



# An Introduction to Edge AI for Data Scientists

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2024-05-14



# What if your device was capable of ...

...detecting abnormal patterns in your heart rate, other than just RHR or HRV?



...detecting movements & repetitions during your workout with highest accuracy?



...giving indications of your health based on snoring, coughing or other sounds?



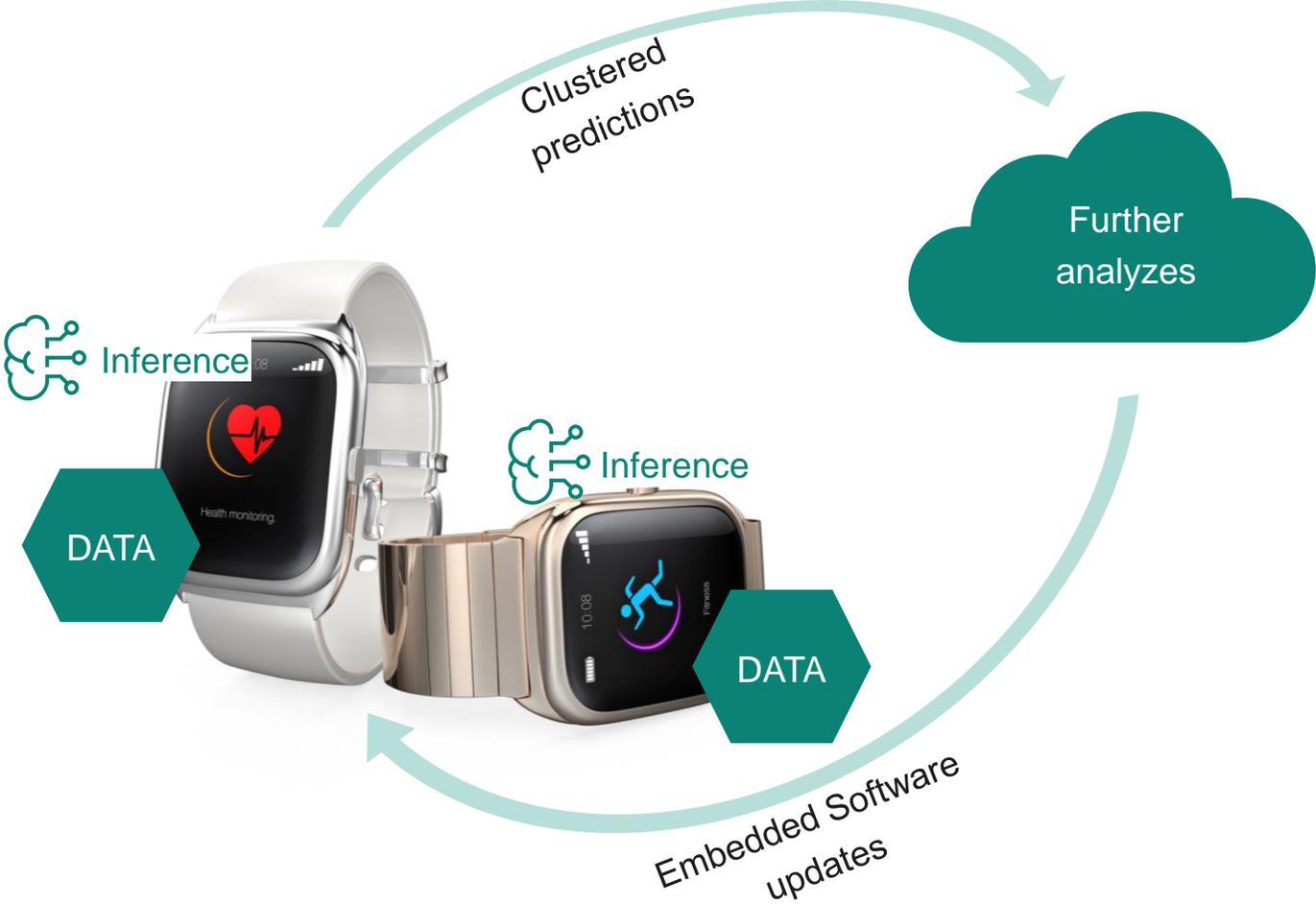
# What if your device was limited to Cloud AI?

- ! Data privacy
- ! Power efficiency
- ! System reliability
- ! Latency
- ! Functional security
- ! Cost efficiency

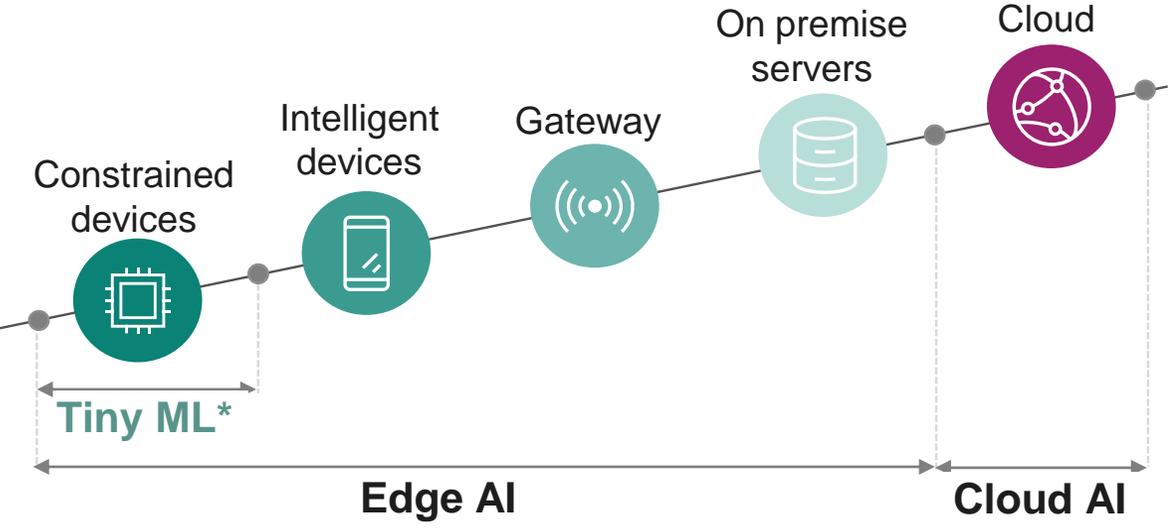


# What if your device could work with Edge AI?

- Data privacy
- Power efficiency
- System reliability
- Latency
- Functional security
- Cost efficiency

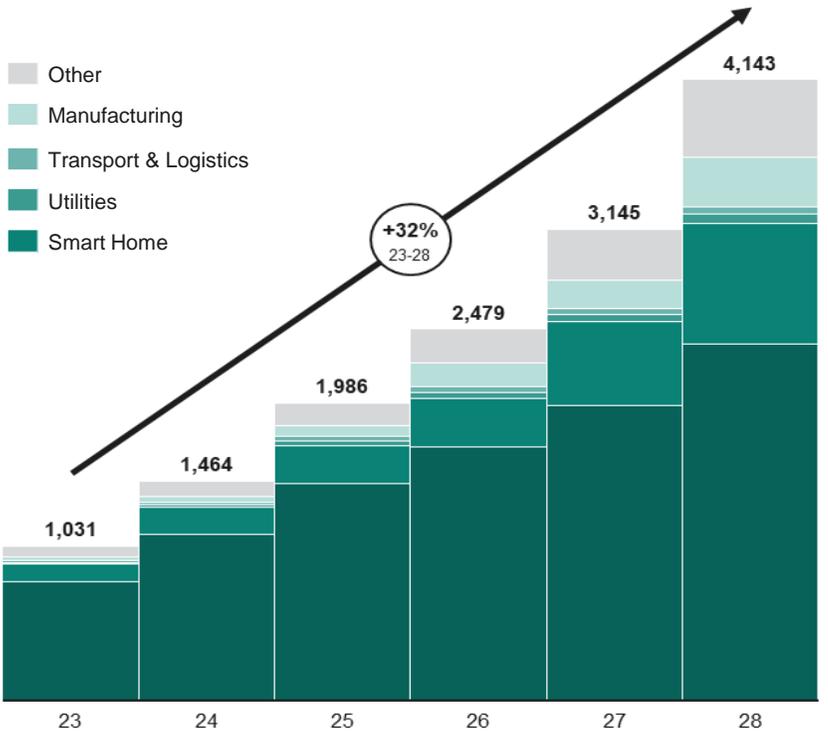


# AI moves directly into the devices...



\* Tiny ML = Tiny Machine Learning  
Refers to AI inference on microcontrollers

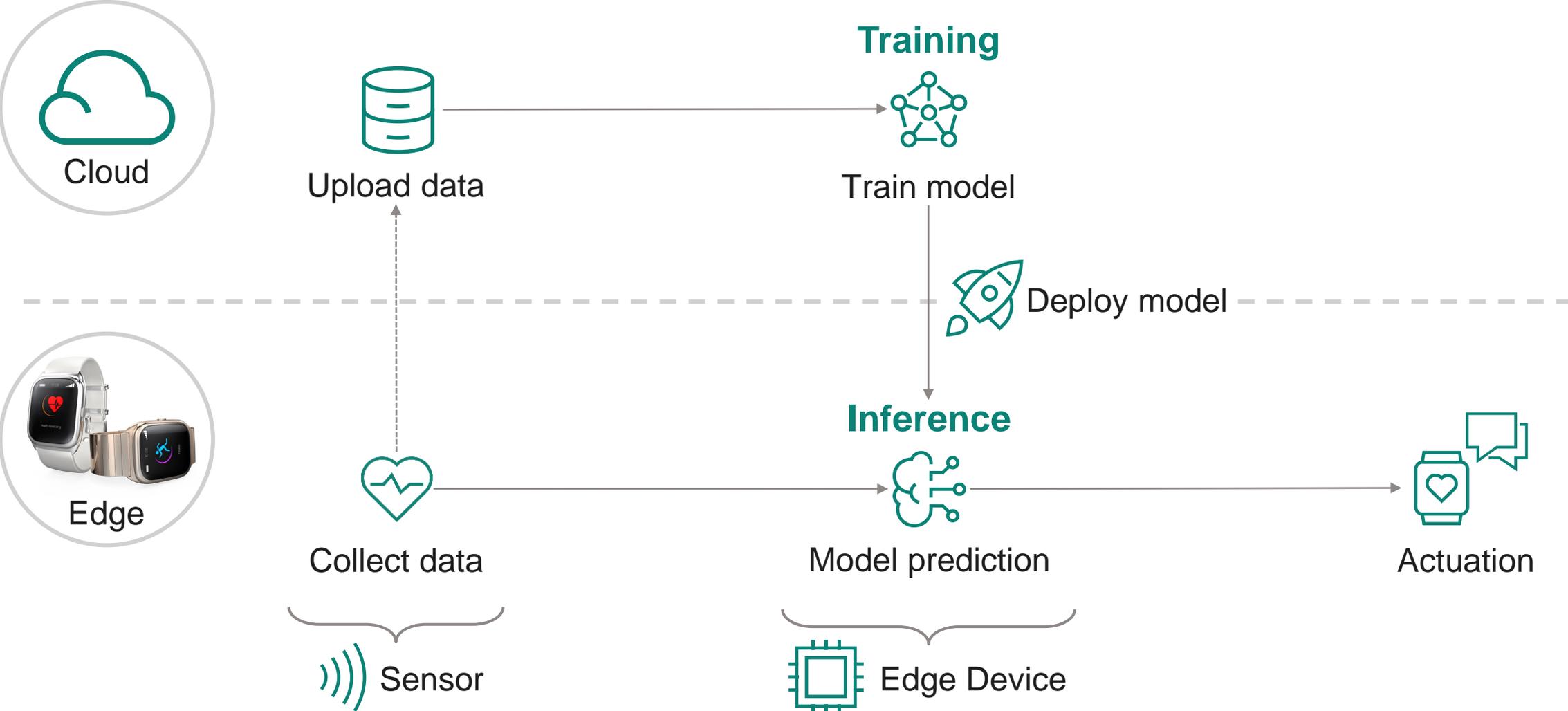
# ... which impacts a variety of markets



