

The Rise of Neuromorphic Sensing and Computing: Technology Innovations, Ecosystem Evolutions and Market Trends

Edge AI and Vision Alliance Webinar

11 July 2024

Adrien Sanchez, Florian Domengie - Yole Group

adrien.sanchez@yolegroup.com

florian.domengie@yolegroup.com



YOLE GROUP

We provide industrial companies, financial investors and R&D organizations, with market research and marketing analysis, technology, supply chain and cost analysis, as well as performance evaluation, to help our customers in their decision-making about their future business and manufacturing strategy in the semiconductor, photonic and electronic sectors.

3 CORE ACTIVITIES BASED ON DEEP SYNERGIES

Market & Technology

- Market, technology, and strategy consulting
- M&A, Due Diligence and evaluation of companies

Teardown Reverse engineering and costing

- Technology, process & cost analysis
- Teardown and reverse engineering
- Comparative analysis

Performance analysis

- Test of electric and electro-optical performance of devices
- Comparison of performances and related technical choice

— OUR EXPERTISE —

SEMICONDUCTOR INDUSTRY

- | | |
|---|---|
| <ul style="list-style-type: none">• Imaging | <ul style="list-style-type: none">• Memory |
| <ul style="list-style-type: none">• Battery | <ul style="list-style-type: none">• Photonics and Lighting |
| <ul style="list-style-type: none">• Display | <ul style="list-style-type: none">• Power Electronics |
| <ul style="list-style-type: none">• Electronic Systems | <ul style="list-style-type: none">• Radio Frequency |
| <ul style="list-style-type: none">• Computing and Software | <ul style="list-style-type: none">• Semiconductor Equipment |
| <ul style="list-style-type: none">• Compound Semiconductor | <ul style="list-style-type: none">• Semiconductor Packaging |
| <ul style="list-style-type: none">• Global Semiconductor Trends | <ul style="list-style-type: none">• Sensing and Actuating |



COMPUTING AND SENSING EMERGING TECHNOLOGIES

The three emerging technologies analyzed by Yole Group

In 2024, Yole Group will address the three primary emerging new computing methods, with each approach featured in a separate report.

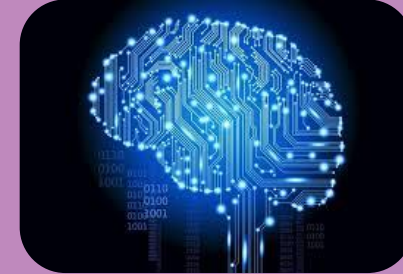
Today Webinar



Quantum Technologies
2024



Optical Computing 2024



Neuromorphic Computing,
Memory and Sensing 2024

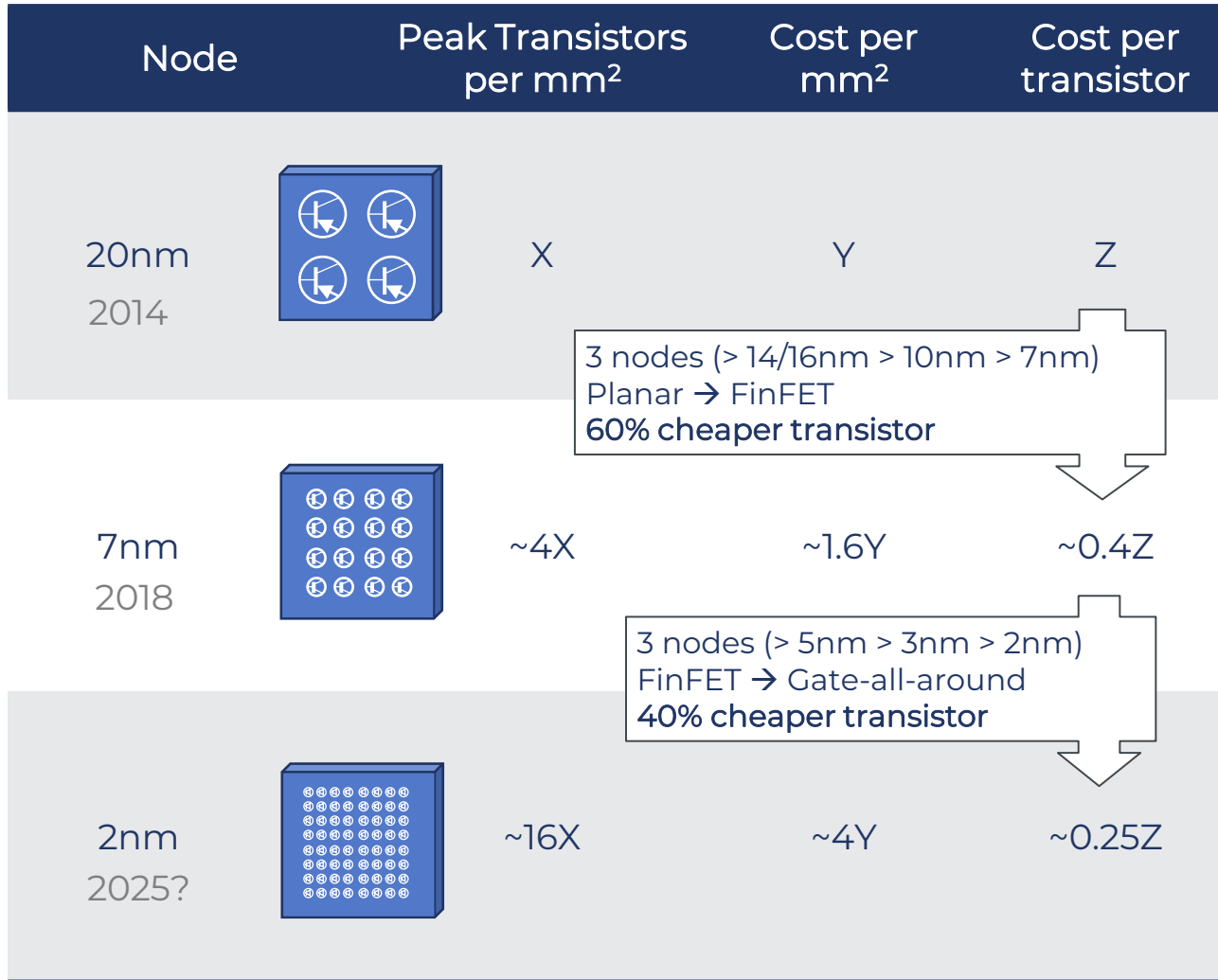


NEUROMORPHIC PRINCIPLES

CONTEXT

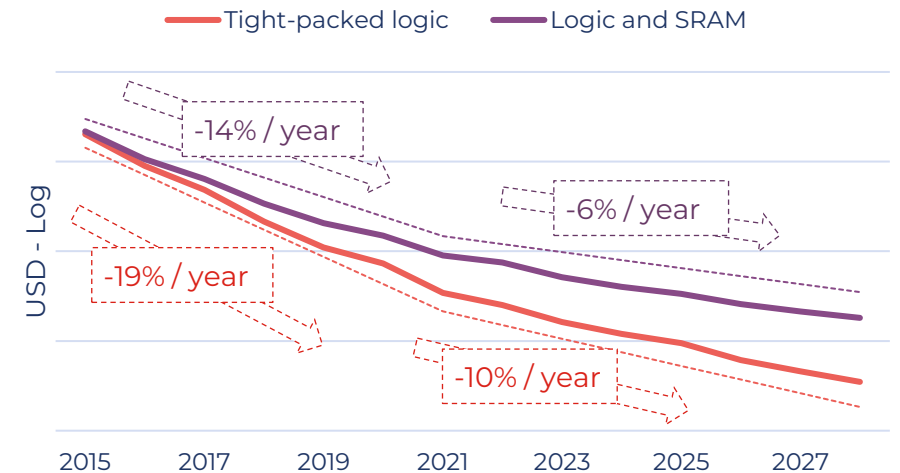


Transistors are getting smaller, but are they still getting cheaper?



- The advancement toward more densely packed logic has come with ever-increasing manufacturing complexity and cost.
- Processors are not built purely from logic cells, and the cost scaling for these non-logic building blocks moves even slower.
- From about 2021, we see an inflection in this cost curve from the even higher costs of 5nm and 3nm nodes

Leading Edge Cost per Transistor



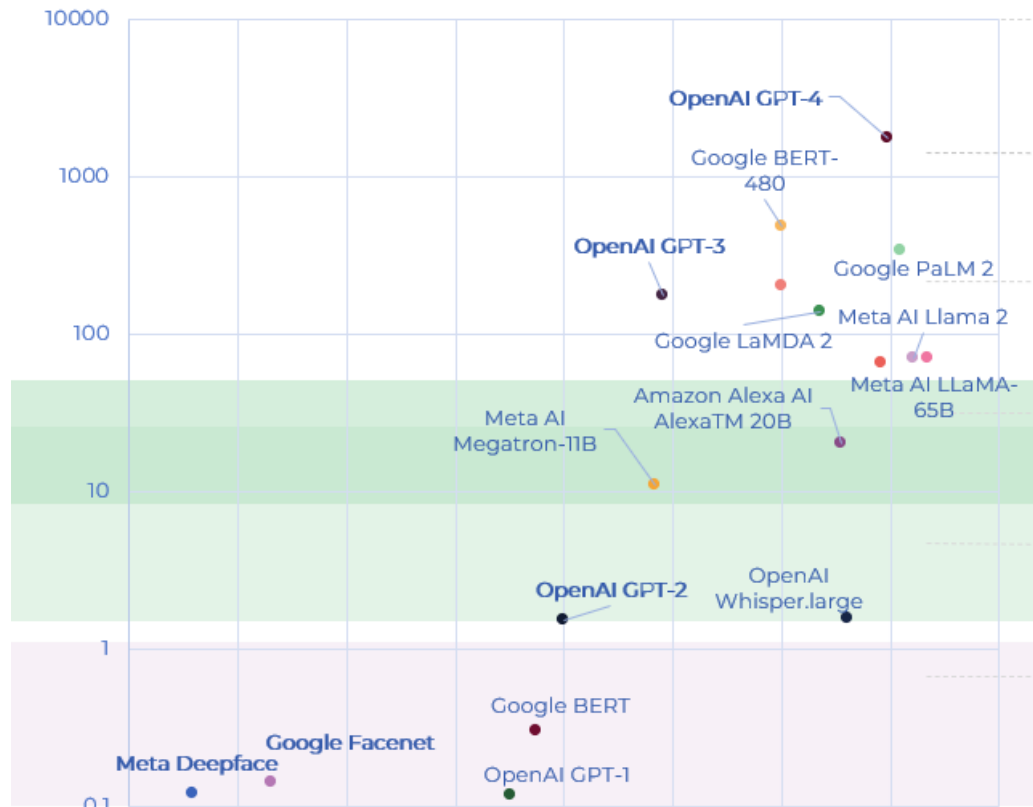
CONTEXT



The emergence of LLM and AI models: bigger models more and more used

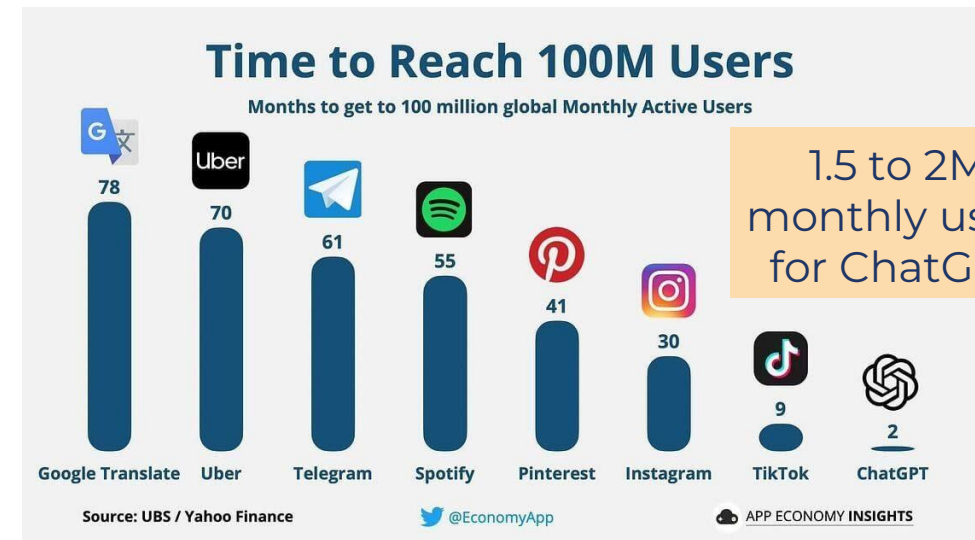
Bigger and bigger DNNs are being used, especially for Natural Language Processing applications. Transformers are one of the models used explicitly for NLP; the network can be massive with billions of parameters, and the training requires ever-increasing computing resources.

