

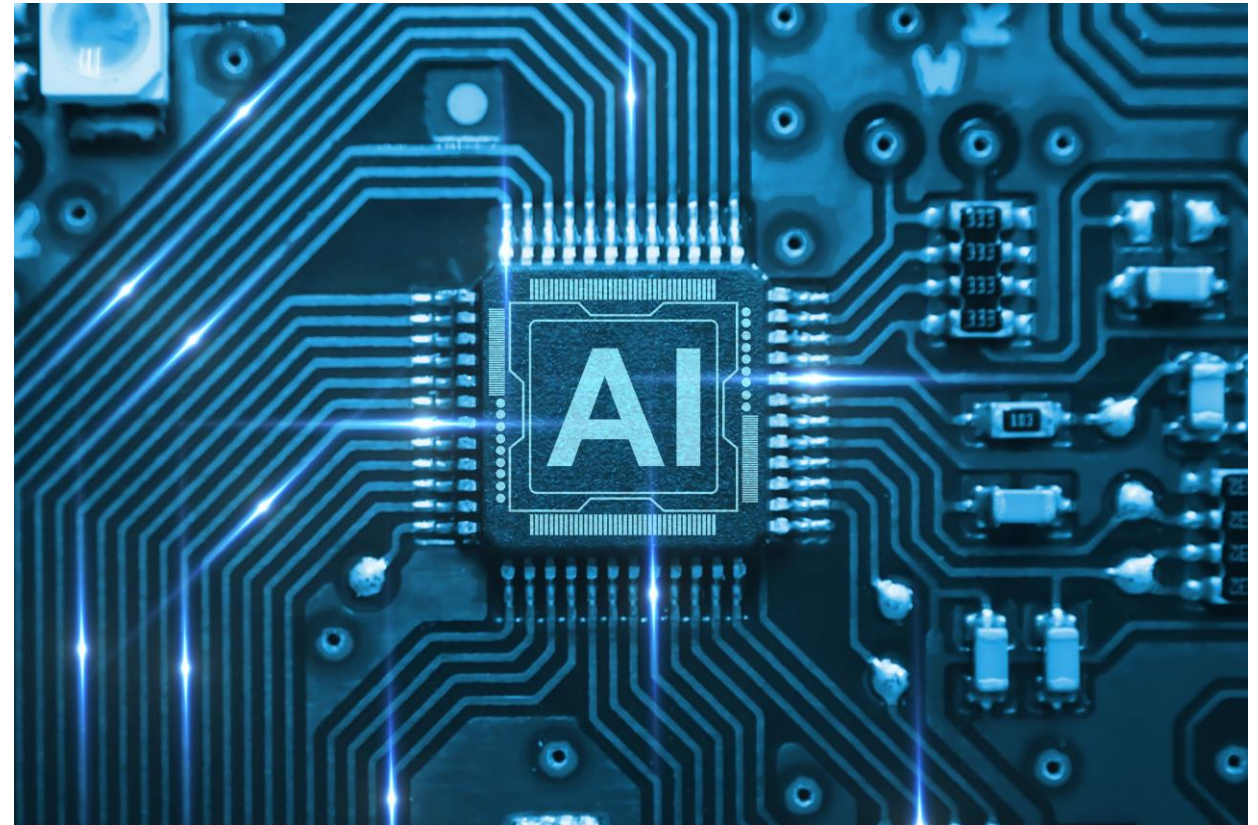
Towards efficient vision representation and coding standards for superior embodied intelligence

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Founder RayShaper SA
JPEG Convenor

Challenges in embodied AI applications

- Efficient **data representation**
- Efficient **resource management**:
 - Bandwidth
 - Complexity
 - Power consumption
- **Latency**
- **Privacy** and **Security**
- Efficient **formats**
- **Performance** metrics
- ...