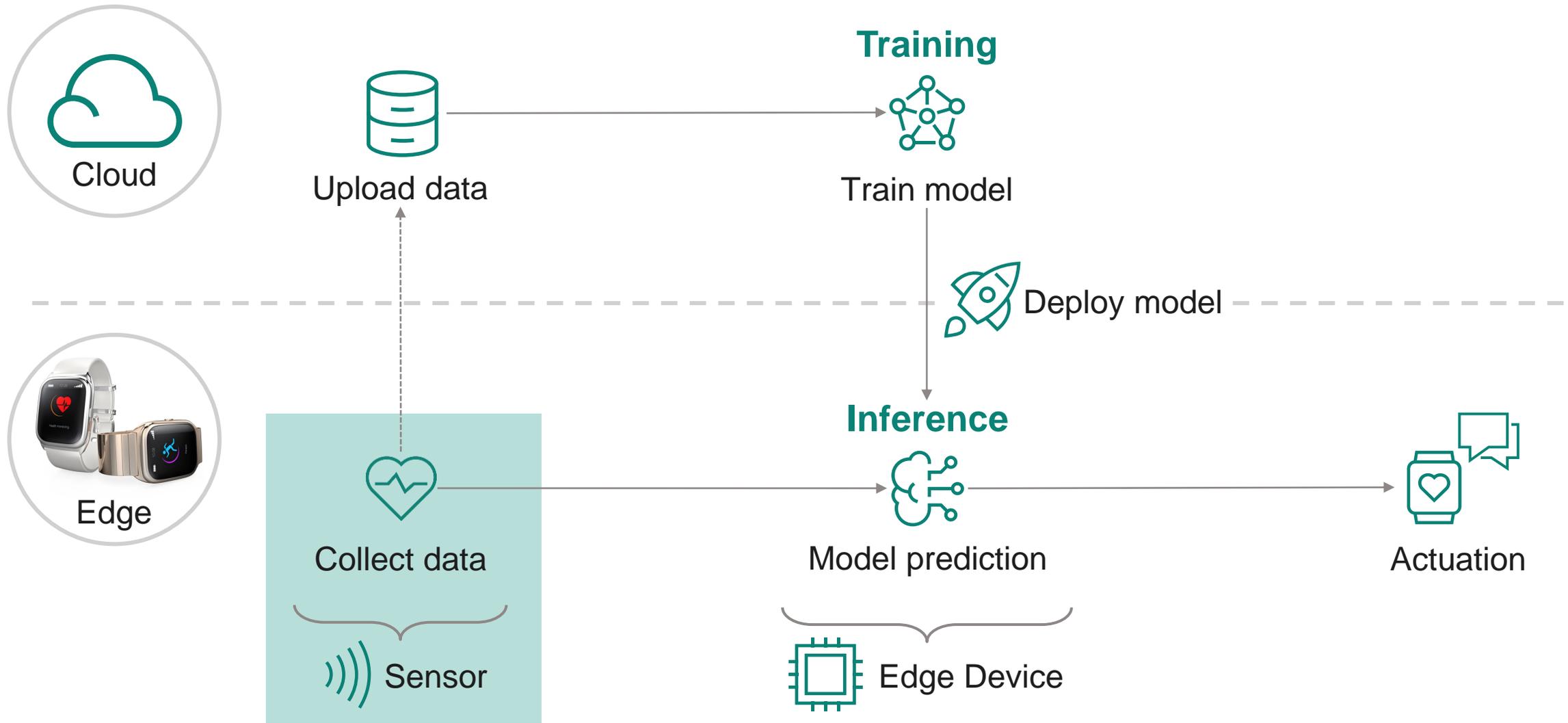
Total shipments of Tiny ML devices by vertical (millions)<sup>1</sup>

Source: ABI Artificial Intelligence and Machine Learning (Q1/2023);

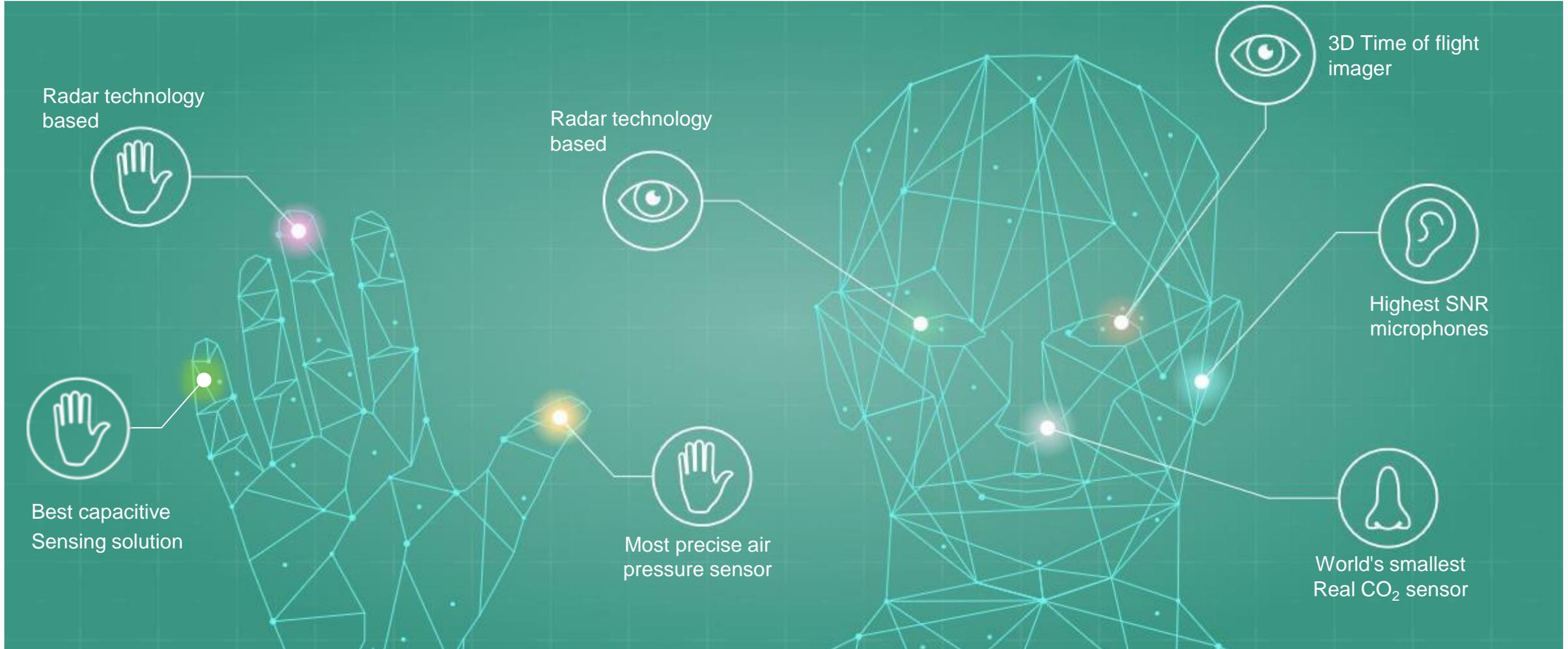
# AI at the Edge – Workflow



# AI at the Edge – Workflow

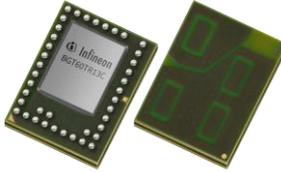
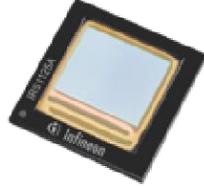
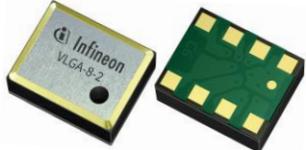


# Our intuitive sensors are enabling Edge AI – Giving things the human sense



# Infineon's XENSIV™ Sensors – Adding simulated human senses to digital systems to make our lives easier and better



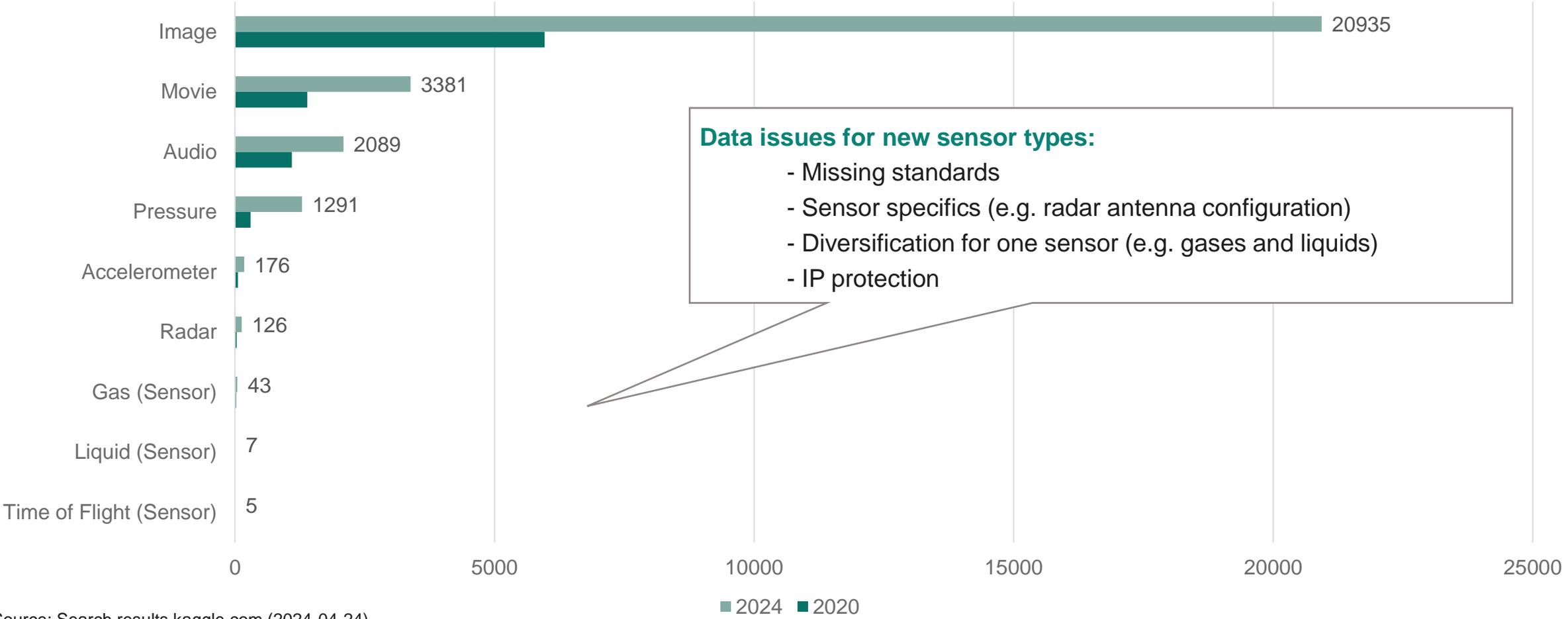
 Smart ears	 Smart eyes	 Smart feel	 Smart nose	
<b>Microphone</b> 	<b>mmW RADAR</b> 	<b>3D Time-of-Flight</b> 	<b>Pressure</b> 	<b>Environmental</b>  

**Sensor fusion – Combining multiple sensors to improve data quality and confidence**

Infineon XENSIV™ sensors are exceptionally precise thanks to industry-leading technologies. They are the perfect fit for various customer applications in automotive, industrial and consumer markets.