AI Models size evolution (in Billion parameters)



LLM and generative AI models are becoming very popular. This massive growth in AI usage is new, and the direct consequence is that associated inferences require more and more computing resources.

The success of Chat-GPT





THE BRAIN AS A MODEL

Improve performance, reduce consumption

The brain is capable of far more than the classic AI architecture.



100 billion neurons
X
~10,000 synapses
=
1 quadrillion synapses

Brain simulation by traditional computing hardware



1.5 million processors
+
1.6 petabytes of high-speed memory



2L volume



~20W
480Wh in one day

1 ExaFLOP of performance
1 billion calculations/second



2 buildings



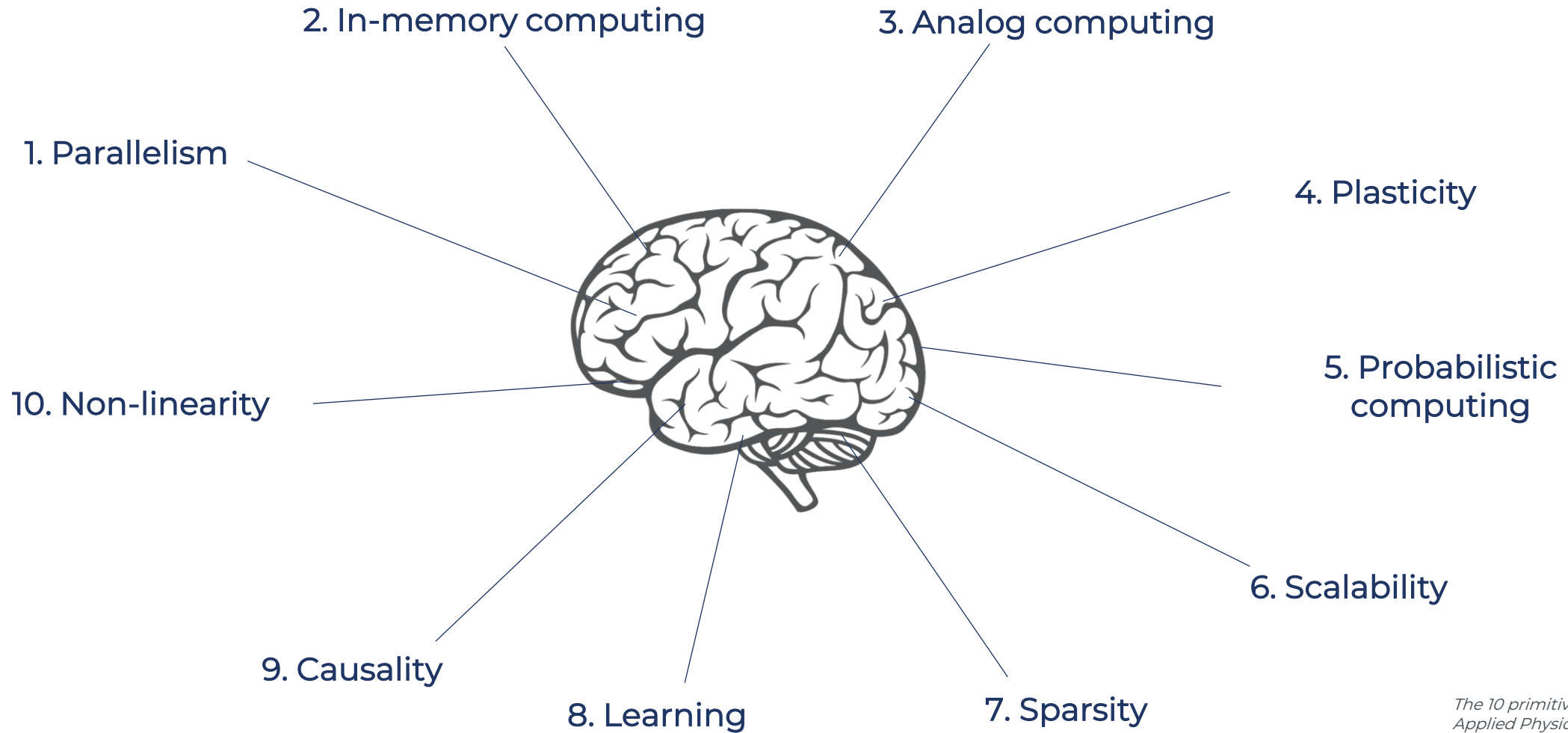
~10MW
240MWh in one day
~ 100GWh in 1 year

Needs years to simulate one day of brain activity



THE BRAIN AS A MODEL

The 10 primitives of a neuromorphic computer



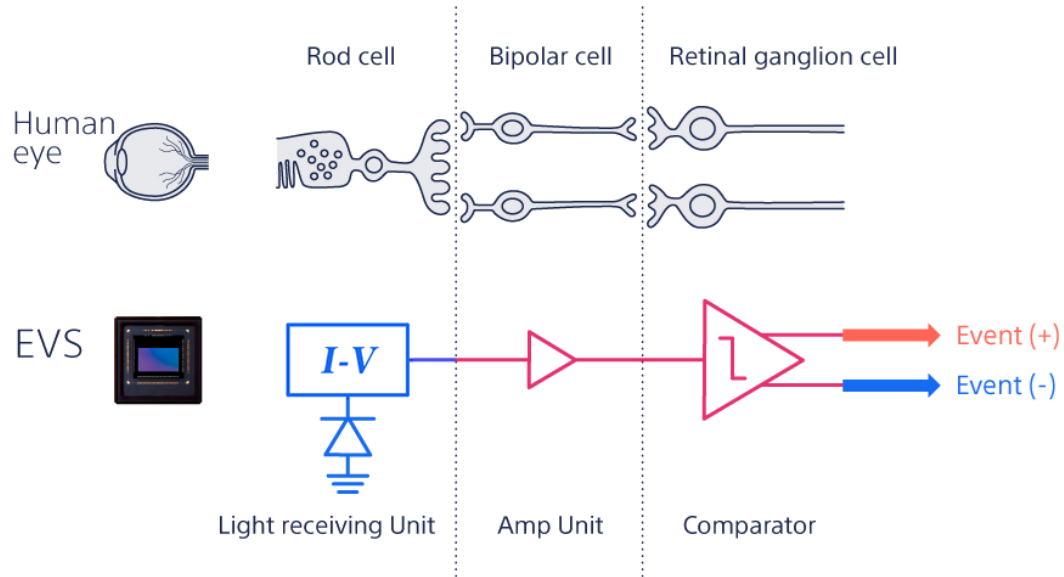
The 10 primitives are extracted from Applied Physics Reviews "The building blocks of a brain-inspired computer" Jack D. Kendall and Suhas Kumar, Rain Neuromorphics and HP Labs, respectively. Year 2020



THE BRAIN AS A MODEL

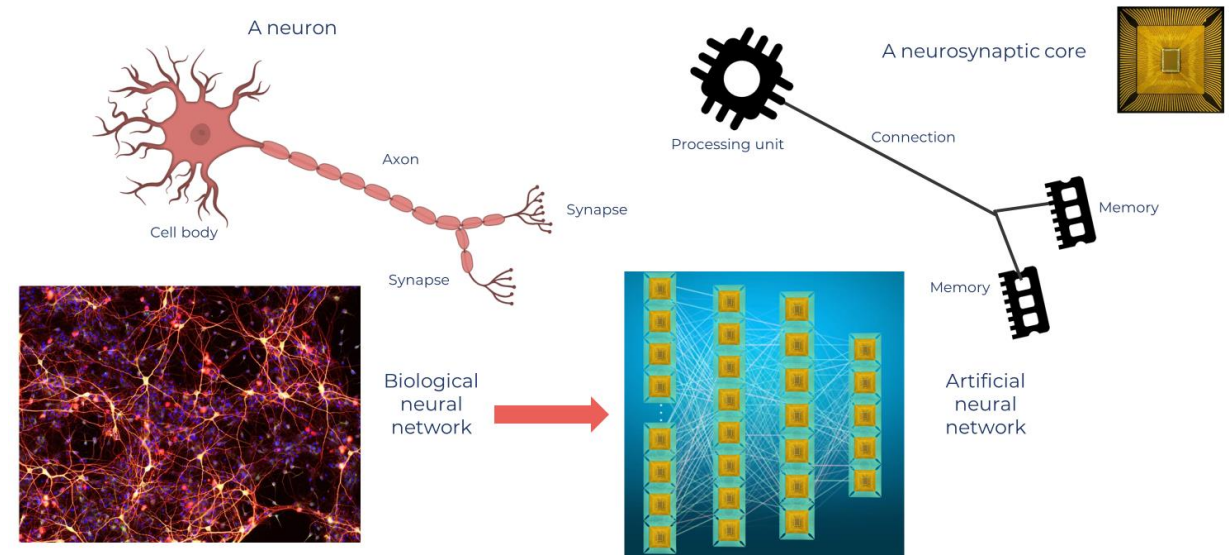
What does it mean exactly? Some examples