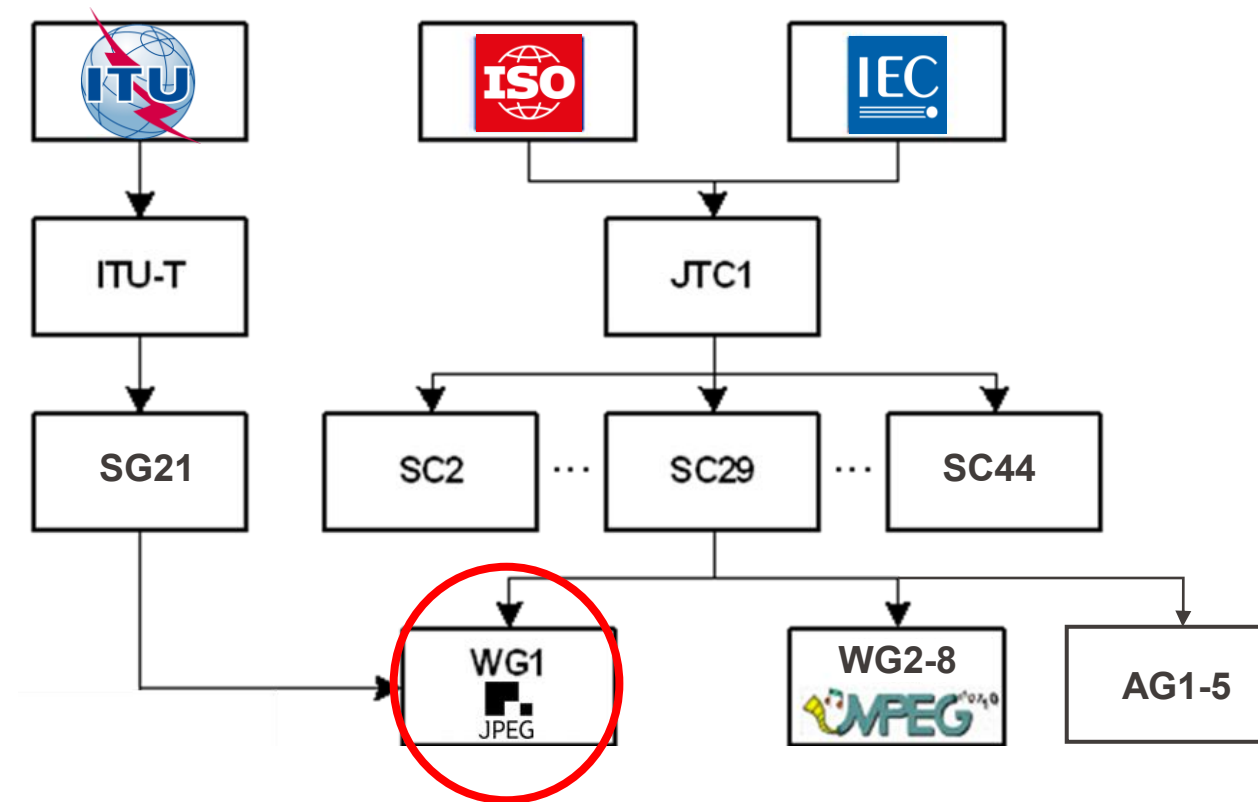


The most obvious challenge in embodied AI

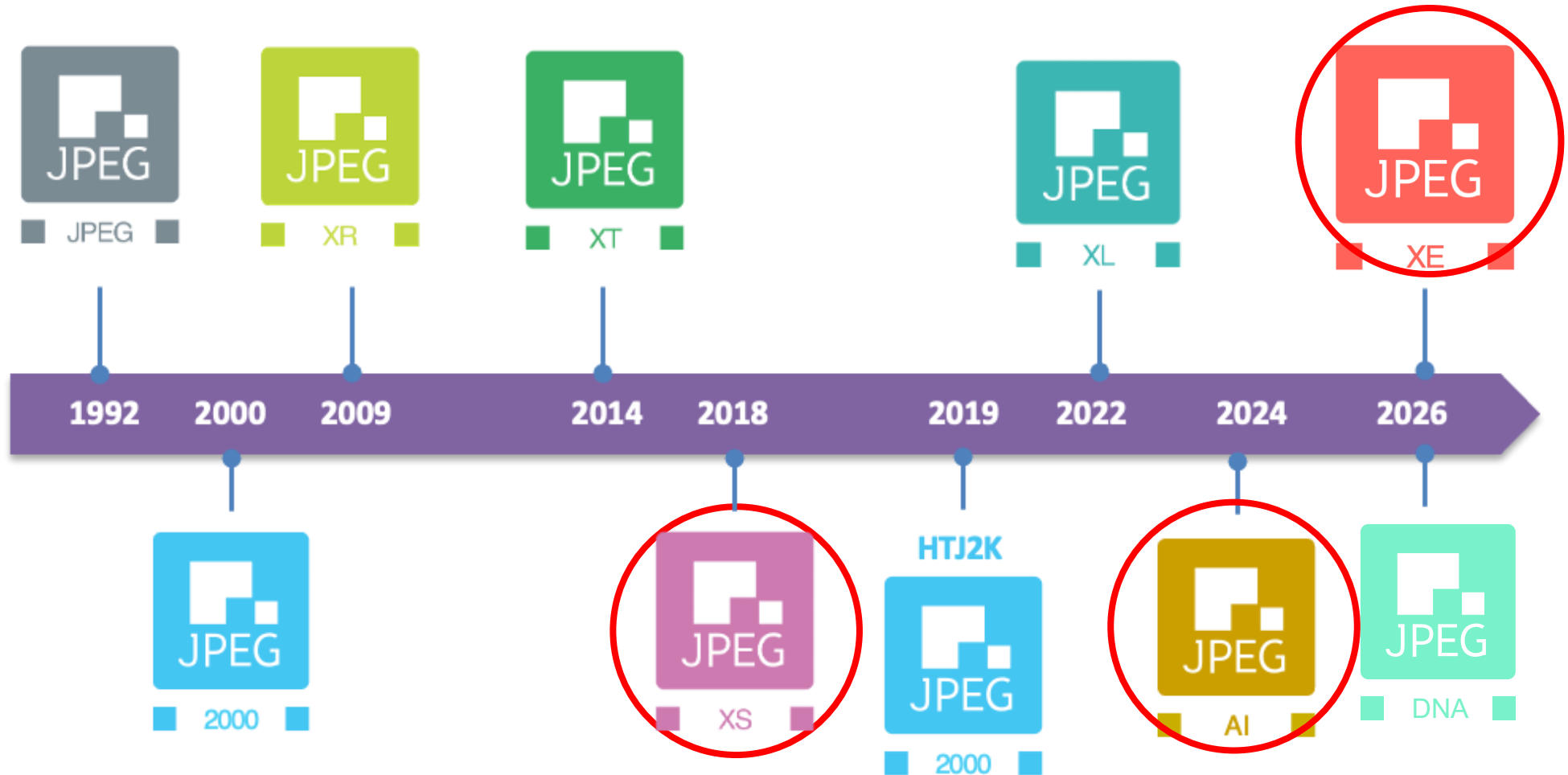
- **Interoperability** will play a key role in the success of Embodied Intelligence
 - **International Standards**, as opposed to **proprietary solutions** dominated by a few
 - **Leveraging existing** International Standards, as opposed to **re-inventing the wheel**
 - **Joint standardization** efforts, as opposed to **multiple similar standards** for the same purposes



JPEG's perspective on Embodied AI challenges



A continuously evolving family of standards



The scope of **JPEG XS** is to provide a **low-latency lightweight image coding** system, replacing uncompressed image and video everywhere.

JPEG XS is the first coding standard that offers high-quality contents with REDUCED complexity and ultra-low latency



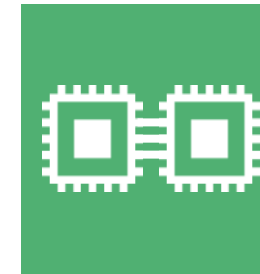
IP Production
Remote production
Remote VAR



Cloud processing
Storage,
Connectivity



Automotive
connectivity



Chip-to-chip
interface



Medical



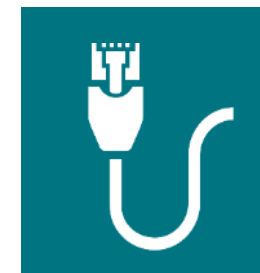
Displays
& Mobile



AR/VR HMD
Gaming



Wireless
(60GHz, WiFi-6E,
5G)



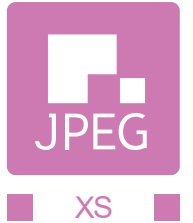
AV-over-IP
KVMs



Digital
photography
(raw)

EVERYWHERE where uncompressed is the norm

Key benefits



Open standard

Series of open standards
(ISO 21122-x)