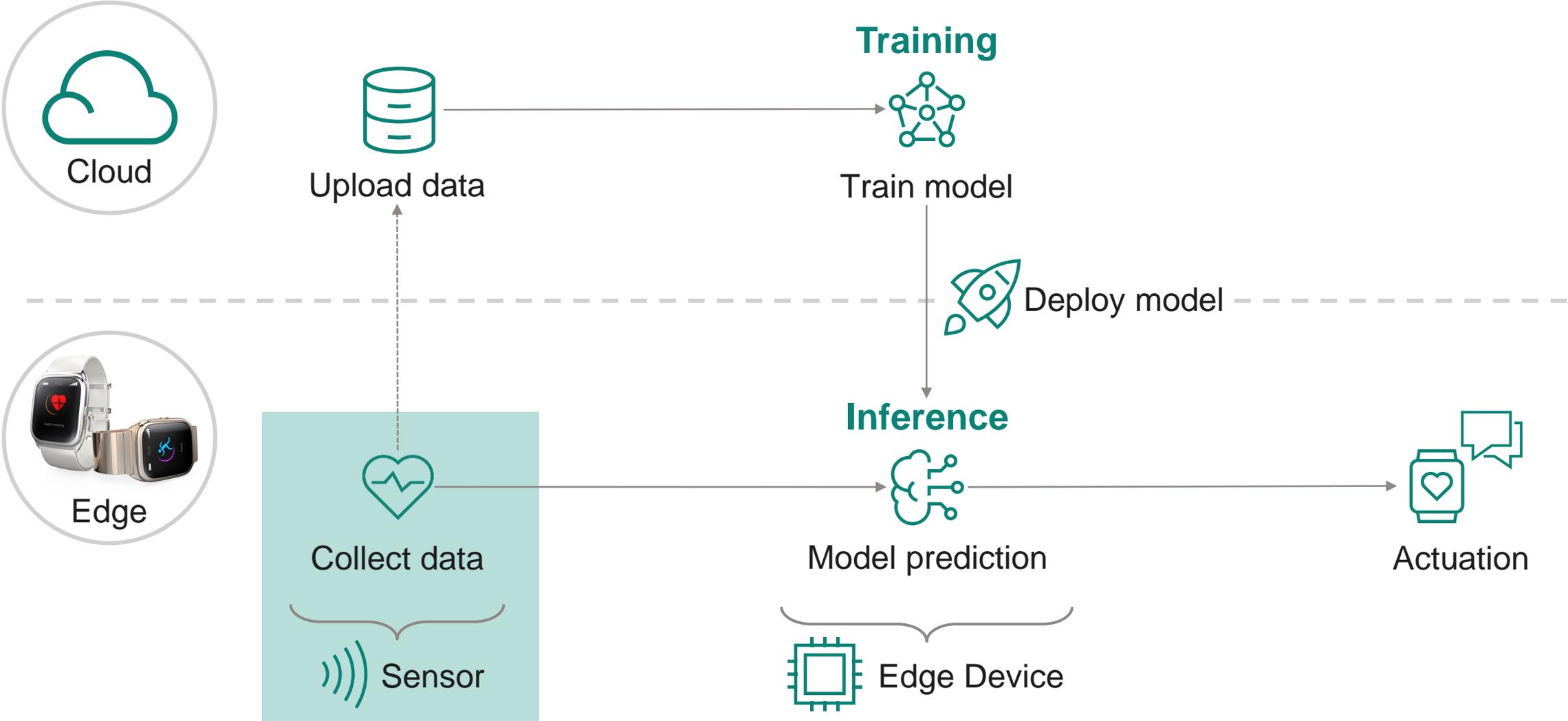
# Public data sets beyond audio and vision are sparsely available

Number of available datasets

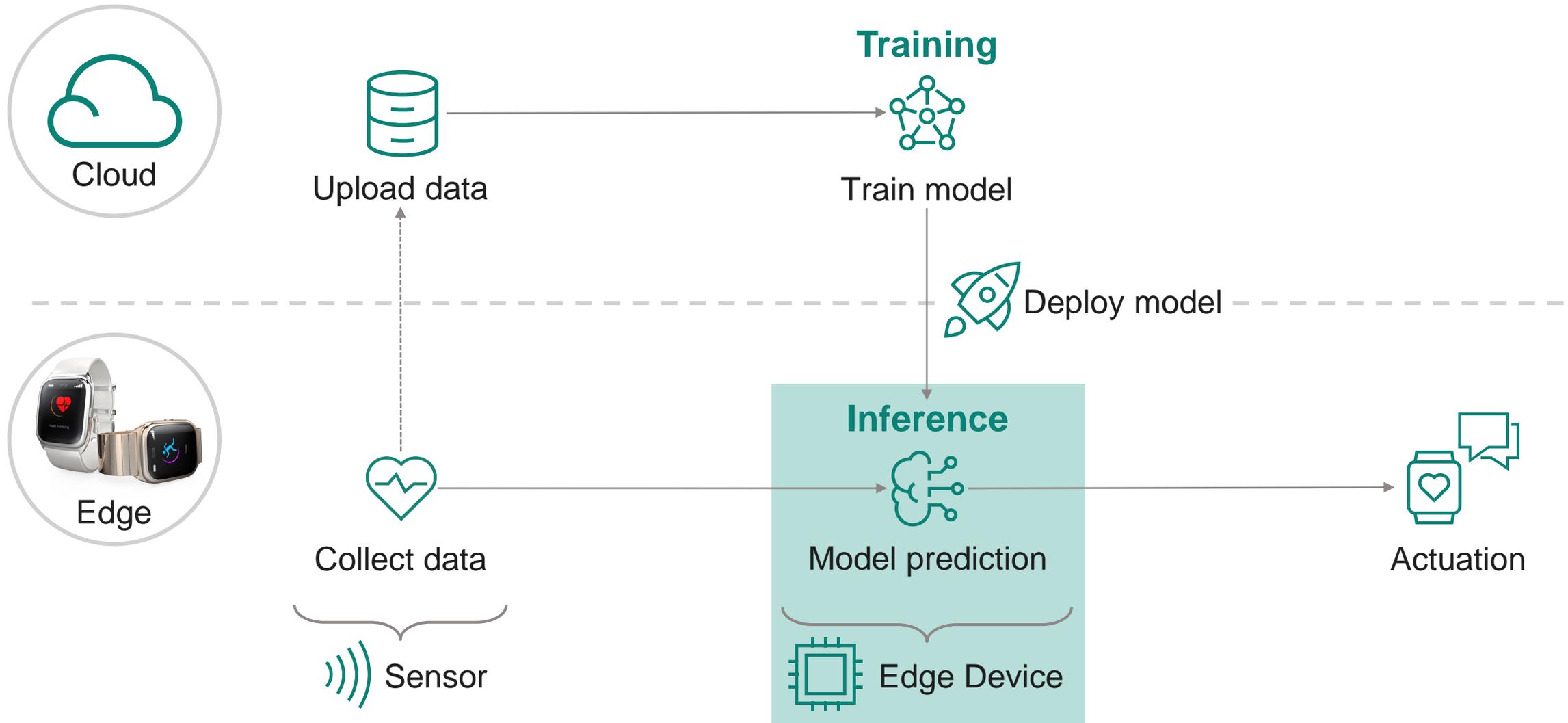


Source: Search results kaggle.com (2024-04-24)

# AI at the Edge – Workflow



# AI at the Edge – Workflow



# Ways to accelerate neural networks in silicon according to the respective field of application

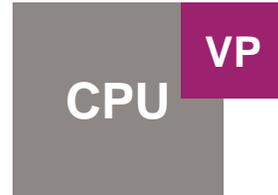
## CPU only

AI in software



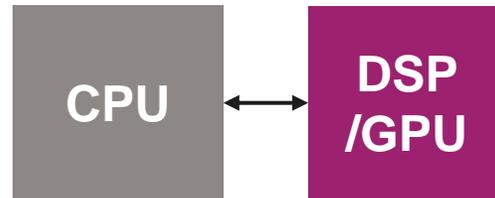
## CPU with extensions

Vector processing extensions



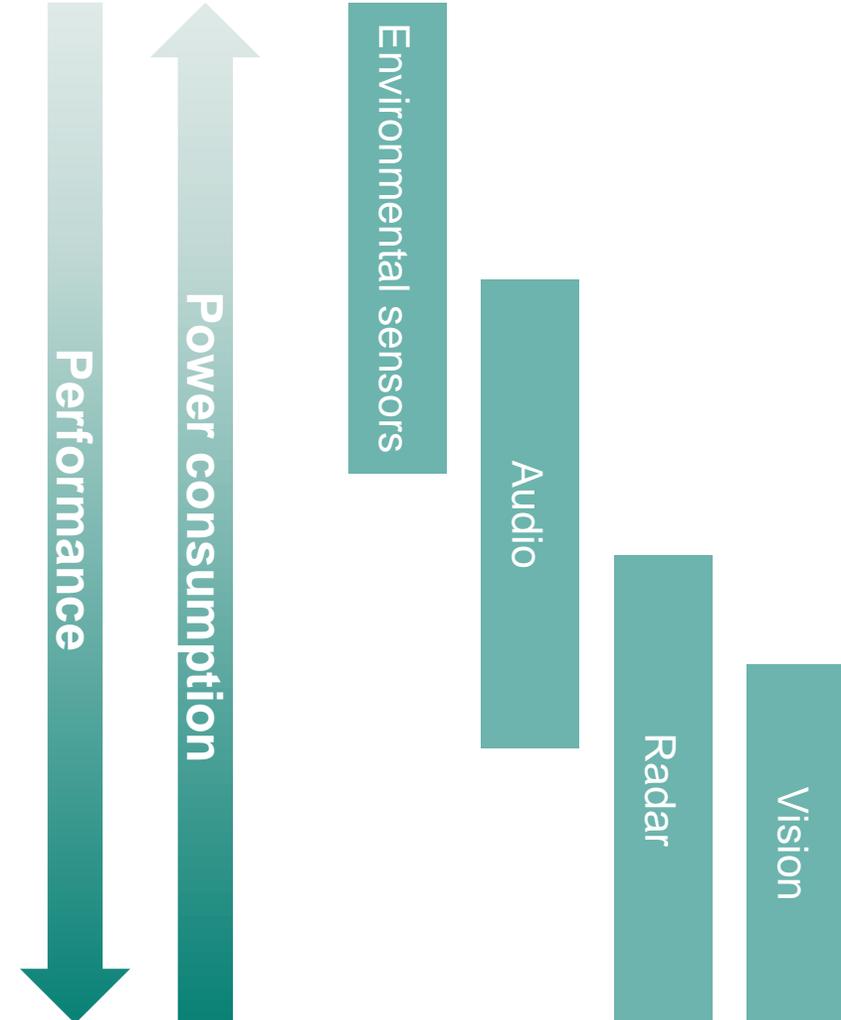
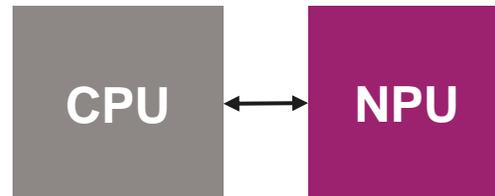
## CPU + DSP/GPU