Sensing: Mimicking the human retina



Source: Sony

Computing: Mimicking the human neurons



NEUROMORPHIC APPLICATION DRIVERS

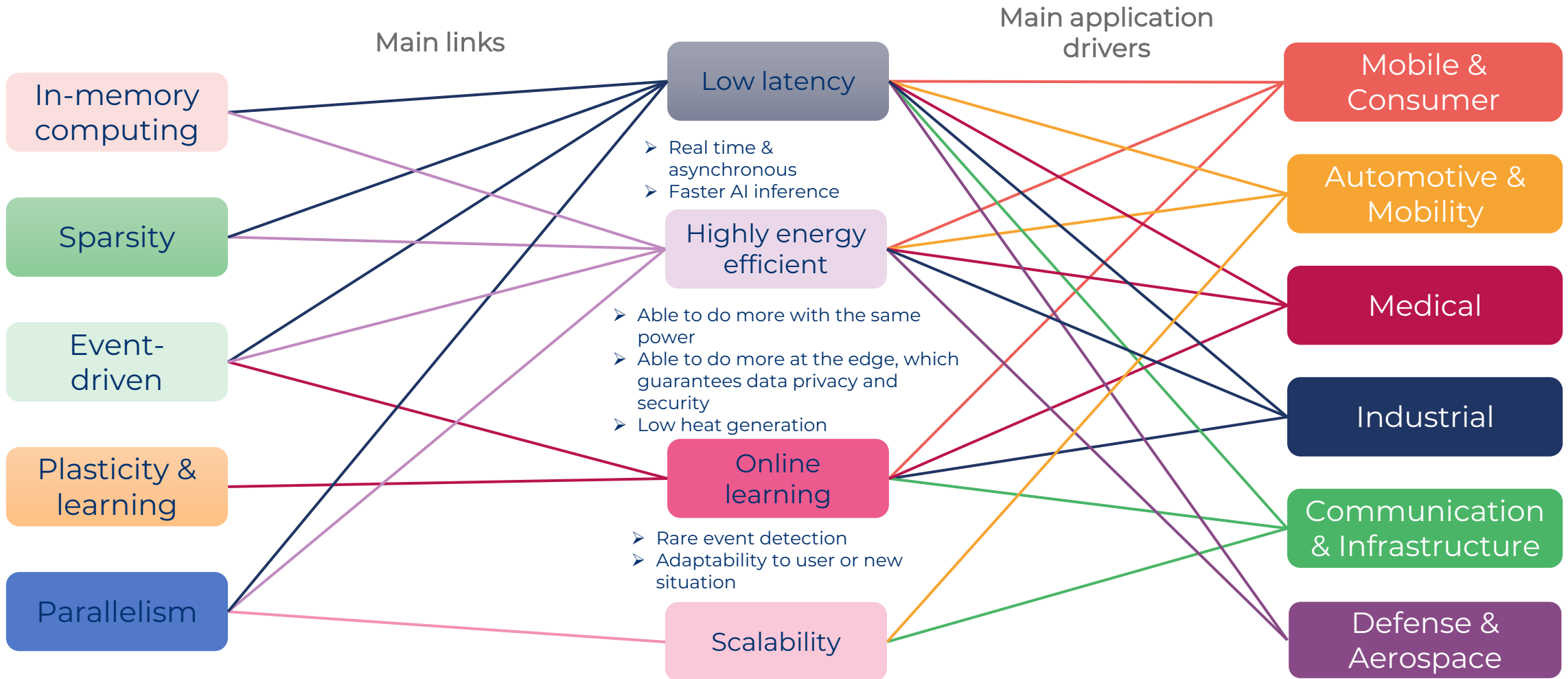
Neuromorphic attributes, assets and applications



Main attributes

Neuromorphic assets

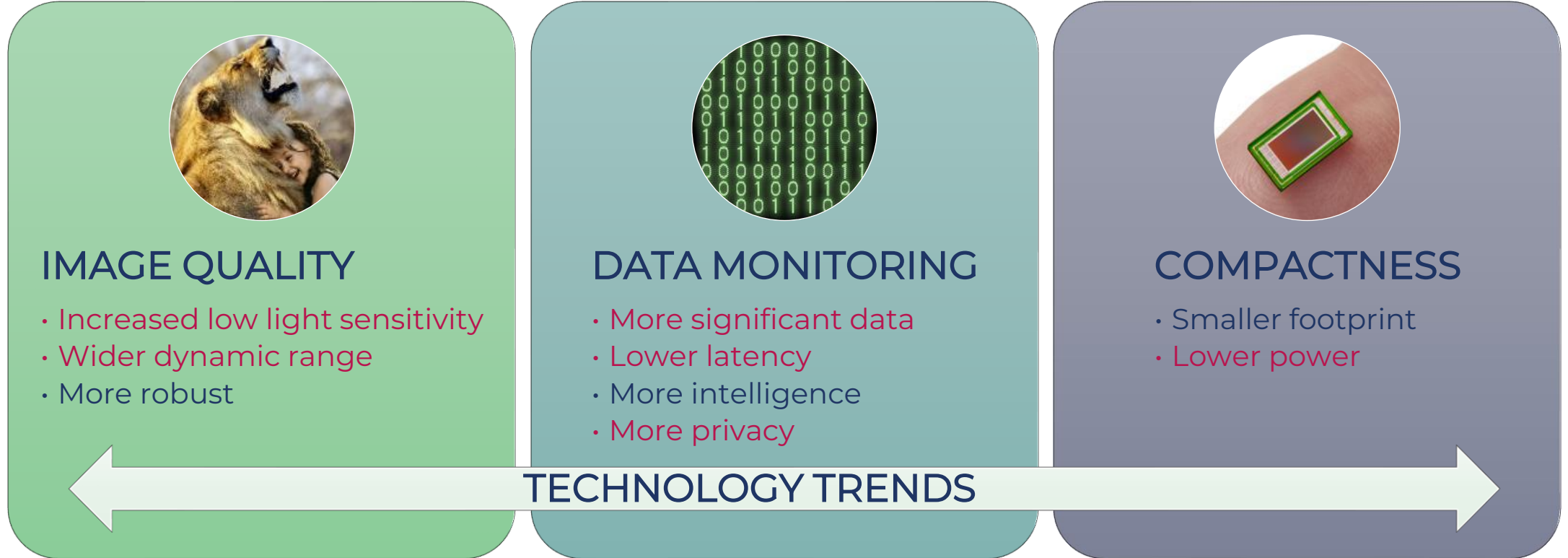
Market





WHAT IS THE NEUROMORPHIC PROMISE?

For cameras sensors, improving image quality, data monitoring and compactness...



- Neuromorphic sensing is addressing numerous desired technological challenges in CMOS image sensor technology evolution: low light sensitivity and dynamic range improvements, lower latency and power consumption, and favoring better data privacy.



WHAT IS THE NEUROMORPHIC PROMISE?

Neuromorphic computing: More and better AI

Sustainable innovation

Improve existing AI

- **More efficient AI**
 - Lower power
 - Lower latency
- **More adaptable AI**
 - Fault tolerant
 - More robust

- ✓ Run existing DNN/CNN faster and much **more power-efficiently**.
- ✓ Make AI more environmental-friendly.

Expand existing AI

- **Bring AI to the edge and extreme edge**, where power or heat constraints prevent conventional AI from being deployed.
 - Lower power
 - Lower heat
 - Privacy respected
- **Enable always-on AI**
 - Energy efficient always-on sensing

- ✓ **Distributed intelligence** through a **network of edge sensors**.
- ✓ Good environmental understanding for robots.

Disruptive innovation

Go beyond existing AI

- **Enable edge online learning**
 - Improve AI personalization
 - Make possible new use-cases
- **Enable learning with little data**
 - More efficient learning

- ✓ More **natural human/robot interaction** with voice command or gesture recognition.
- ✓ Enable more **robot autonomy**.

NEUROMORPHIC APPLICATIONS

MARKET SEGMENTATION OF NEUROMORPHIC TECHNOLOGIES



13 applications with 29 corresponding end markets and end systems have been analyzed.



Market	Application	End-system
Mobile and Consumer	Mobile	Smartphone
	Entertainment	Consumer Drone, Action Cam, Headset – Earbud, AR/VR Headset
	Health	Smartwatch
	Home	Personal Robotics, Household Camera, Smart Speaker
	Productivity	Tablet, Laptop
Automotive and Mobility	Automotive	Forward Camera ADAS, Surround ADAS, In-cabin Camera, ADAS Domain Controller, Infotainment System, Sensor Monitoring
	Robotic vehicle	Robotic Vehicle
Medical	Diagnostic wearable	Vital Signs Monitor, Fall Detector
Communication and Infrastructure	Datacenter	Computing Server
Industrial	Logistics	Heavy Truck, AGV & AMR, Indus – Drone,
	Smart City/Building	Security Camera
Defense and Aerospace	Manufacturing	Fixed Camera, Indus – Sensor Monitor
	Defense and Aerospace	Defense and Aerospace



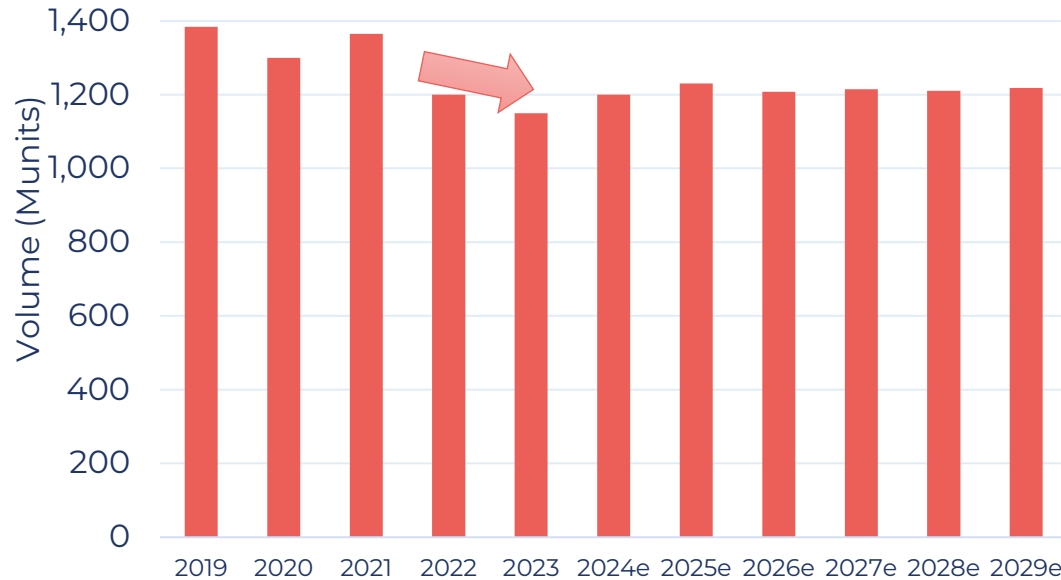
NEUROMORPHIC APPLICATIONS - SENSING

The recent mobile market dynamics

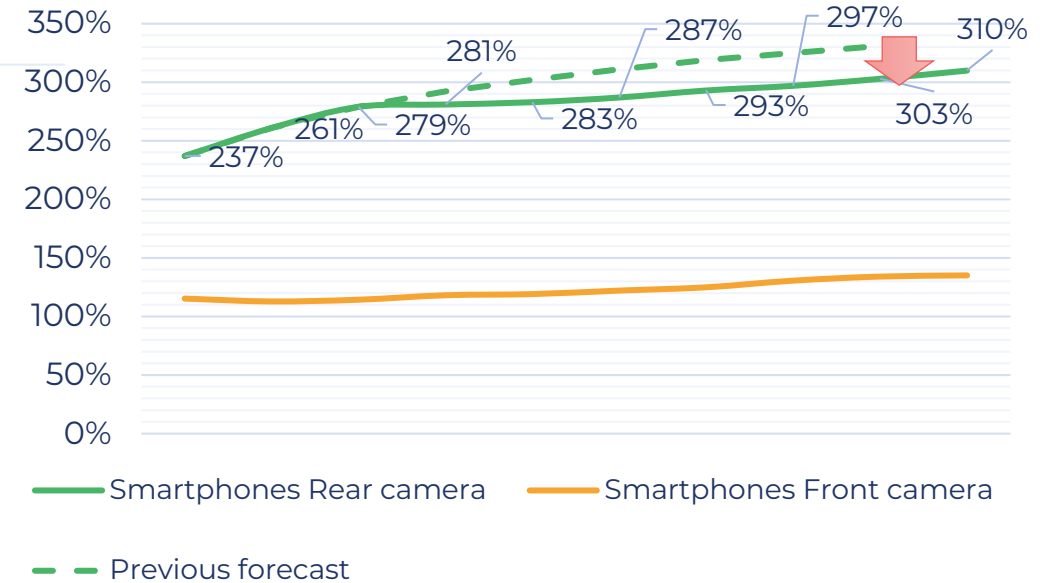


What is the future of mobile imaging and sensing?