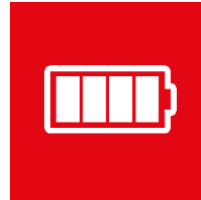
Visually lossless

Fully transparent at 3 bpp
(for lossless & near-lossless coding)

Visually lossless at 1.5 bpp

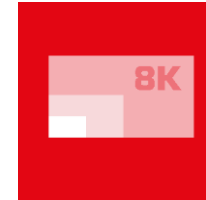
Additional TDC profiles for screen
and desktop content

Constant quality



Low power

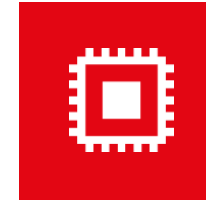
No external memory,
only a few internal
SRAMs



Better quality pixels

More pixels, higher bit
depth, high frame rates,
all at the cost of baseband
HD

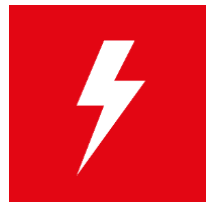
HDR capability



Ultra-low complexity

Low logic & low memory in
ASIC or FPGA

Highly parallelizable for
CPU & GPU



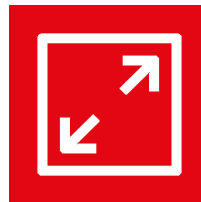
Microsecond latency

Line-based processing (or
even less than a line)



Any platform

IP-cores & Libraries for
CPU, GPU, FPGA, and
ASIC



Multi-res handling

Multiple layers of resolution
in the compressed domain



Error concealment

To packet losses for
unpredictable networks
(WiFi, 60Ghz, 5G)



Industry adoption

Supported by
multiple industry
standards

JPEG XS and supporting standards



■ XS ■

ITEM	DESCRIPTION
JPEG XS (ISO/IEC 21122)	-1 : Core coding system
	-2 : Profiles and buffer models
	-3 : Transport and container formats (color, video,...)
	-4 : Conformance testing
	-5 : Reference software
IETF RTP	IETF RFC9134 JPEG XS RTP payload
ST 2110-22	Encapsulation of compressed video in ST 2110 (for Media & ProAV) VSF TR08 provides recommendations for Intra Facilities, Inter-Facilities & IPMX,
TS format	MPEG-2 Transport Stream (TS) wrapper for JPEG XS VSF TR07 provides recommendation for WAN transmission
MXF format	MXF video file encapsulation (SMPTE ST 2124)
HEIF format	High Efficiency Image File Format, <i>for storing of mixed image and video content</i>
JXS format	JPEG XS File format, <i>for storing of single images</i>
MP4 format	ISO Base Media File format (ISOBMFF), <i>for storing video file</i>
NMOS protocol	AMWA BCP-006-01 v1.0.0 – NMOS with JPEG XS
GenICam GenDC	Adds support in GenICam, USB3 Vision, GigE Vision, and many more specifications that rely on GenDC



The JPEG AI scope is the creation of a learning-based image coding standard offering a **single-stream, compact**, compressed domain representation, targeting both **human visualization**, with significant compression efficiency improvement over image coding standards in common use at equivalent subjective quality, as well as effective performance for **image processing** and **computer vision** tasks, with the goal of supporting a **royalty-free baseline**