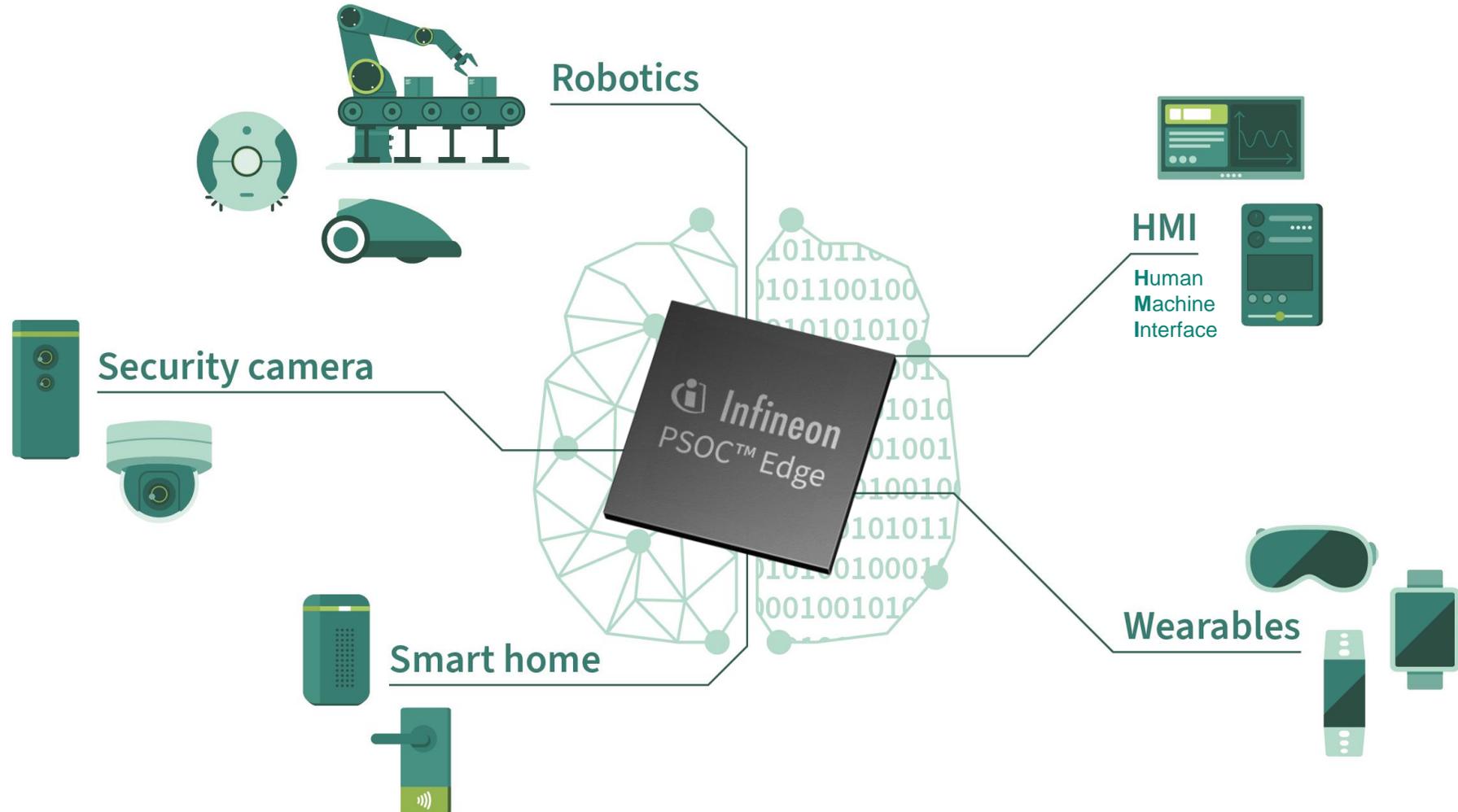
Digital Signal Processor  
Graphics Processing Unit