2019-2029 Smartphone total production (in Munits)



2019 - 2029 average number of cameras per smartphone handset



Decrease in 2022 and longer-term expectations for smartphone shipments by about 10%.



Nokia 9 PureView

Deceleration in the increase of the average number of cameras per smartphone.

NEUROMORPHIC APPLICATIONS - SENSING

Event-based and multispectral cameras expected in flagship smartphones...



Courtesy of Nokia



> 2020

More 3D sensing cameras

Front camera:

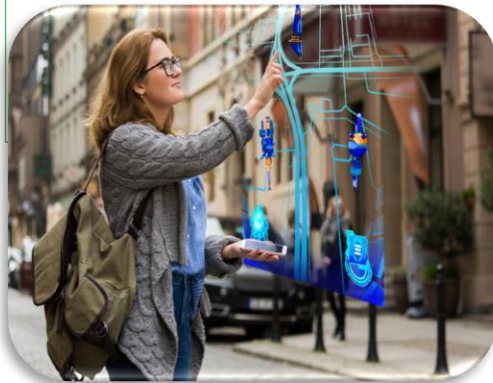
Face identification

Rear camera:

Photography, bokeh effect

Augmented reality

Gaming...



> 2024

+ Event-based cameras

Rear camera:

Live deblurring

Slow motion

SLAM...

Front camera:

Always-on user interface



> 2028

+ Multispectral cameras

Front camera:

Face identification

Rear camera:

Skin care, cosmetics

Accurate color photography...



New imaging and sensing opportunities?



NEUROMORPHIC APPLICATIONS - SENSING

Frame-based cameras are not good enough...

- Over the past decades, efforts have been made to improve the quality of frame-based cameras. Among the current limitations: motion blur, limited dynamic range, ghosting, flickering and color artifacts.

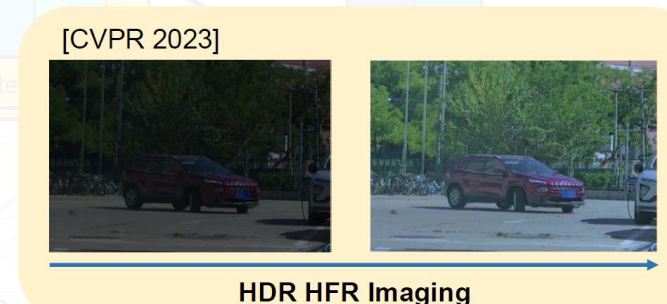
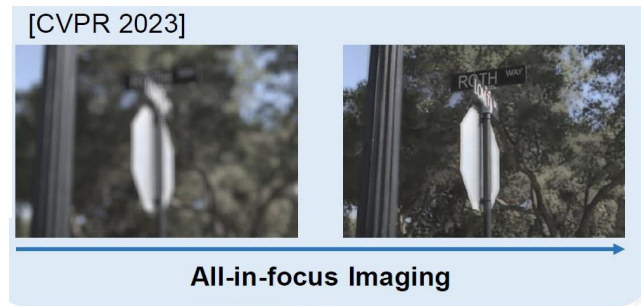


Motion blur, except for art, is limiting photograph quality



Neuromorphic image sensors' low latency and high bandwidth permit advanced features such as foveation, refocus, motion deblur, and high frame rate HDR to photography and video applications.

From: Boxin Shi, Peking University, CVPR 2023





NEUROMORPHIC APPLICATIONS - SENSING

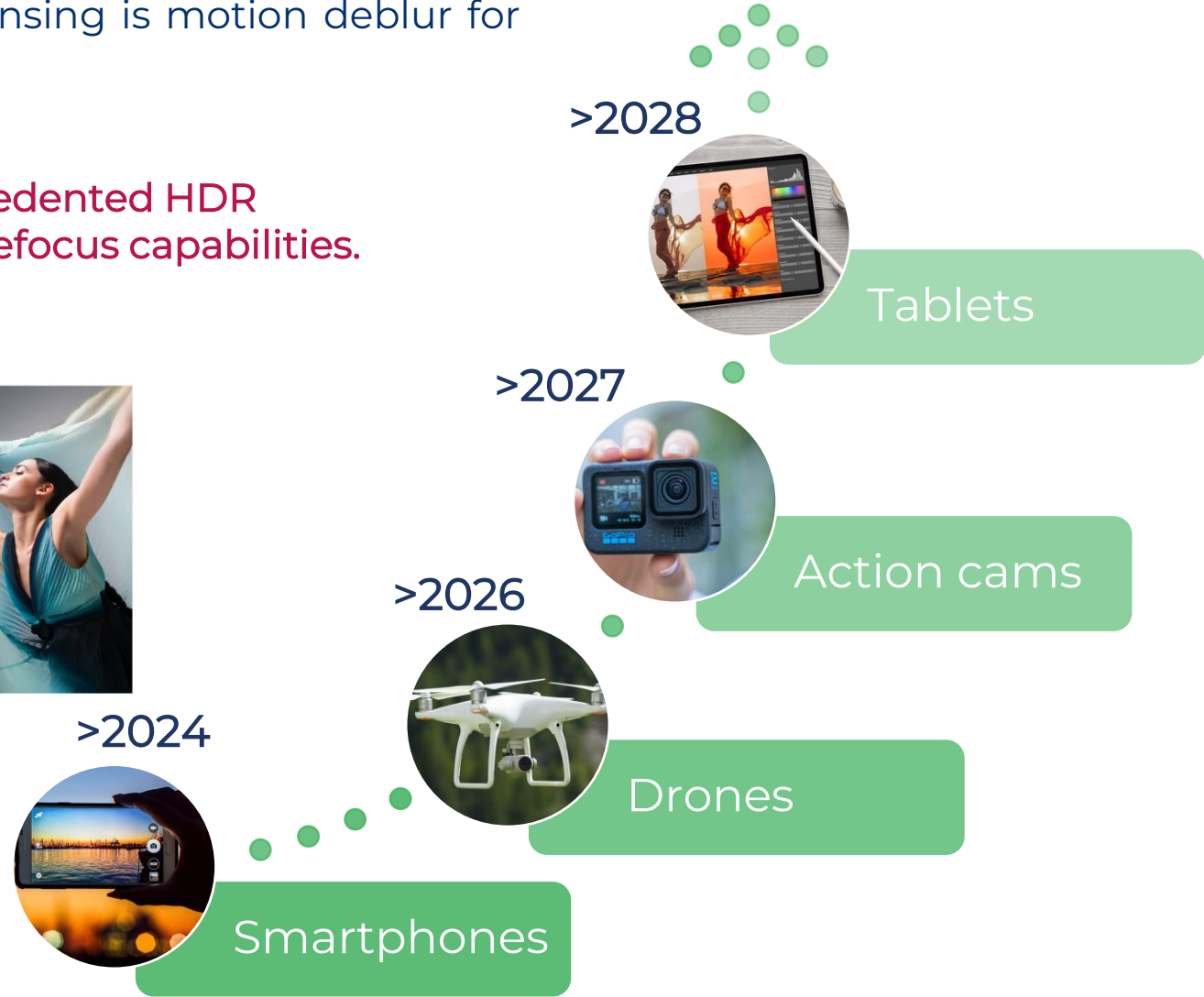
Going beyond smartphone photography

- The next opportunity coming for neuromorphic sensing is motion deblur for smartphone photography applications.

Neuromorphic image sensor will allow unprecedented HDR photography and video, motion deblur and image refocus capabilities.



Source: Prophesee

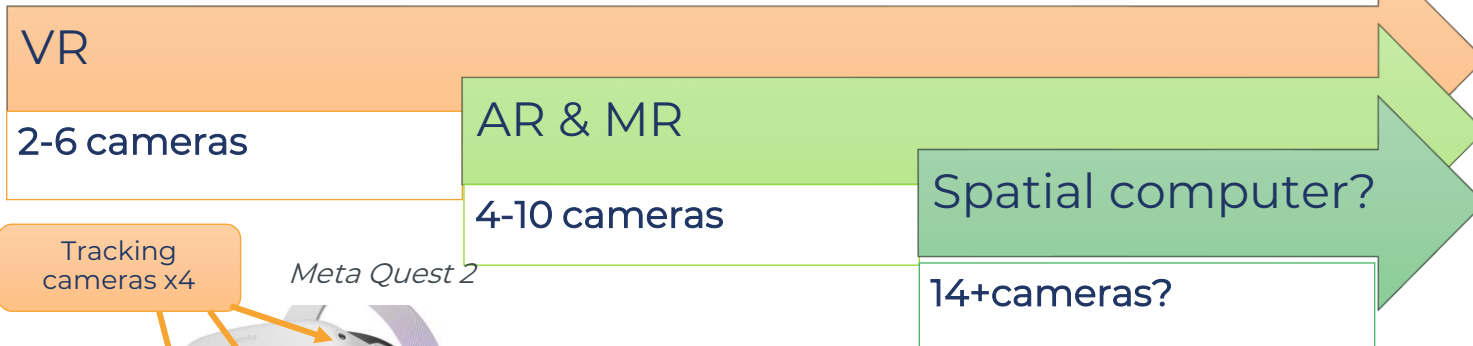




NEUROMORPHIC APPLICATIONS – COMPUTING AND SENSING

Neuromorphics is key to moving to spatial computing era

Proliferation of sensors for XR



New imaging paradigm to unlock lower power and latency sensing approaches: neuromorphics

Will the next AR/VR processor be neuromorphic?