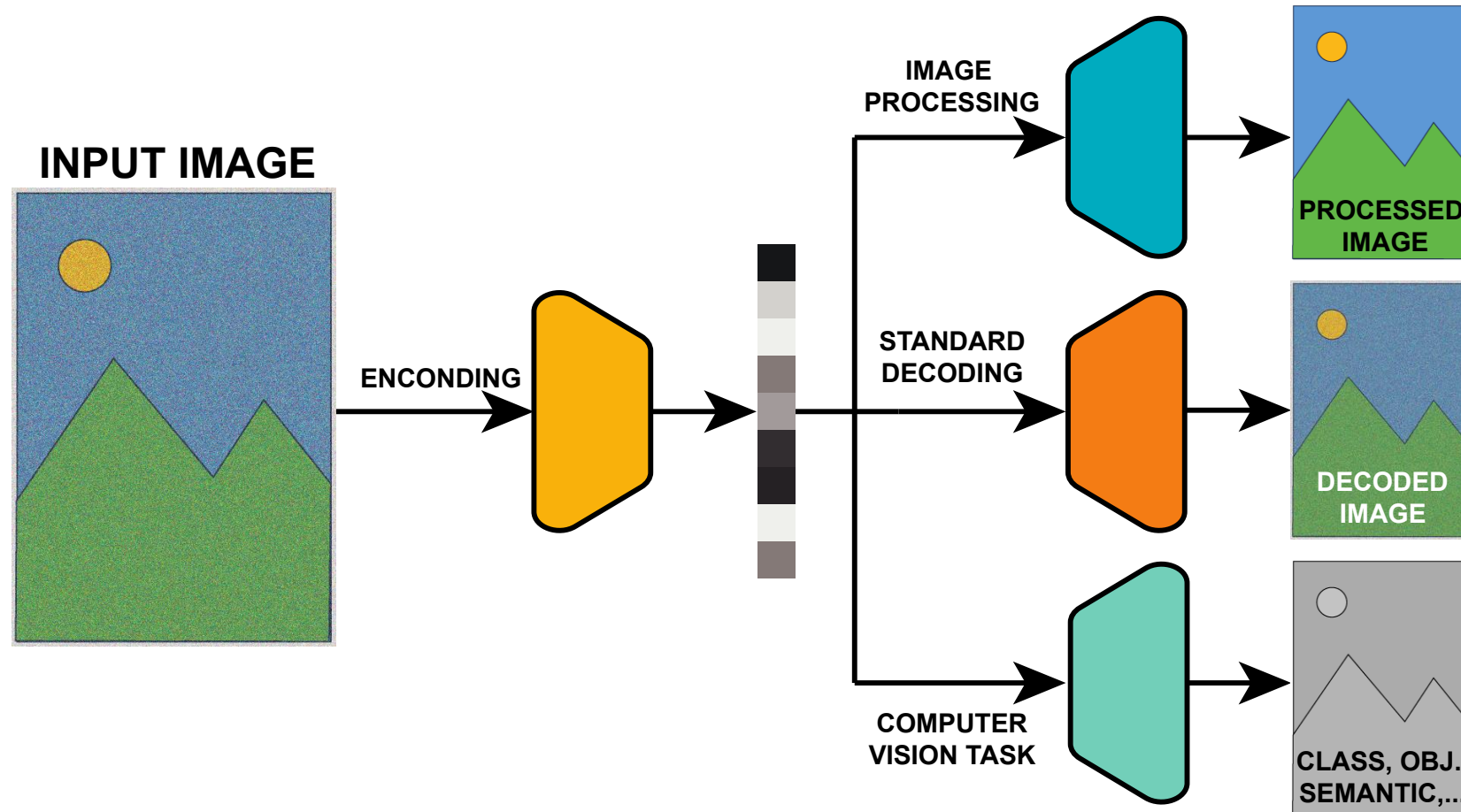
**The JPEG AI is a joint standardization effort between
ISO/IEC JTC1/SC29/WG1 and ITU-T SG21**

JPEG AI is the first coding standard that leverages artificial intelligence for superior coding efficiency while taking into account the requirements of AI-powered content processing and analytics

Requirements

- **High coding efficiency** is important for many applications such as cloud storage or media distribution
 - AI-powered architectures have demonstrated to be particularly efficient in coding
- **Content understanding** is vital for many applications such as visual surveillance, autonomous vehicles, image collection management, etc.
 - Objects may need to be recognized
 - Images may need to be classified for organization purposes
 - Actions or events may need to be recognized
- **Content enhancement** is desirable in many applications such as in media distribution
 - Noise can be reduced
 - Resolution can be increased
 - Colors can be corrected
- Separate **content coding for machines** and **content coding for humans** hinders interoperability and increases complexity in applications that require both
 - Why two codecs when one can do both?
 - In many applications, the same content is consumed by both humans and machines

