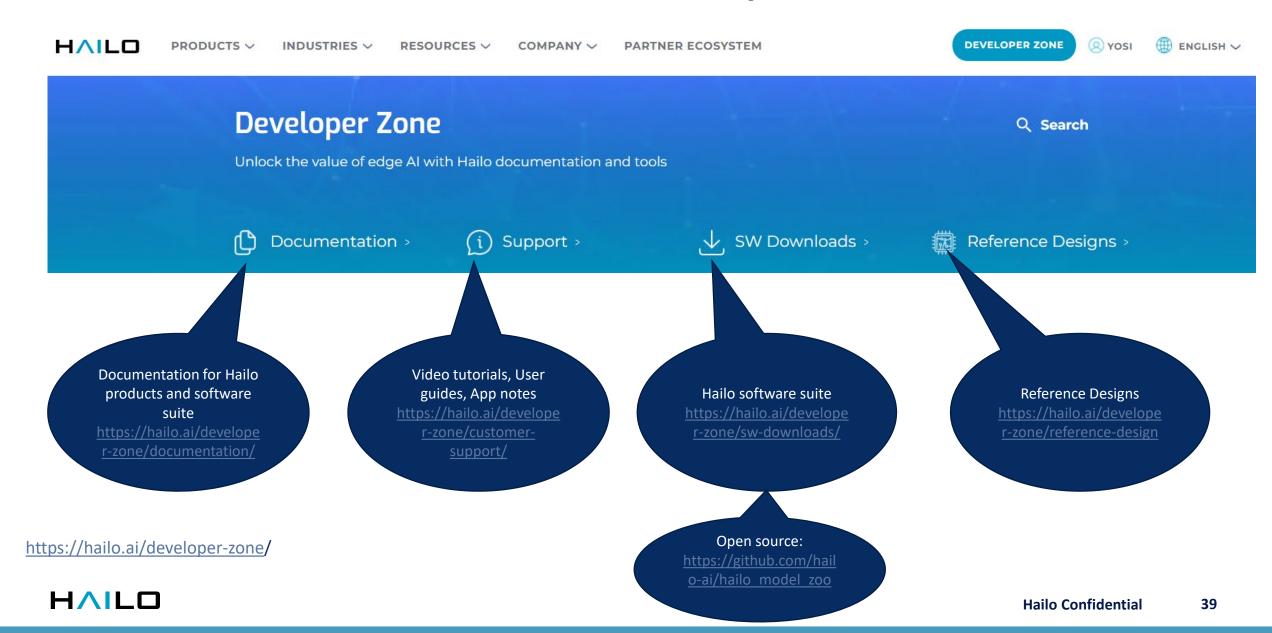
## Improved Object Detection w/ Tiling



## **Intelligent NVR Ref Design**



## **Software & Documentation – Developer Zone & Github**





# THANKYOU