Tracking cameras x4
~\$350
Meta Quest 2

Tracking cameras x4
~\$3,500
Microsoft HoloLens 2

RGB camera
3D camera
Eye tracking cameras x2
~\$1,200
Meta Quest Pro

M2 APU
R1 co-processor

dToF 3D camera "LiDAR"
Structured light 3D camera
RGB cameras x2
Eye tracking cameras x4

LIDAR Scanner
TrueDepth camera
Downward cameras
IR illuminators
Side cameras
Tracking cameras x6

Apple Vision Pro
~\$3,500



Battery

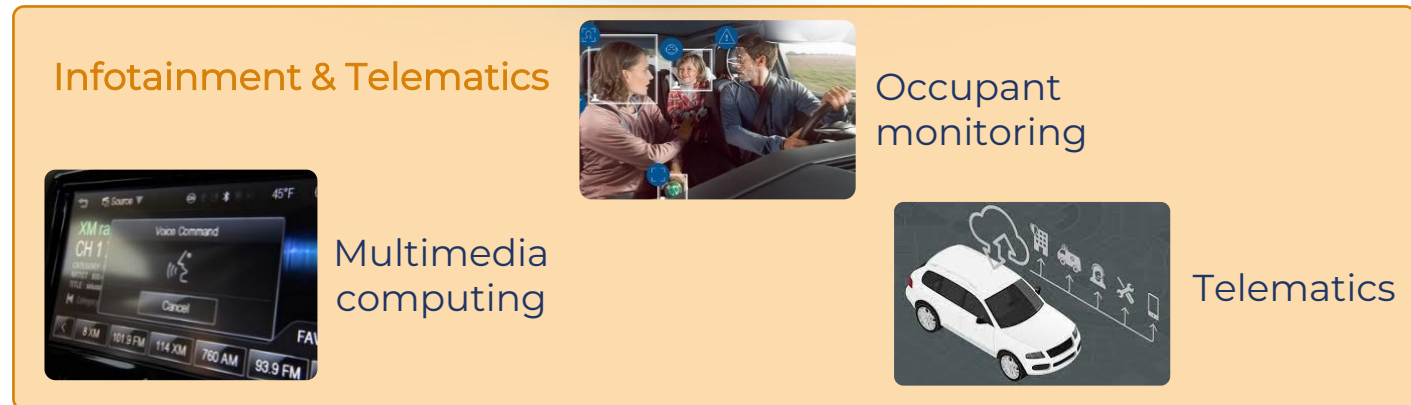
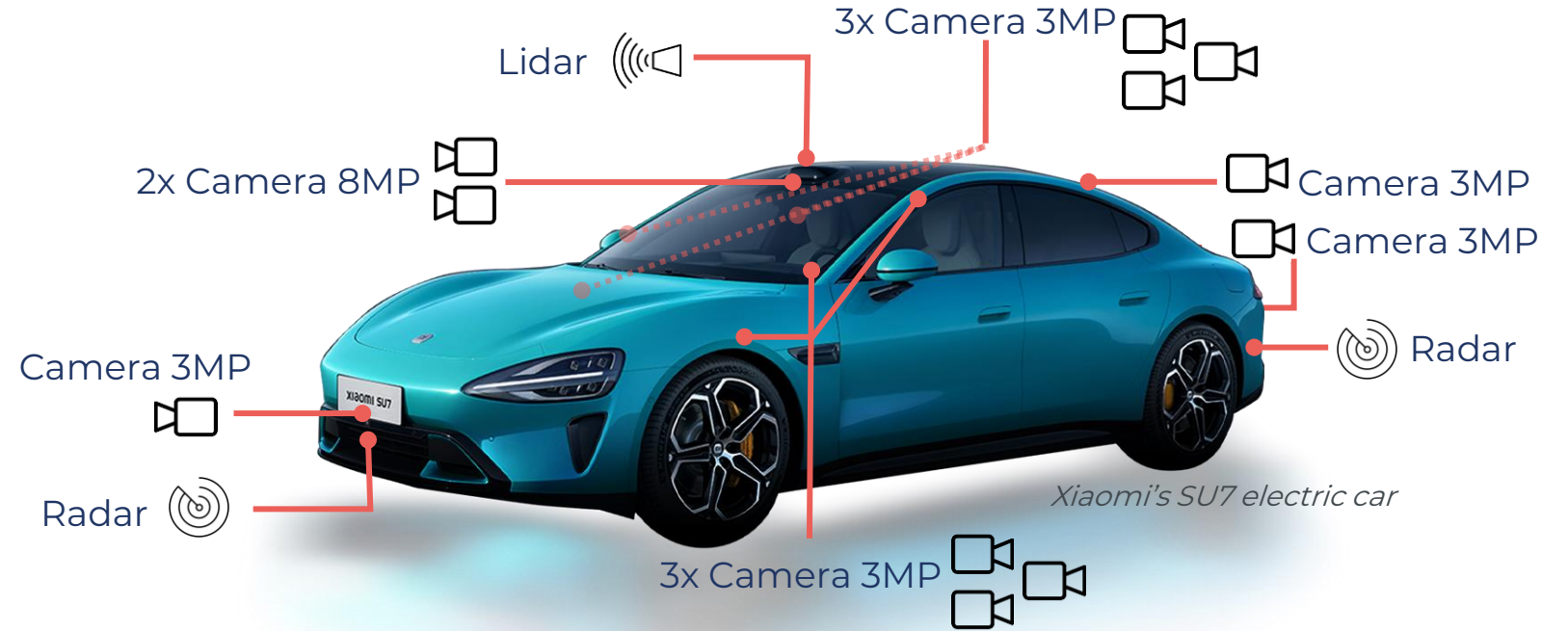
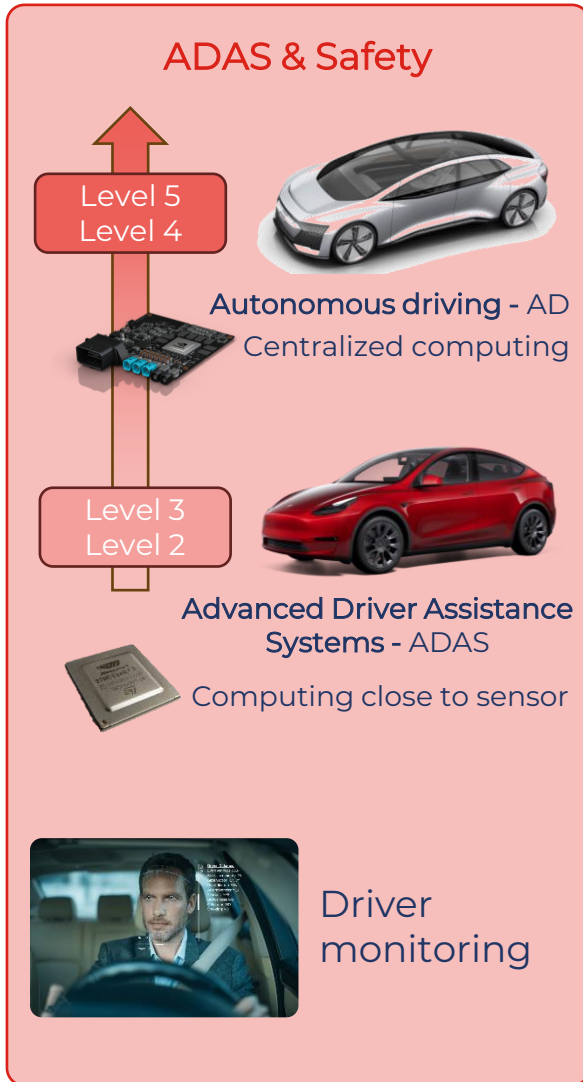
ultraleap | PROPHESIEE | **TCL RayNeo**
low power tracking technology for AR glasses





NEUROMORPHIC APPLICATIONS – COMPUTING AND SENSING

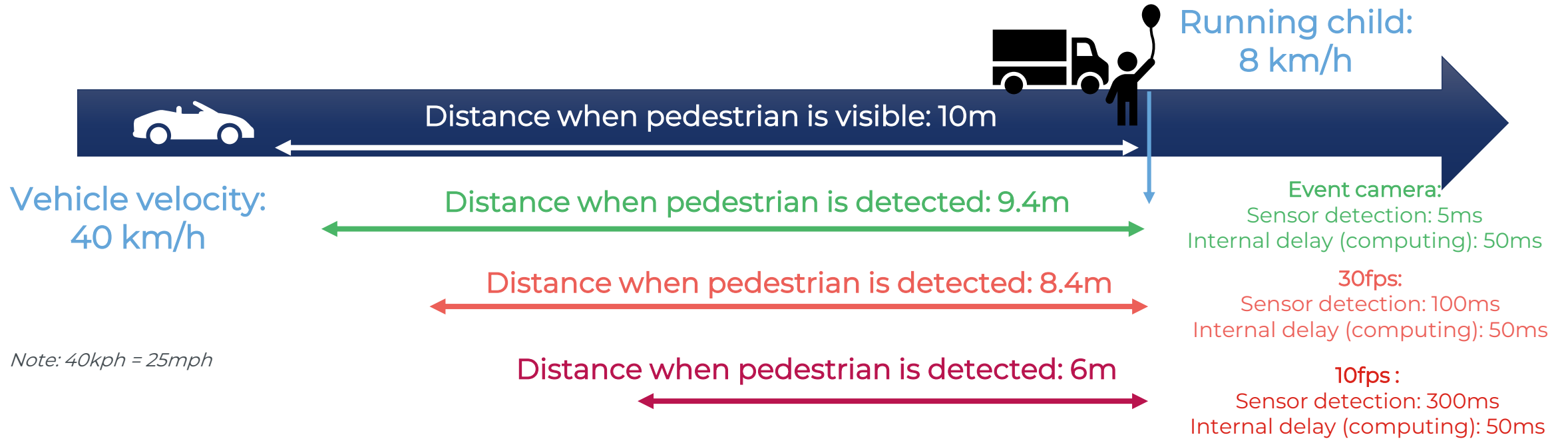
Automotive domains



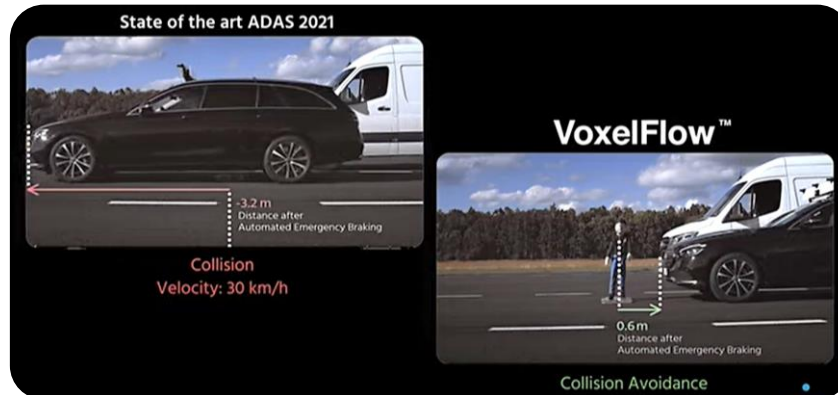
NEUROMORPHIC APPLICATIONS – COMPUTING AND SENSING



Why neuromorphic technologies for ADAS?



Note: 40kph = 25mph



NEUROMORPHIC APPLICATIONS – COMPUTING AND SENSING

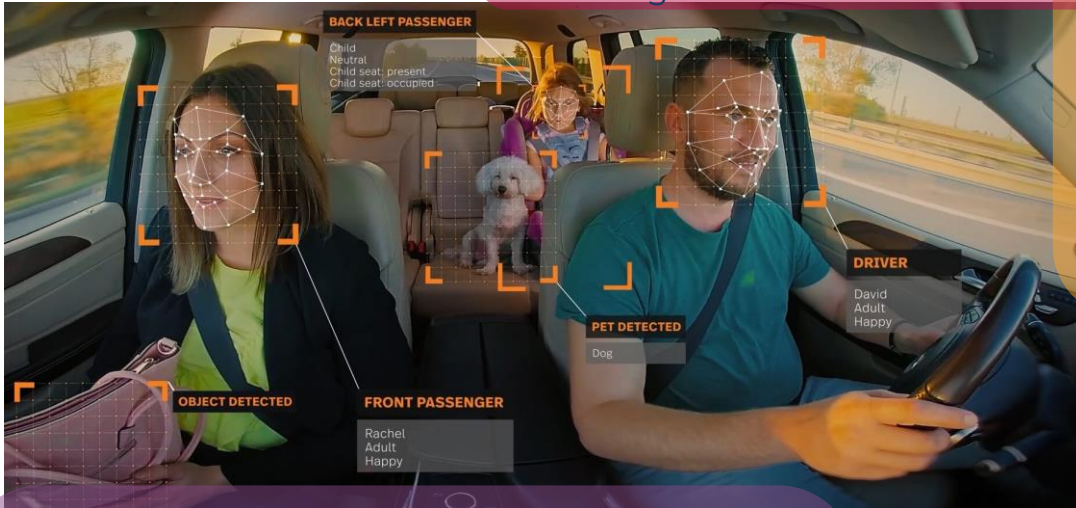
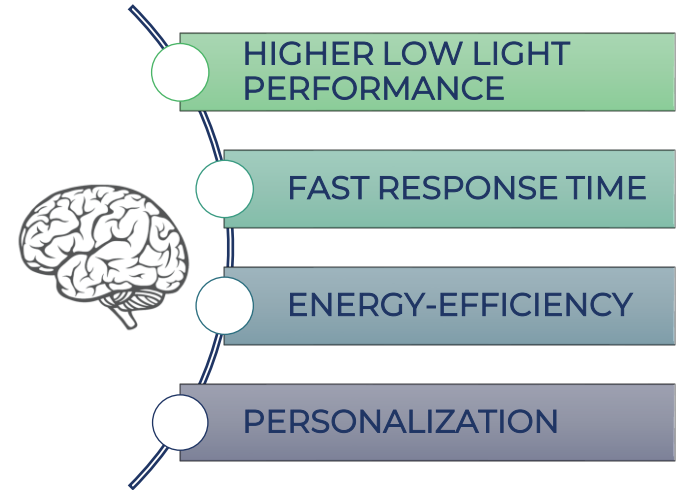