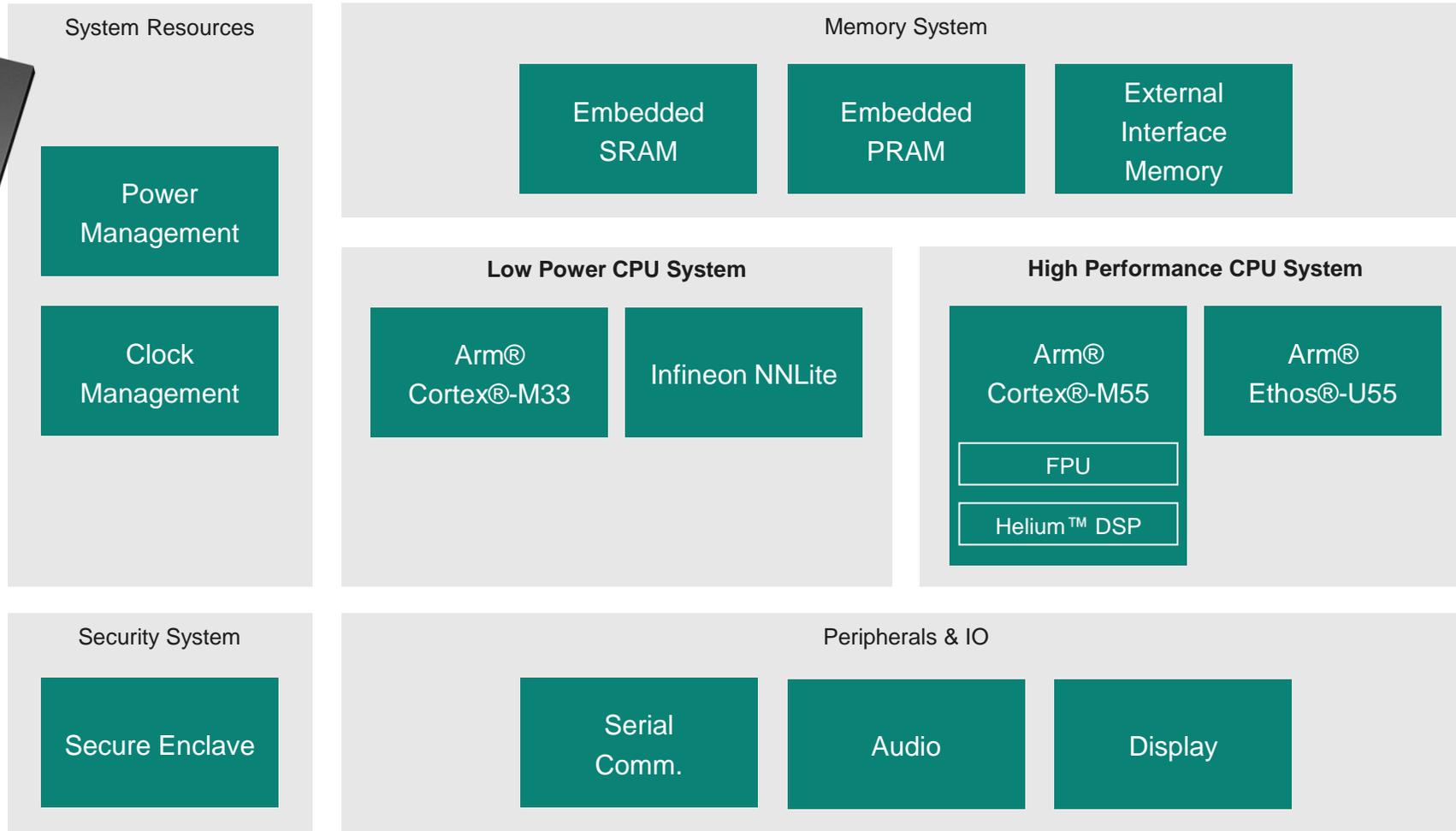


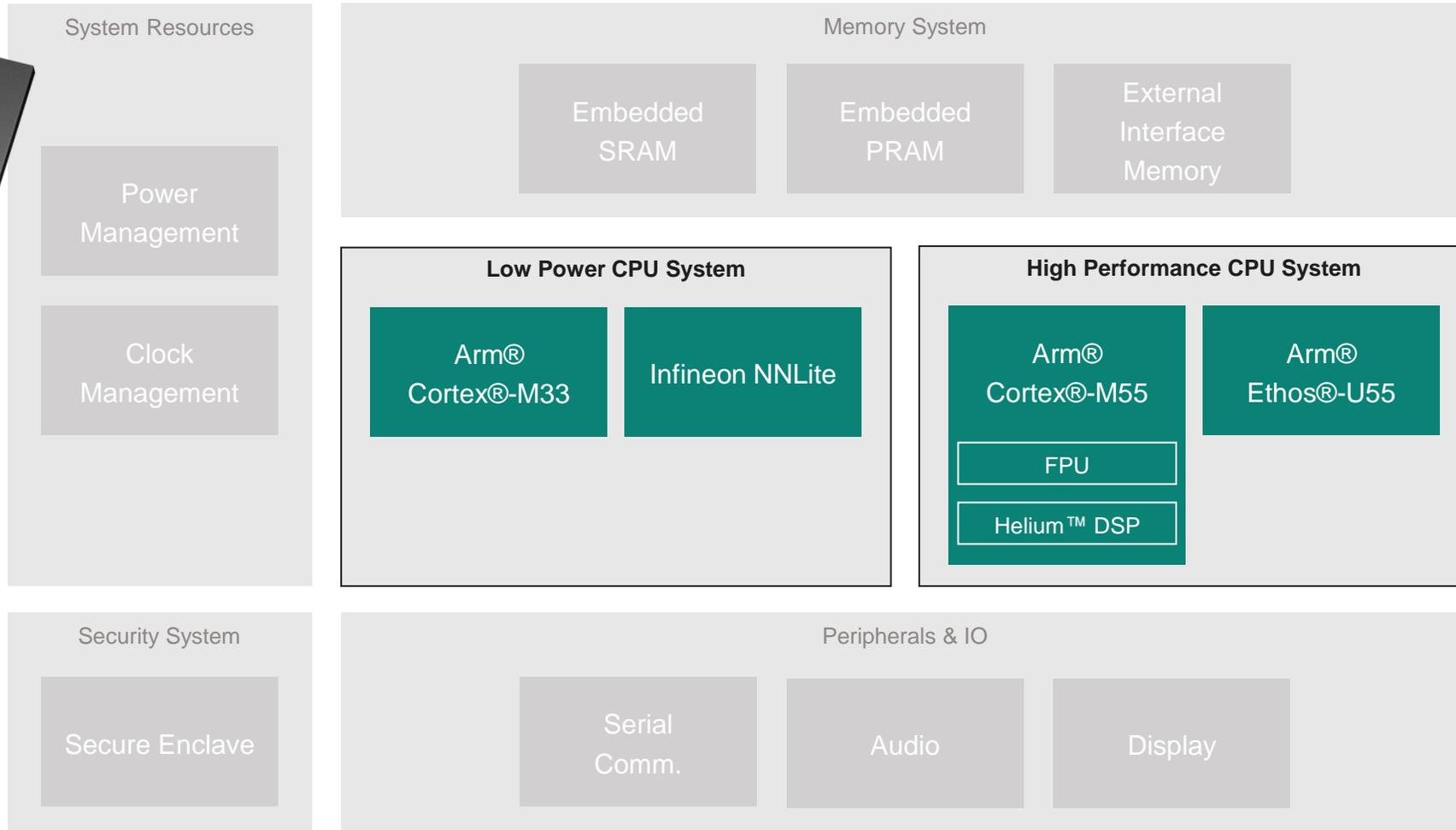
## CPU + NPU

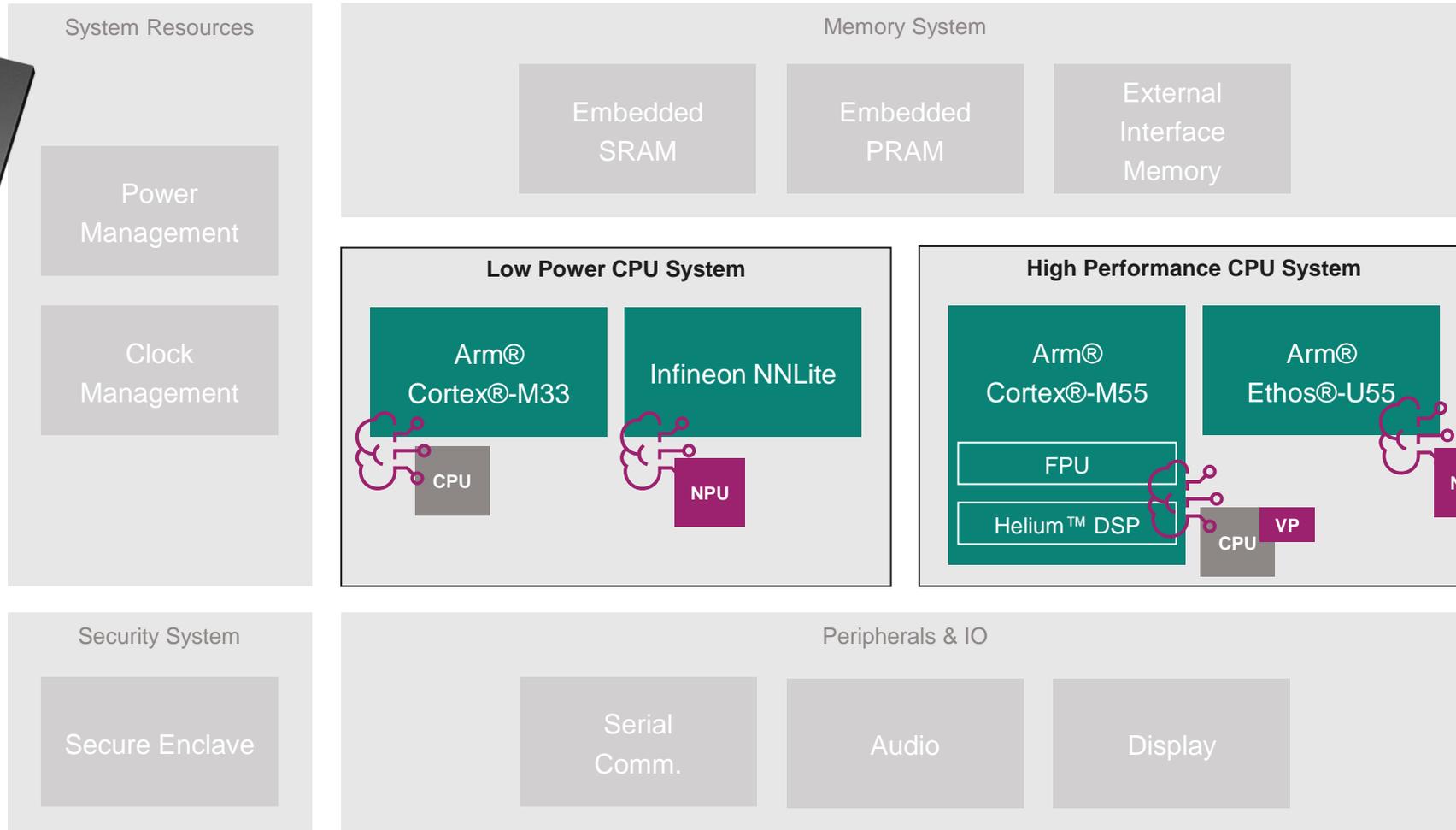
Specialized  
Neural Processing Unit



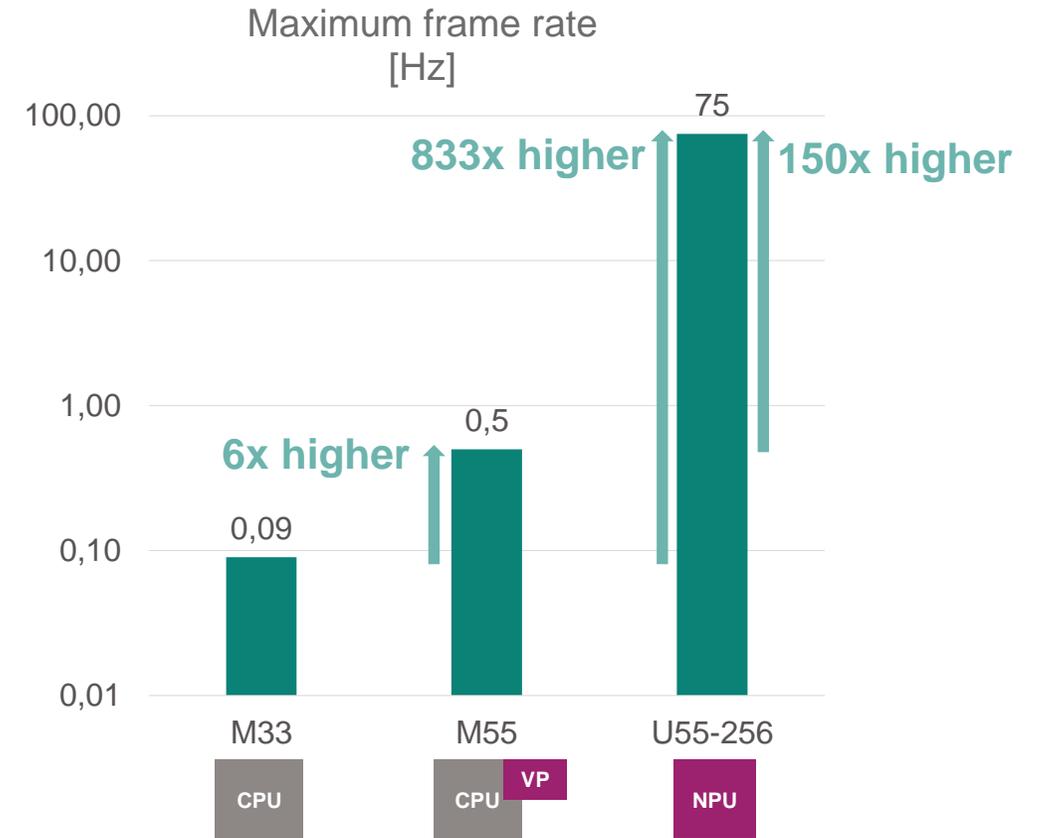
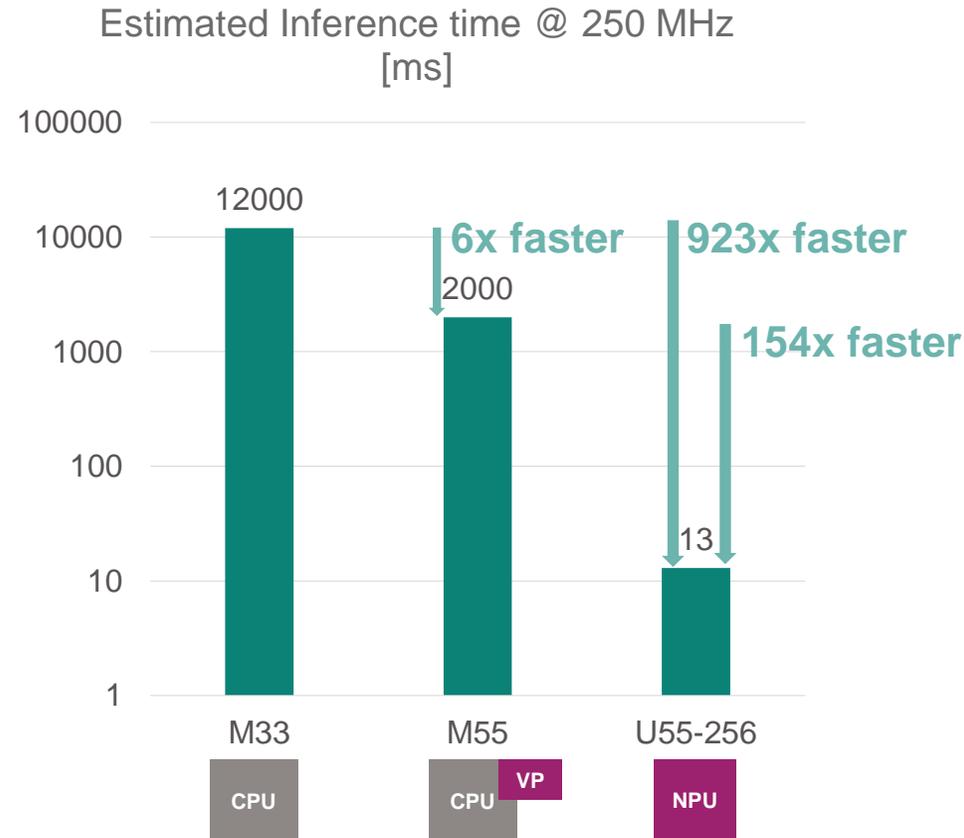








# Inference and frame rate benchmark of Arm Cortex-M33, -M55 and Ethos-U55 for MobileNet\_v1\_1.0\_224\_quant



Data obtained by Infineon

# Memory and storage benchmark of PSoC Edge, Apple A13 Bionic and Nvidia V100 for ResNet-50 and MobileNetV2



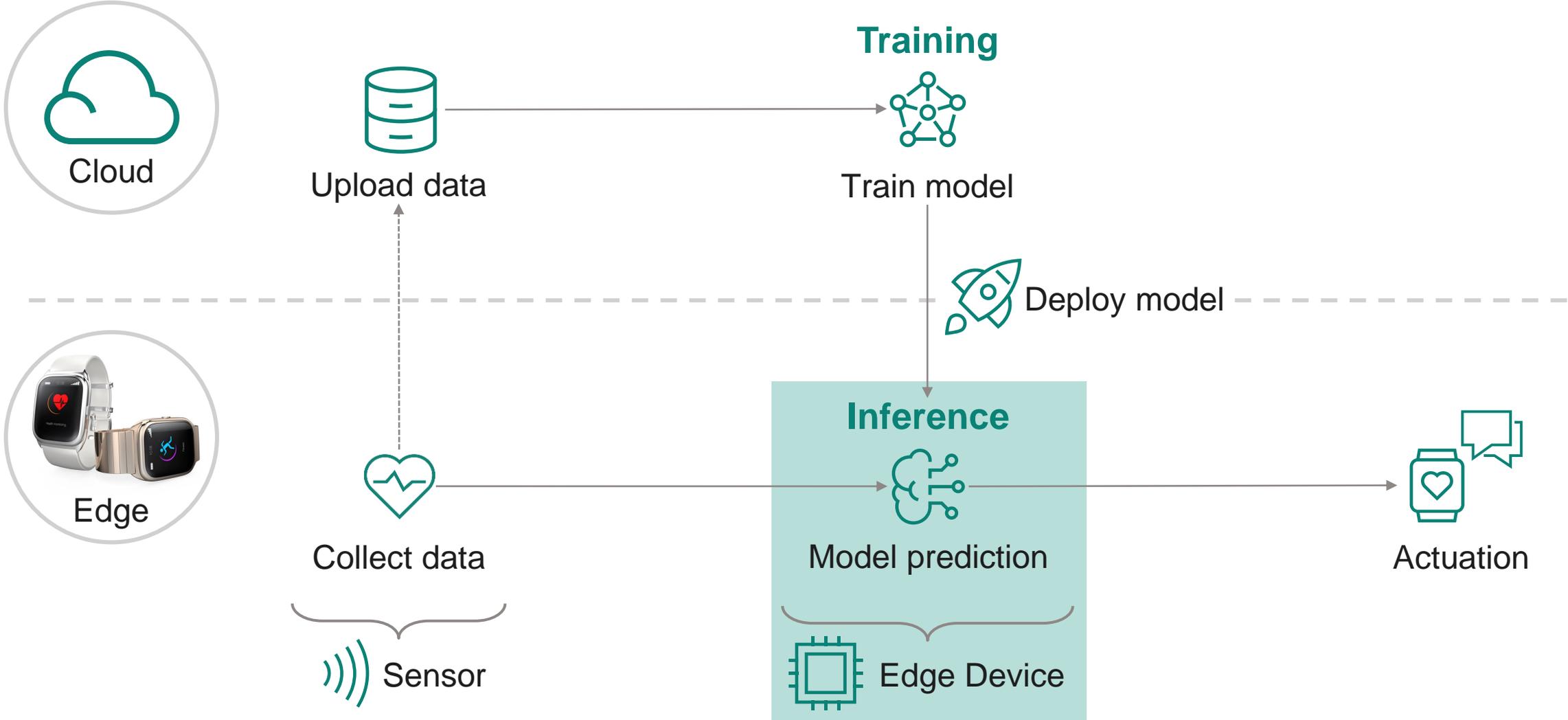
	<b>Cloud AI</b> (Nvidia V100)	<b>Mobile AI</b> (A13 Bionic)	<b>Tiny ML</b> (PSoC Edge)
Memory (RAM)	16 GB	4GB	<5 MB*
Storage (SSD/Flash)	TB~PB	>64 GB	A few MB*

	<b>ResNet-50</b> (float32)	<b>MobileNetV2</b> (float32)	<b>MobileNetV2</b> (int8)
Memory (RAM)	7.2 MB	6.8 MB	1.7 MB
Storage (SSD/Flash)	102 MB	13.6 MB	3.4 MB