Driver Monitoring Systems (DMS) and infotainment



- ### Child presence detection
- Presence detection
 - Presence classification
 - Vital signs detection

- ### Driver monitoring
- Distraction and drowsiness detection
 - Head orientation and position
 - Eye direction monitoring
 - Smart seatbelt detection
 - Object detection
 - Hand positions on the wheel
 - Position on the seat
 - Face recognition
 - Smart airbag deployment



- ### Occupant monitoring
- Occupant detection, identification, classification
 - Position on seat
 - Feet on dashboard detection
 - Seatbelt detection
 - Object detection
 - HVAC control
 - Emotion detection
 - Conference call, selfies
 - Heart and respiration rate
 - Blood flow measurement



DMS with equivalent frame rate of 10,000fps without requiring active illumination

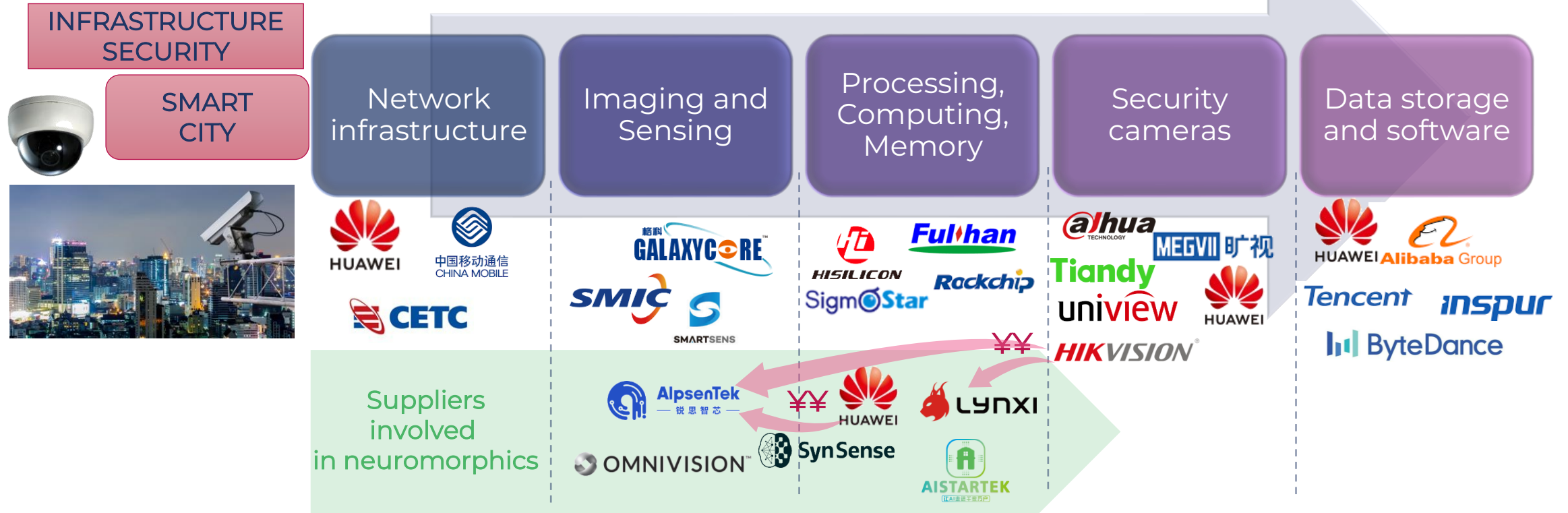


Keyword spotting 5 to 10 times more energy-efficient



NEUROMORPHIC APPLICATIONS – COMPUTING AND SENSING

A powerful security imaging ecosystem in China eyeing neuromorphics



We expect security cameras will represent a \$1.1B neuromorphic market by 2034.

Neuromorphics could allow to design high performance chips at larger nodes than legacy processor technologies.



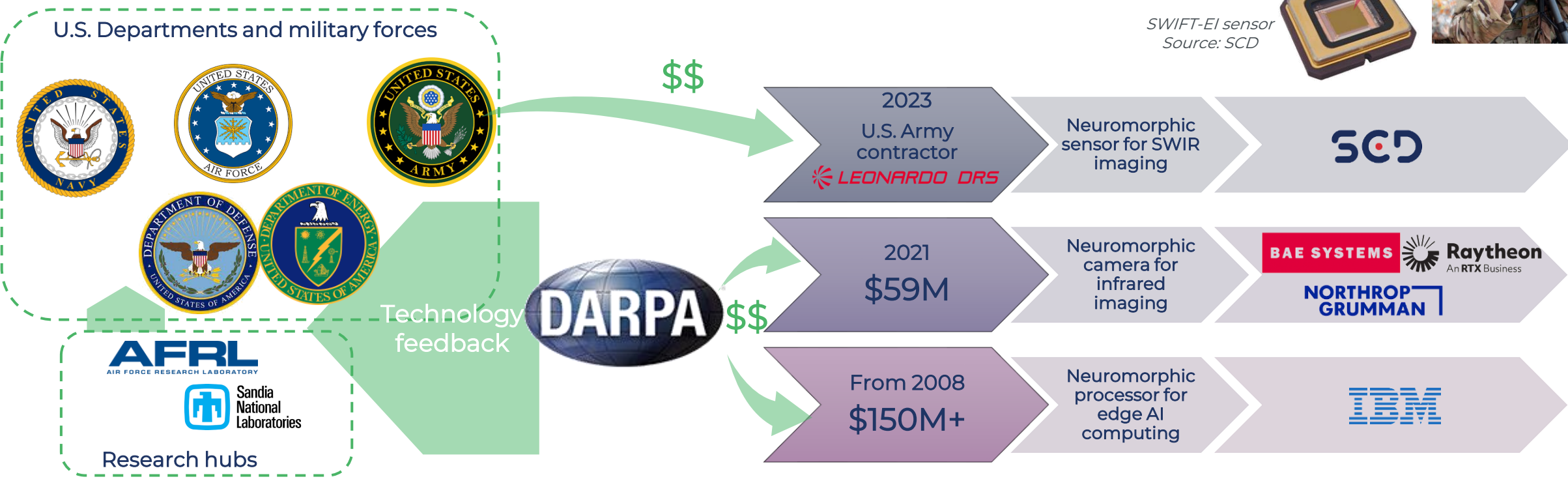
NEUROMORPHIC APPLICATIONS – COMPUTING AND SENSING

Defense sector has long supported neuromorphic technologies

JETS II hand-held precision laser targeting system
Source: Leonardo DRS

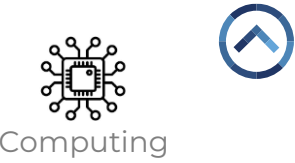


- DARPA Fast Event-based Neuromorphic Camera and Electronics (FENCE) program.
- DARPA Neuromorphic Adaptive Plastic Scalable Electronics (SyNAPSE): 2018 demonstration of **3D stereo vision high-performance processing, coupling neuromorphic event-based cameras with a TrueNorth neuromorphic processor.**
- According to the Assistant Secretary of Defense for Critical Technologies, Maynard Holliday, there is a **crucial need for edge AI computing to be unlocked by neuromorphic technology, expected to be related to image and video processing and recognition tasks.**

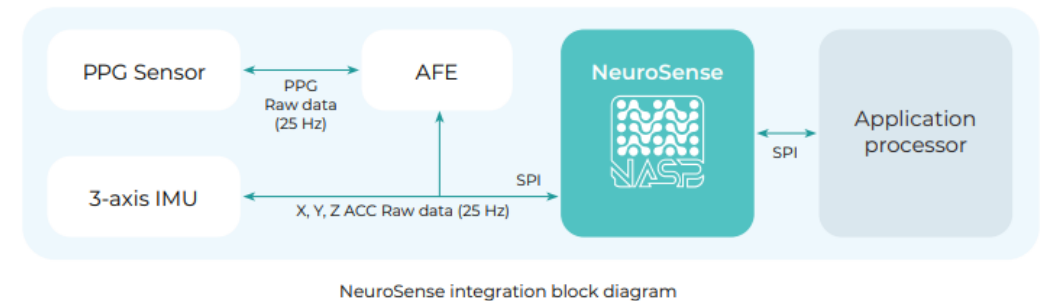


NEUROMORPHIC APPLICATIONS – COMPUTING

Health – Neuromorphics can enable low-power data analytics at the edge



- In November 2023, **Polyn Technology** entered into a partnership with **Medicalps**, a healthcare industry cluster located in the French Alps. This collaboration aims to help startups accelerate their entry into international markets and strengthen connections within the local healthcare ecosystem.
- Polyn Technology's NeuroSense is a Tiny AI chip based on a Neuromorphic Analog Signal Processor. It can process signals such as heart rate measurements using simple sensors, like two LEDs and one photodiode, among other features. The key advantage of this technology is its **higher accuracy and lower power consumption compared to traditional methods**.
- This technology can be integrated into **medical wristbands** to monitor the health of individuals with medical conditions. Moreover, it can potentially revolutionize the mass consumer wearable market by offering advanced health monitoring capabilities like better heart rate accuracy measurement, advanced oxygen saturation and stress monitoring.
- Furthermore, this technology can be combined with IMU sensors for applications like **fall monitoring**, which is becoming increasingly important as populations age. Since these devices are battery-powered, leveraging neuromorphic sensors to extend battery life makes perfect sense.