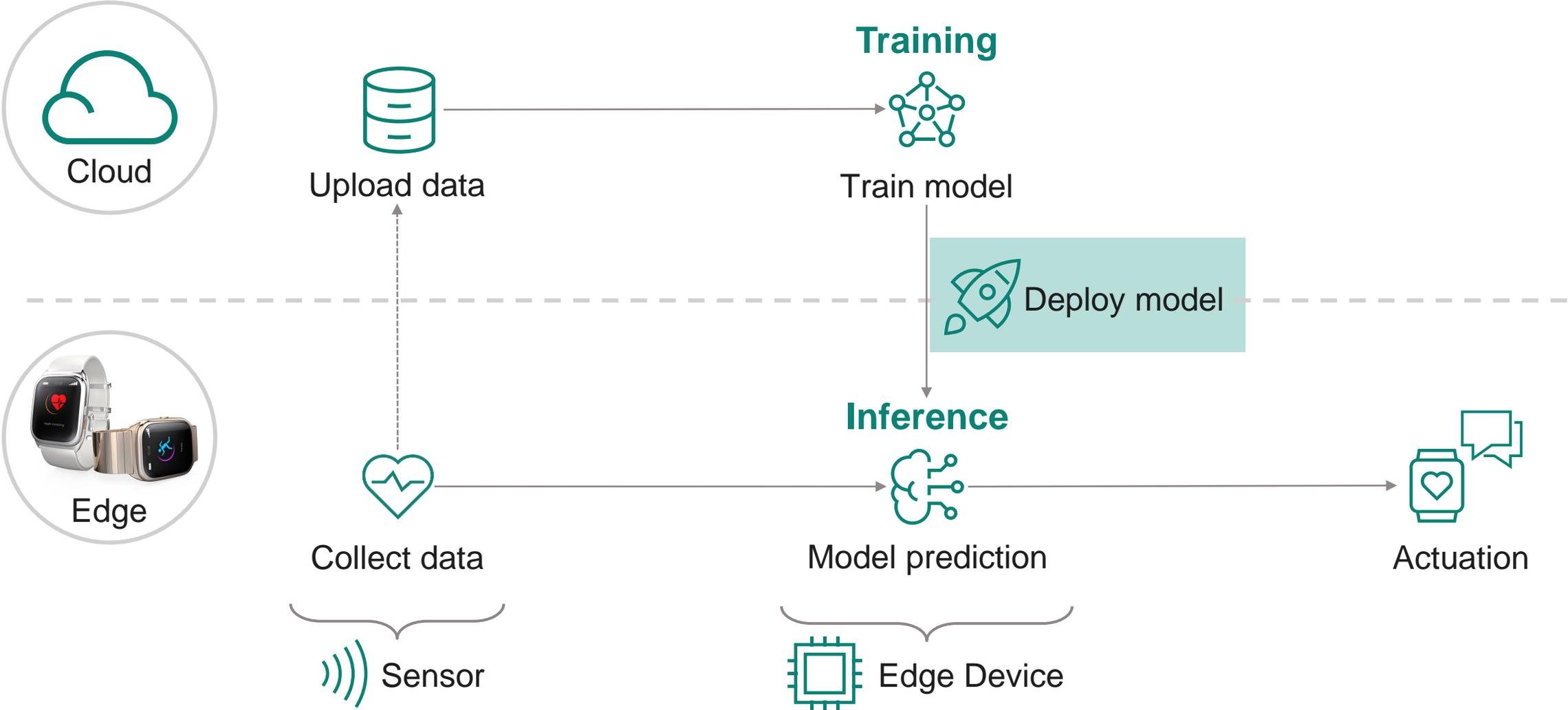
Source: J. Lin, L. Zhu, W. -M. Chen, W. -C. Wang and S. Han, "Tiny Machine Learning: Progress and Futures [Feature]," in IEEE Circuits and Systems Magazine, vol. 23, no. 3, pp. 8-34, thirdquarter 2023, doi: 10.1109/MCAS.2023.3302182

\* Data added by Infineon

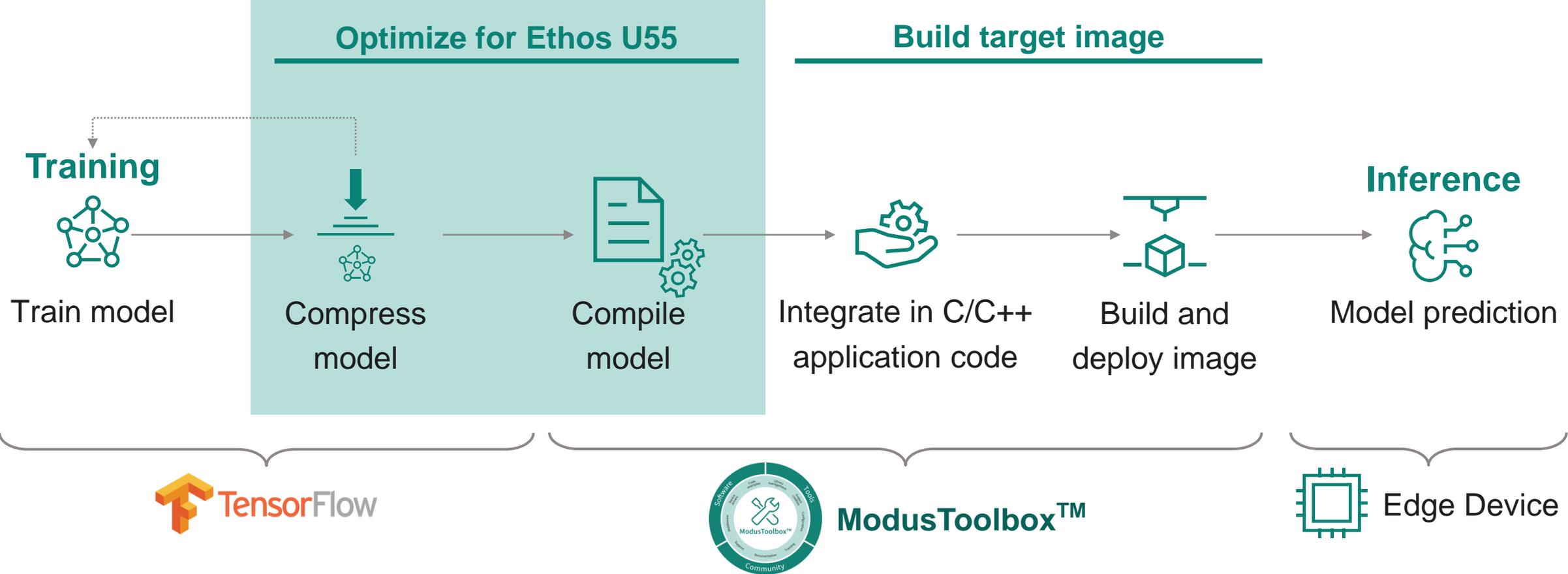
# AI at the Edge – Workflow



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# End-to-end model deployment flow with Ethos-U55



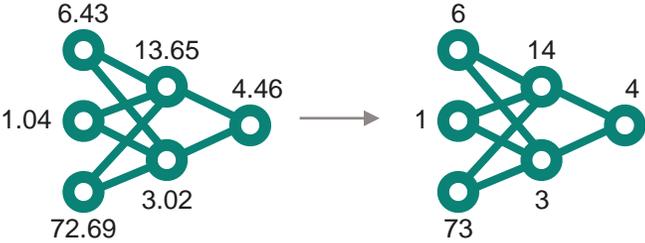
# Model optimization: Two common compression techniques



Applied during or after training phase



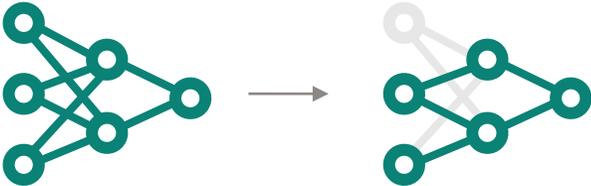
**Goal:** Reduce the size of the model



**Quantization:**  
Floating point to 8-bit  
Integer conversion

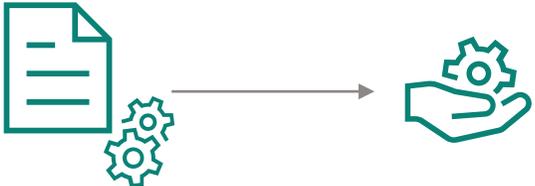
**„Costs of Compression“:**  
Decreased model size leads to...

- ...decreased memory size
- ...decreased inference time
- ...decreased power consumption
- ...decreased accuracy