NEUROMORPHIC APPLICATIONS – COMPUTING

Data center – Fighting cyber crime and threat detection

- In May 2023, BrainChip partnered with Quantum Ventura to develop cutting-edge cyber threat-detection tools. This collaboration will leverage **BrainChip's Akida neuromorphic** processor to create cybersecurity applications for the U.S. Department of Energy.
- The Akida neural processor and AI neuromorphic IP offer advantages for threat detection, including its **small size, low power consumption, accuracy, and ability to learn and adapt to new patterns**. By identifying unknown, repeating patterns in vast amounts of noisy data, Akida can effectively **detect malware, attack signatures, and other types of malicious activity in network traffic**.
- Moreover, BrainChip's IP supports **incremental learning**, on-chip learning, and high-speed inference within micro-watt to milli-watt power budgets.
- As an event-based technology, Akida is inherently more **energy-efficient** than conventional neural network accelerators, providing high performance with low power consumption. This efficiency allows partners like Quantum Ventura to deliver AI solutions previously unattainable on battery-operated or fan-less embedded edge devices.

brainchip



Low latency

Highly energy efficient

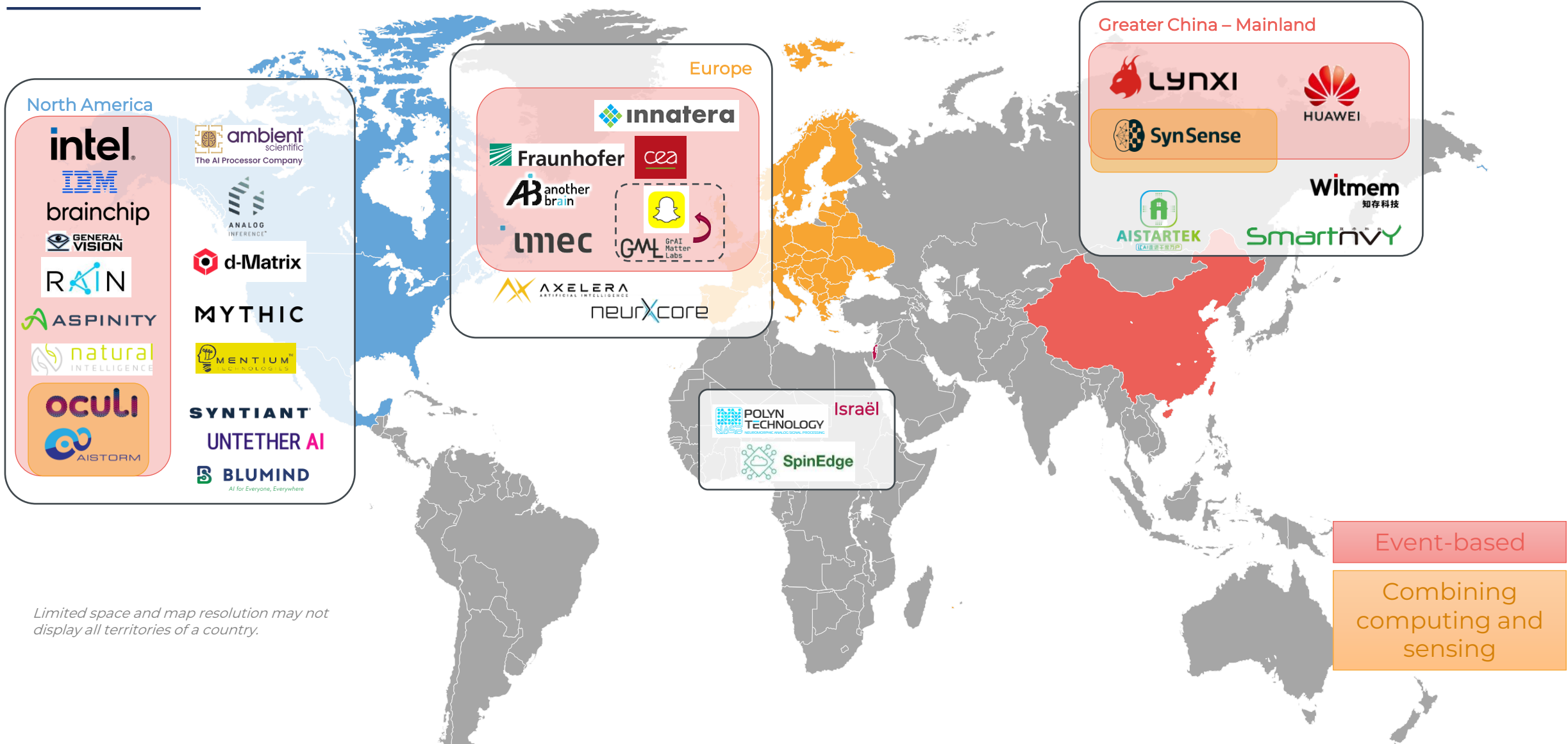
Online learning

NEUROMORPHIC ECOSYSTEM AND TECHNOLOGY



NEUROMORPHIC AND IN-MEMORY COMPUTING

The US, Europe and China are the three most active areas



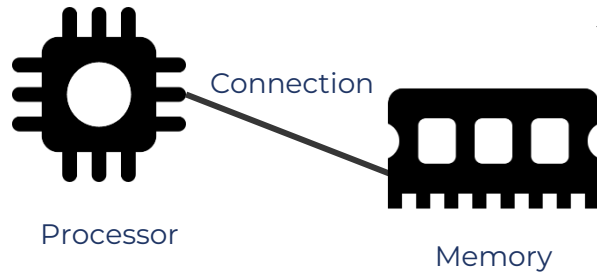
Limited space and map resolution may not display all territories of a country.



TECHNOLOGY TRENDS – NEUROMORPHIC COMPUTING

Von Neumann and neuromorphic architecture combined in one processor

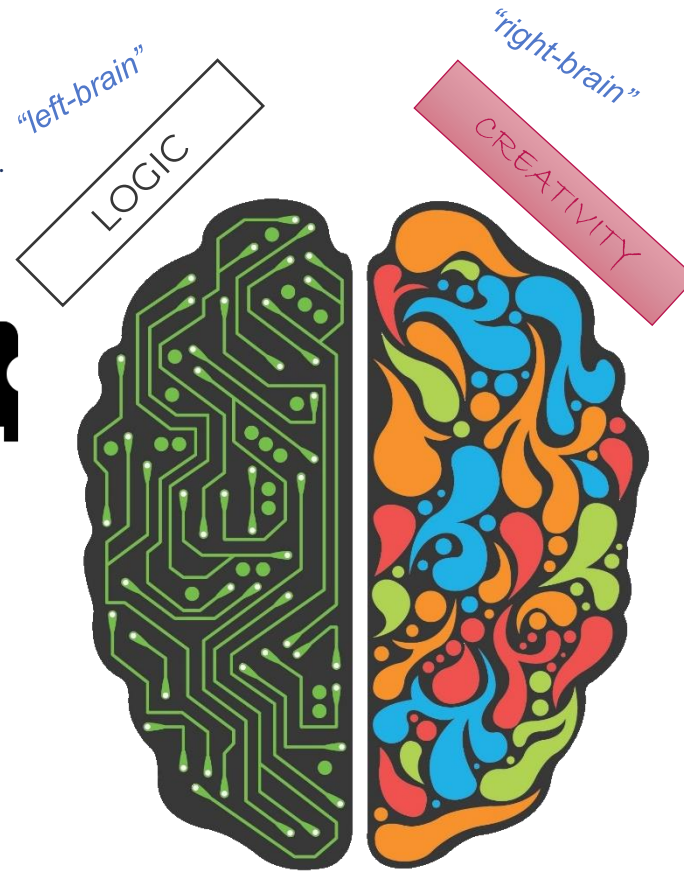
Von Neumann architecture consists of two different components: computing and memory with connections between the two.



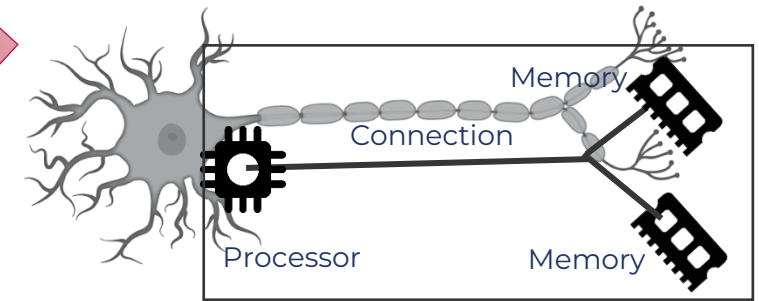
- Analytical thinking
- Language
- Etc.

FLOPS-driven
Floating-point Operations Per Second

Analysis
Control
Decision



Neuromorphic architecture consists of embedded computing and memory in one component/core.



- Pattern recognition
 - Learning
 - Reasoning
 - Etc.

Converts senses to actions.
SOPS-driven
Synaptic Operations Per Second

Model creation
High reactivity



Toward a heterogeneous architecture?

TECHNOLOGY TRENDS – NEUROMORPHIC COMPUTING



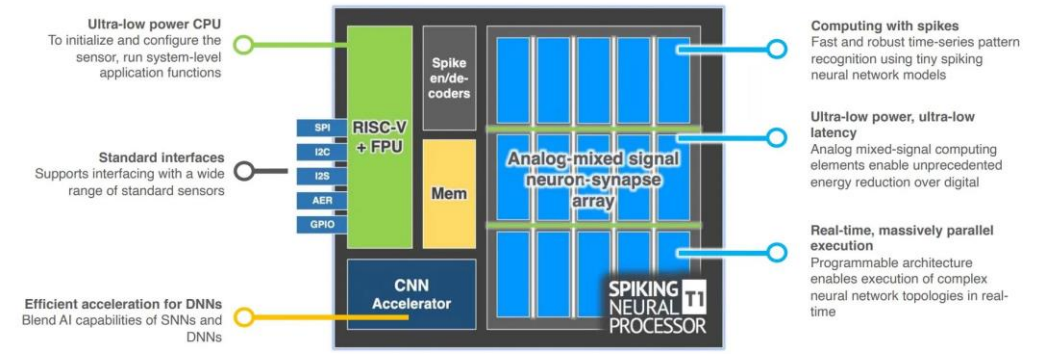
Example of hybrid processors



➤ Lynxi KA200 Neuromorphic chip



- It is a hybrid chip that can compute both classic algorithms and SNN
- 250,000 neurons and 25 million synapses (in dense mode)
- There is also a **sparse mode** that enables scaling to support integrated computing with 2 million neurons and 2 billion synapses
- Technology node: 12nm
- Performance:
 - Neuromorphic 24 TSOPS
 - Traditional: 48TOPS @INT8, 24TFLOPS @FP16

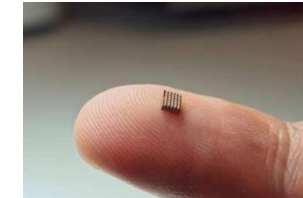


Spiking Neural Processor TI diagram

Courtesy of Innatera



Innatera TI chip



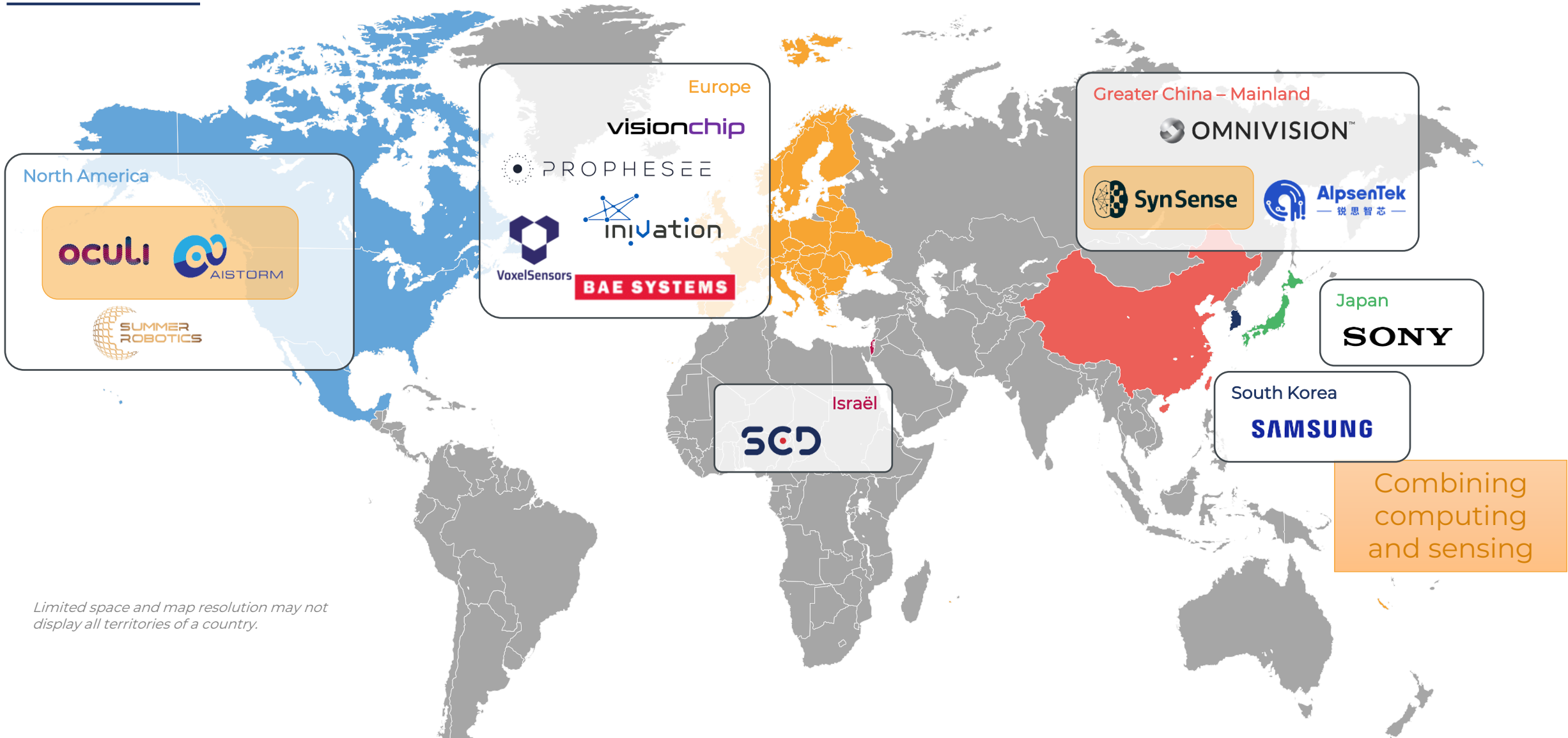
- BrainChip is a fabless semiconductor company founded in 2013 in California, US.
- Today, BrainChip defines itself as more like an IP company than a chip company.
- Chips are still designed to demonstrate their performance and for some specific customers.
- They promote more the IP approach, with the vision of **integrating IP into existing hardware as a neuromorphic unit**. This approach is potentially much more scalable as they work with partners.

brainchip



NEUROMORPHIC SENSING ECOSYSTEM

The top 3 CMOS image sensor suppliers followed by numerous startups



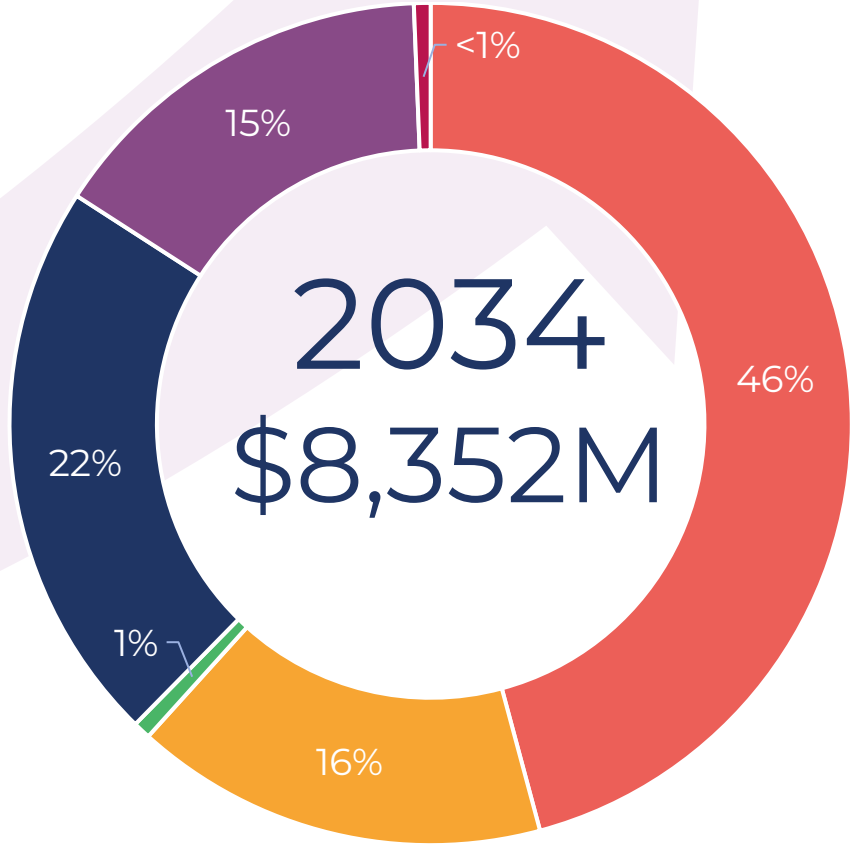
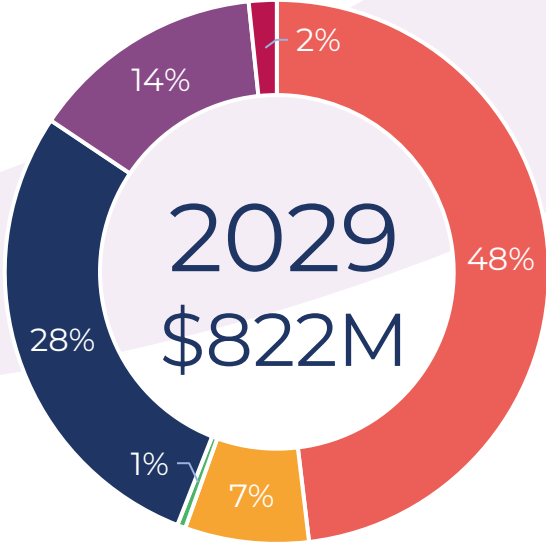
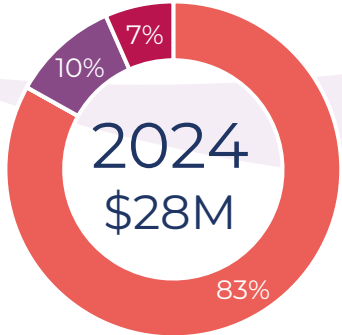
Limited space and map resolution may not display all territories of a country.

NEUROMORPHIC MARKET FORECAST

2024-2034 NEUROMORPHIC SENSING AND COMPUTING FORECAST



- Mobile and Consumer
- Automotive and Mobility
- Medical
- Communication and Infrastructure
- Industrial
- Defense and Aerospace





- The brain is an incredibly **energy-efficient device** and possesses key attributes that can be used for sensors and processors, it is the main idea behind neuromorphic technologies. The key assets of such technologies are **low latency, energy efficiency, online learning, and high scalability**.
- The next opportunity coming for neuromorphic sensing is **motion deblur for smartphone photography** applications. Neuromorphic is expected as a new imaging and computing paradigm in **power-constrained consumer applications such as AR/VR**, in the context of sensors proliferation. Security cameras could be one of the most promising markets for neuromorphic technologies as the powerful **security imaging ecosystem in China is investing in this technology**.
- Neuromorphic technology facilitates the implementation of **extreme-edge AI**, allowing intelligence to be integrated directly into sensors for low-power predictive maintenance and health monitoring applications.
- Datacenter applications are increasingly sensitive to power consumption today, as the energy footprint of datacenter is strongly growing, and the associated workload is still expected to grow. Neuromorphic technologies could enable to tackle this growing issue.
- The US, Europe, and China are the three most active areas for neuromorphic computing. **Hybrid approaches** are an interesting path to leverage the best of both worlds, and it is chosen by several competitors.
- The top 3 CMOS image sensor suppliers are involved in neuromorphic sensing: Sony, Samsung and Omnivision, followed by numerous startups. Two main sensor design approaches have been proposed for imaging-related applications: **standalone event-based sensors and mixed RGB with event-based pixel hybrid sensors**. With neuromorphic AI smart vision sensors, specific architectures are proposed to target **ultra-low power always-on use cases**, such as 3D sensing, sometimes bringing advanced processing at the pixel level.
- We expected the neuromorphic market will reach \$822M in 2029 and \$8.4B in 2034.

YOLE GROUP RELATED PRODUCTS



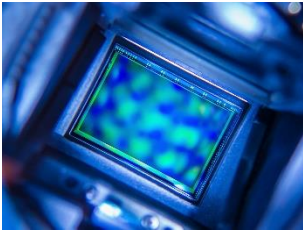
Reports



[Neuromorphic Computing Memory and Sensing 2024](#)



[Imaging for Industrial - Machine Vision 2024](#)



[Status of the CMOS Image Sensor Industry 2024](#)

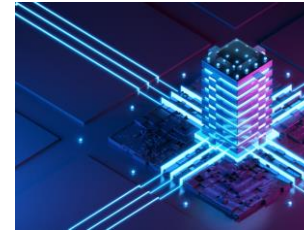


[Status of the Processor Industry 2023](#)

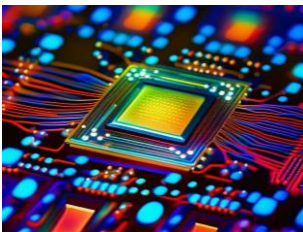
2024 edition coming soon



[Computing and AI for automotive 2024](#)



[Emerging Non-Volatile Memory 2024](#)



[Quantum Technologies 2024](#)



[Imaging for Automotive 2024](#)

Contact our Sales Team for more information



Empowering Product Creators to Harness Edge AI and Vision



The Edge AI and Vision Alliance (www.edge-ai-vision.com) is a partnership of ~100 leading edge AI and vision technology and services suppliers, and solutions providers

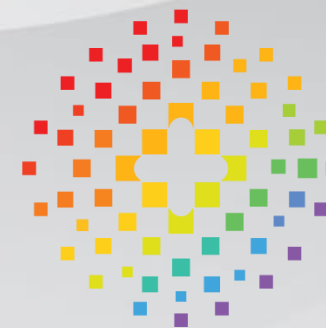
Mission: To inspire and empower engineers to design products that perceive and understand.

The Alliance provides low-cost, high-quality technical educational resources for product developers

Register for updates at www.edge-ai-vision.com

The Alliance enables edge AI and vision technology providers to grow their businesses through leads, partnerships, and insights

For membership, email us: membership@edge-ai-vision.com



edge ai + vision
ALLIANCE™



Join us at the Embedded Vision Summit

May 20-22, 2025—Santa Clara, California



The only industry event focused on practical techniques and technologies for system and application creators

- *“Awesome! I was very inspired!”*
- *“Fantastic. Learned a lot and met great people.”*
- *“Wonderful speakers and informative exhibits!”*

Embedded Vision Summit 2025 highlights:

- **Inspiring keynotes** by leading innovators
- High-quality, practical **technical, business and product talks**
- Exciting **demos, tutorials** and **expert bars** of the latest applications and technologies



Visit www.EmbeddedVisionSummit.com to learn more and register