**Pruning:**  
Remove unnecessary  
weights and nodes

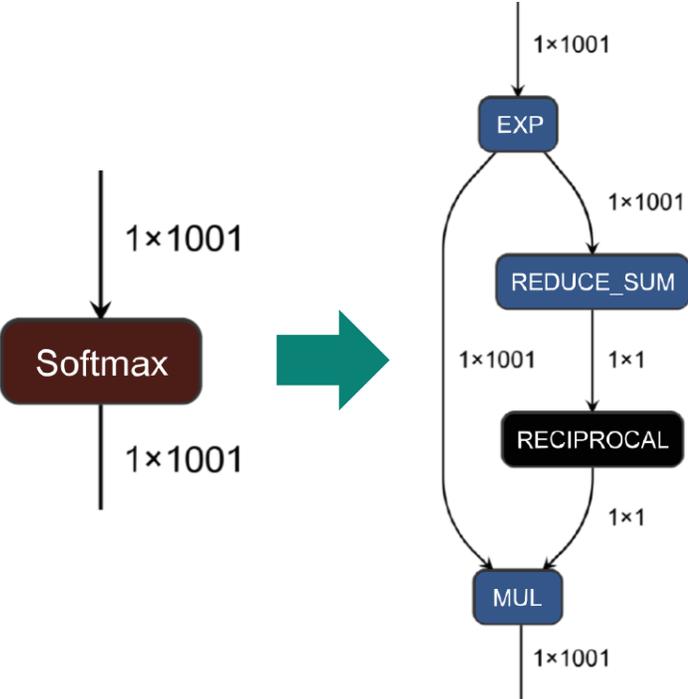
# Model optimization: Model compiler



Applied after training phase on compressed model



**Goal:** Convert the model into machine readable code



### Graph level optimization:

A set of graph-level operators for model layer fusion and mapping

### Tensor level optimization:

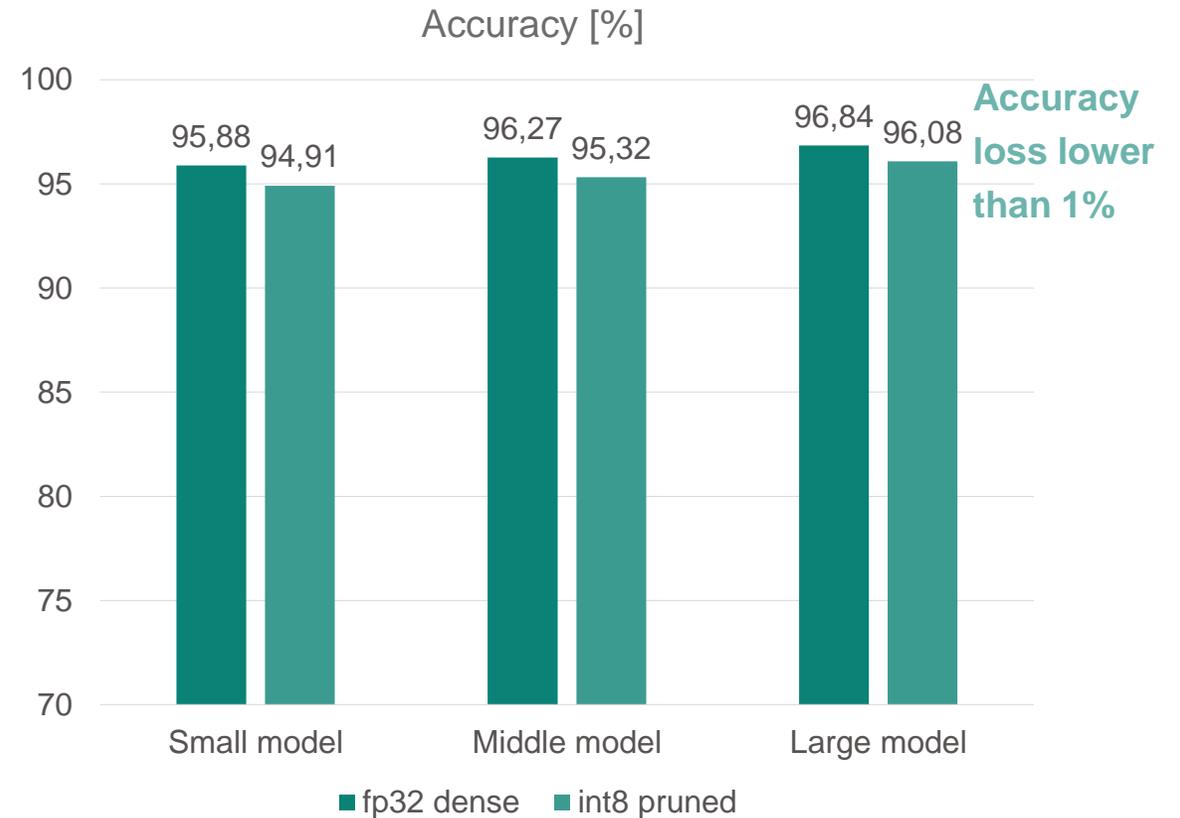
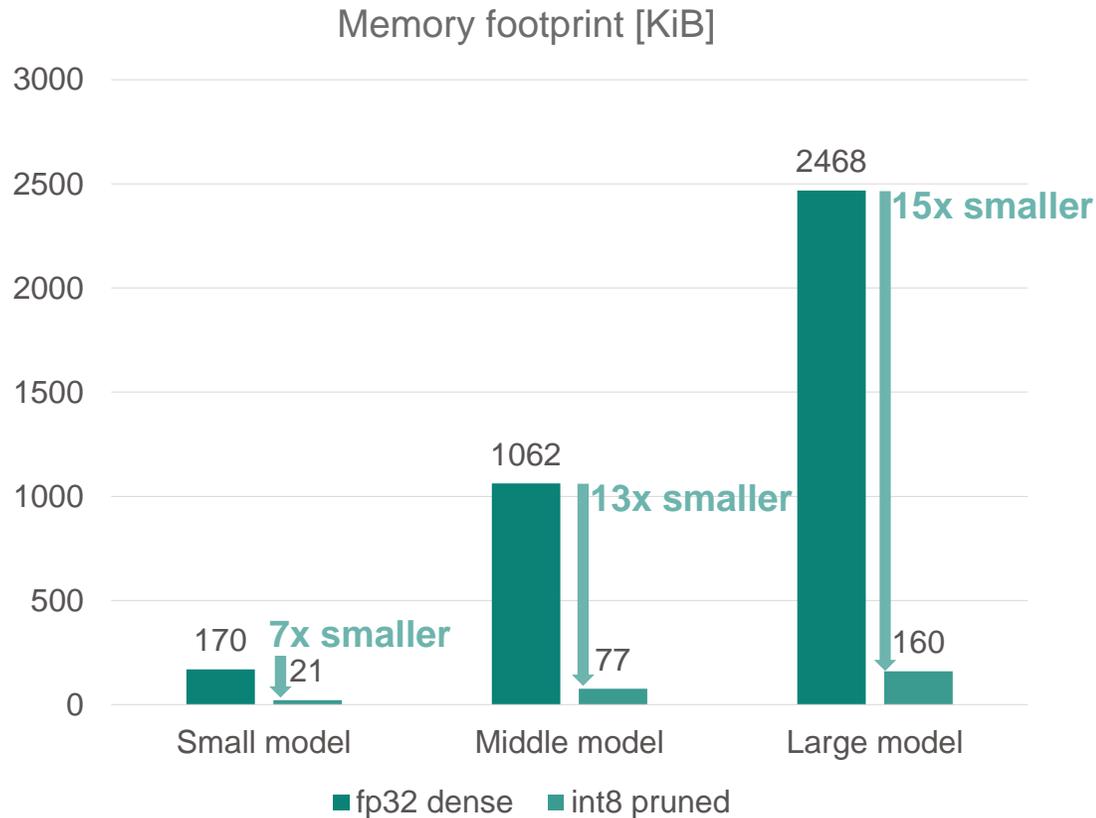
A set of tensor-level operators for loop unrolling, vectorization, parallelization...

### „Costs of model compilers“:

- Hardware dependence: The choice of compiler depends on the hardware
- Compiler support: Layer fusion and mapping not supported for all types of layers

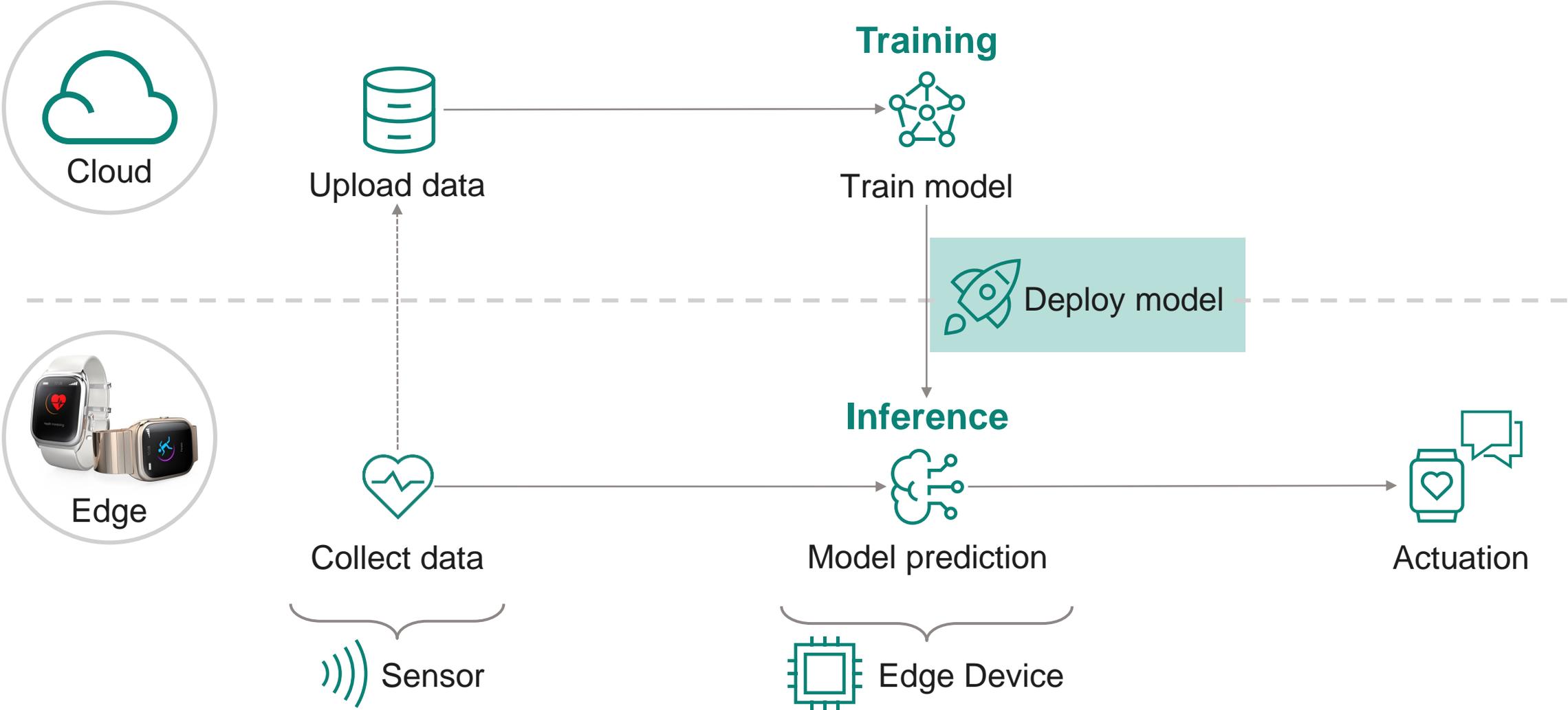
# Memory and accuracy benchmark for dense and compressed (quantized and pruned) keyword spotting models

Dataset: Google speech commands

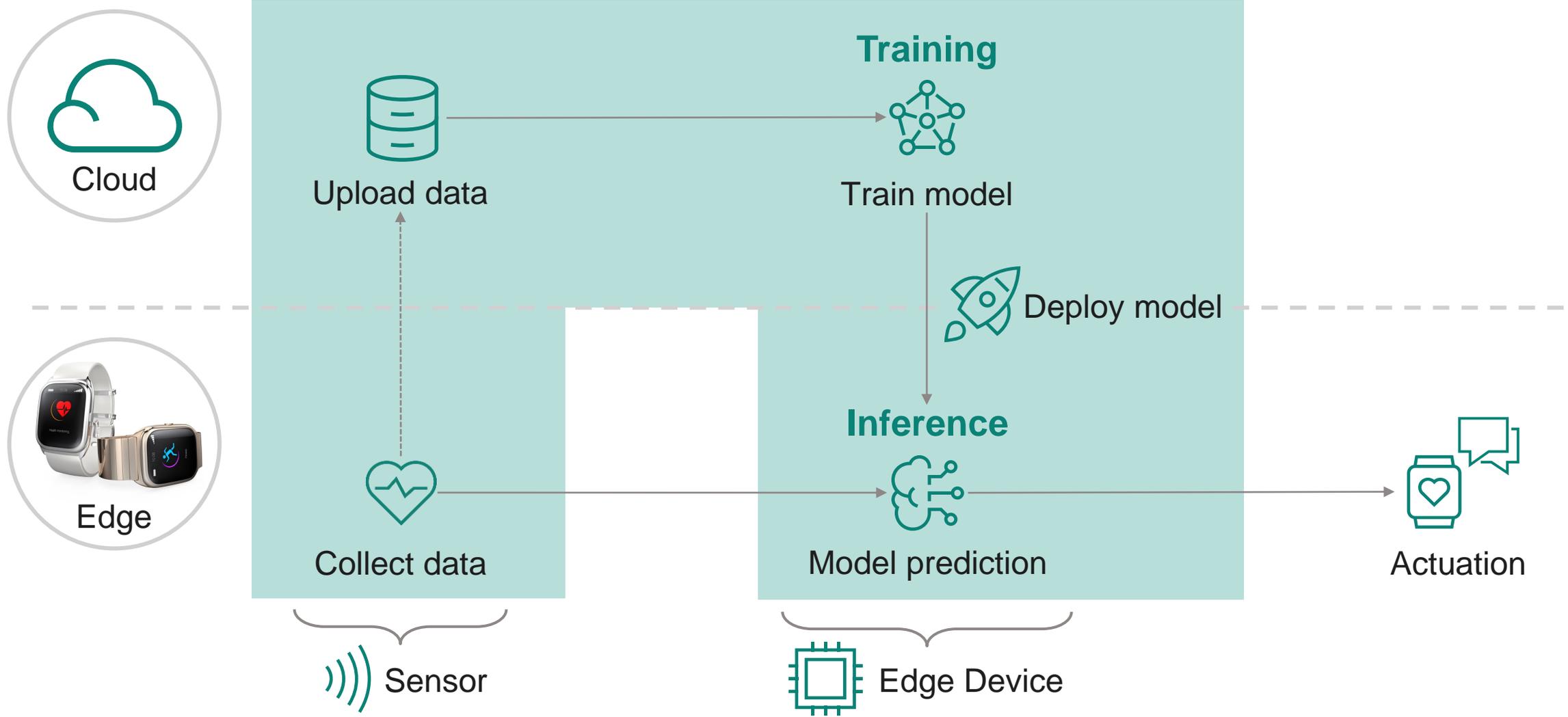


Source: E. Trommer, B. Waschneck and A. Kumar, "dCSR: A Memory-Efficient Sparse Matrix Representation for Parallel Neural Network Inference," 2021 IEEE/ACM International Conference On Computer Aided Design (ICCAD), Munich, Germany, 2021, pp. 1-9, doi: 10.1109/ICCAD51958.2021.9643506.

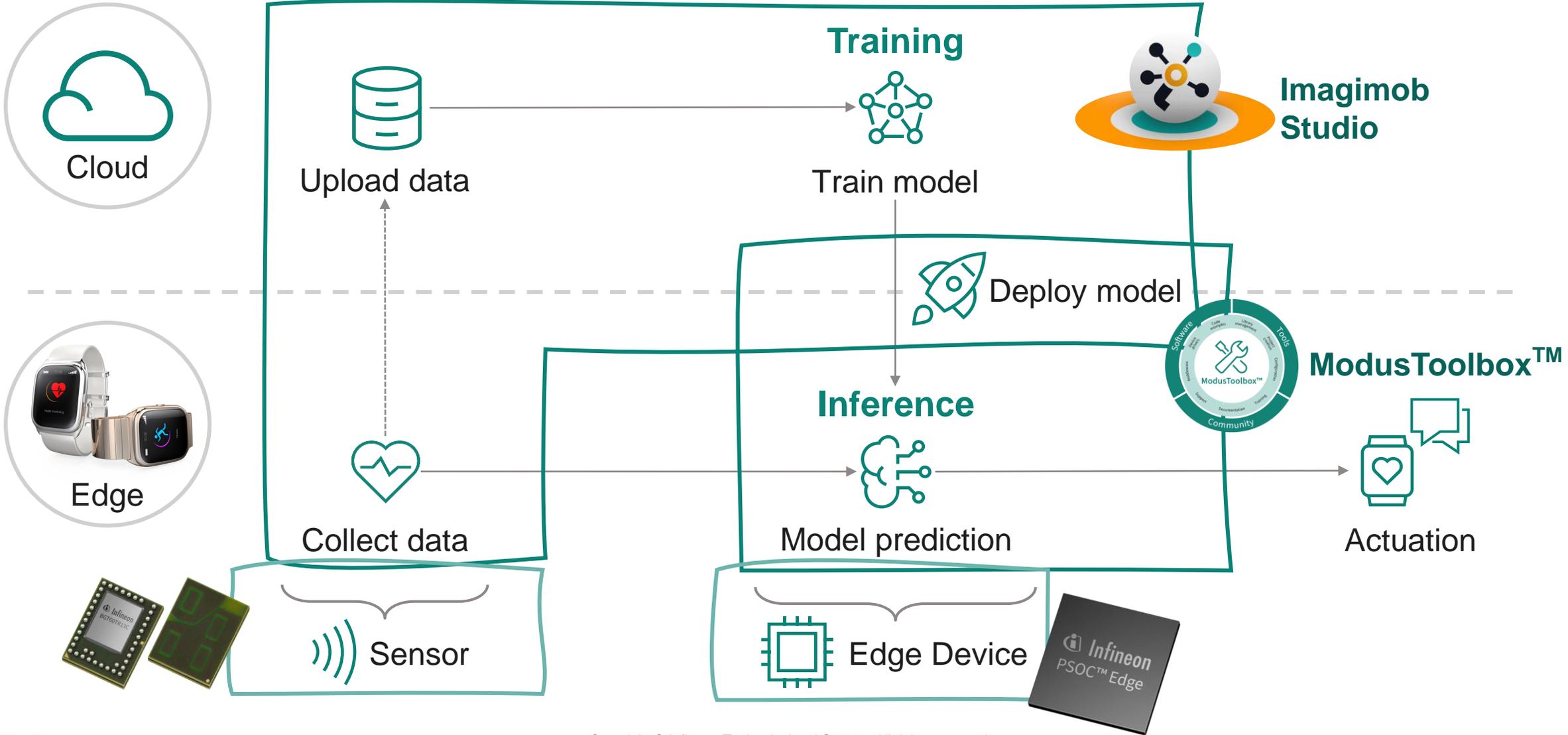
# AI at the Edge – Workflow



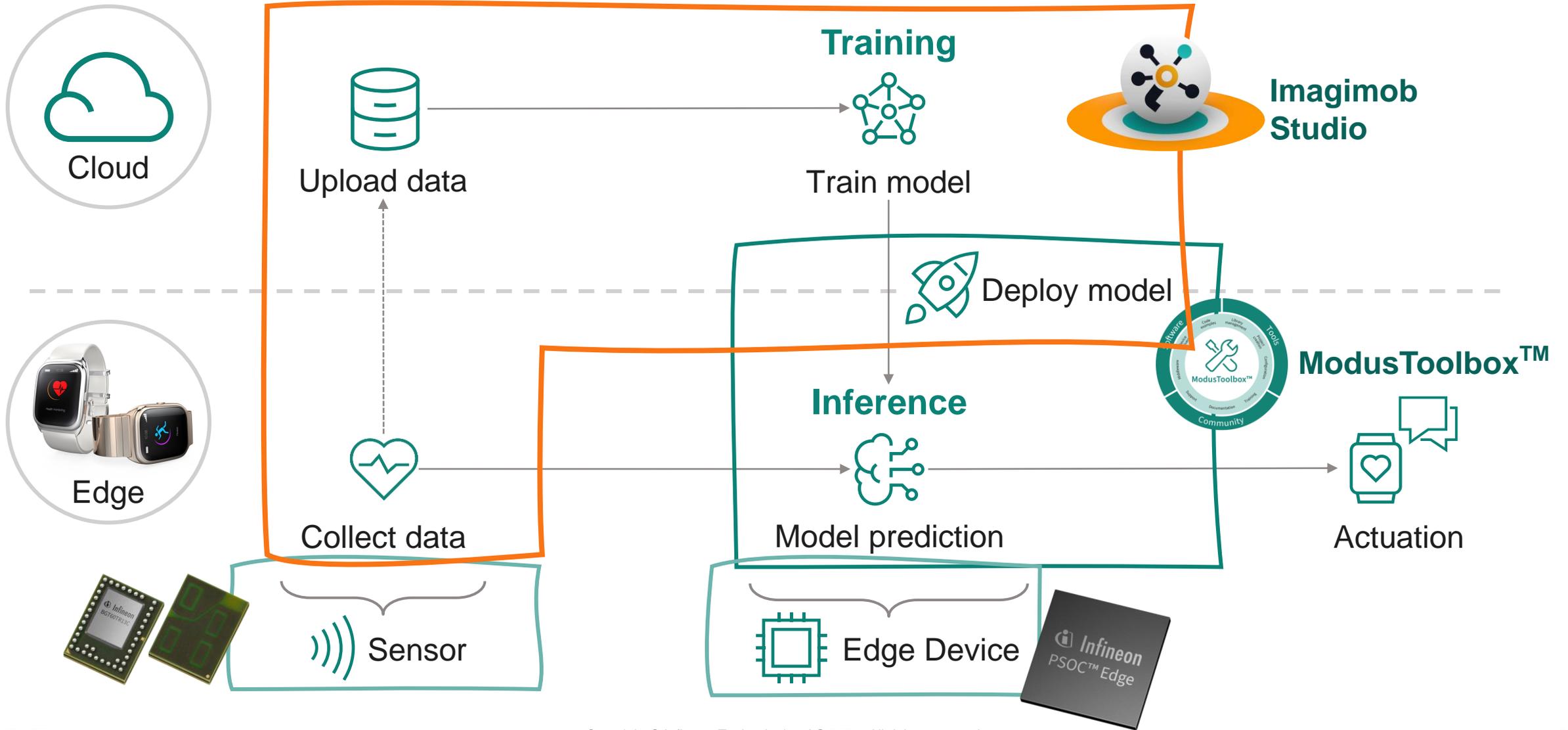
# AI at the Edge – Workflow



# AI at the Edge – Infineon Offering for Consumer IoT



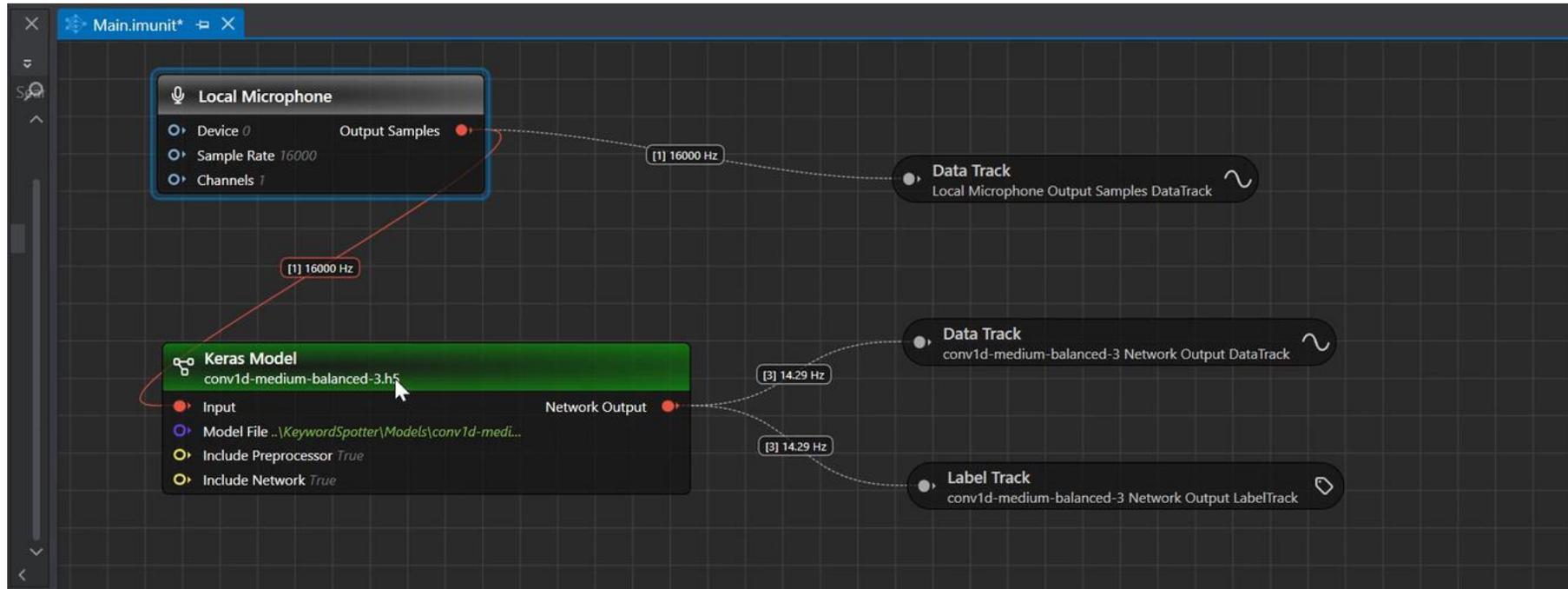
# AI at the Edge – Infineon HW/SW Solution for Consumer IoT



# Introduction to Imagimob (Videolink for external)

[https://e.video-cdn.net/share?video-id=FW5JRqijjDXxSe\\_VCwGcbZ&player-id=2t2W2ykrDB\\_RisZ1QorEJU&channel-id=101646](https://e.video-cdn.net/share?video-id=FW5JRqijjDXxSe_VCwGcbZ&player-id=2t2W2ykrDB_RisZ1QorEJU&channel-id=101646)

# Imagimob Studio – Graph UX is an intuitive interface to visualize the end-to-end machine learning workflow as graphs



# Ready for the edge: Our offering of production quality, ready to deploy ML models lets you easily add new features to your device



The fastest way of taking edge AI to market: Ready to go, fully trained, and comprehensively tested machine learning model that are ready for production.



Coughing Detection

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Snoring Detection

Baby Cry Detection

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- ✓ Fully trained and tested models
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- ✓ Easy to integrate, ready to commercialize

Find out more or get your model: <https://www.imagimob.com/ready-models>



## Key Take-aways



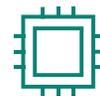
Edge AI enables the creation of completely new applications



Several advantages over Cloud AI, e.g. low latency and power efficiency



Biggest challenge for models: memory-efficiency while maintaining high accuracy



New generation of microcontrollers are optimized for Edge AI applications

# Questions & answers