JPEG AI triple-purpose framework





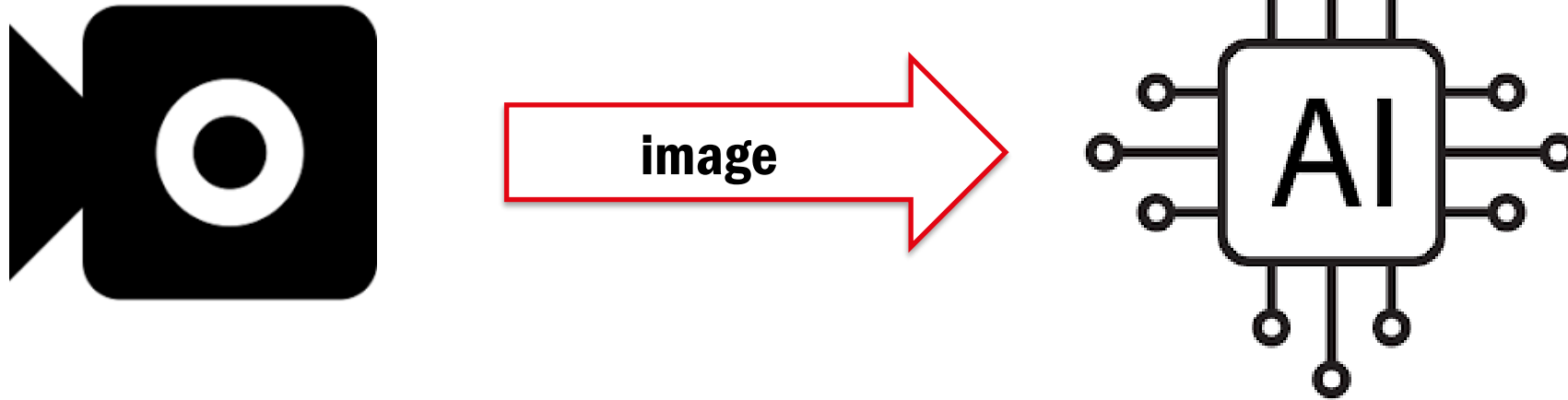
VERSION 1 (already published)

- Version 1 addresses several (but not all) JPEG AI ‘core’ and ‘desirable’ requirements with **emphasis on compression efficiency**.

VERSION 2 (in progress)

- Version 2 will address/include:
 - JPEG AI requirements not yet addressed in Version 1, e.g. **processing and computer vision** tasks
 - Significantly improved tools** for JPEG AI requirements already addressed in Version 1, e.g. compression efficiency.

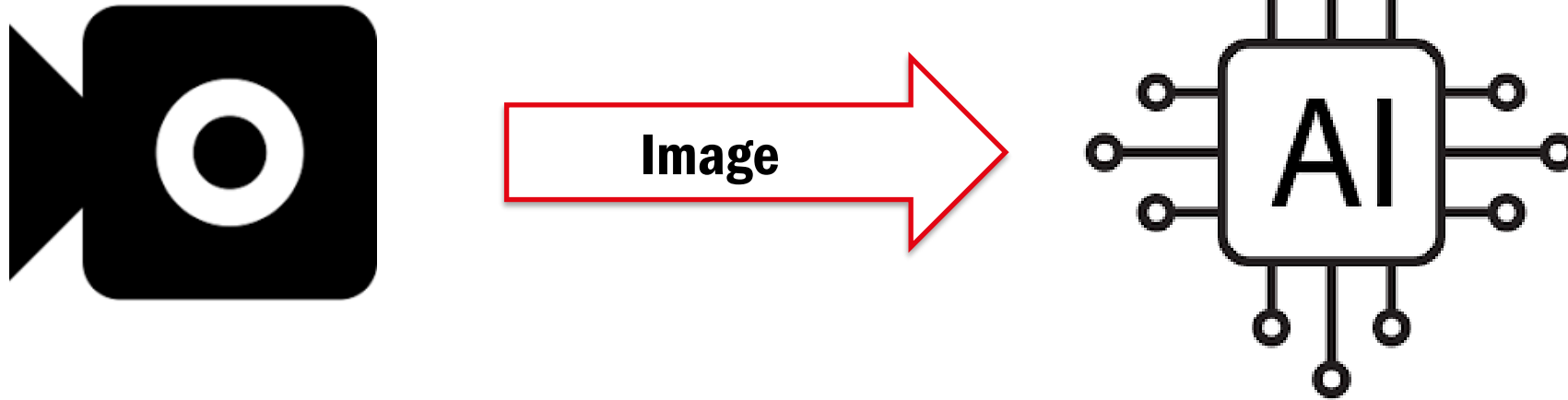
An observation about today's AI-powered content coding paradigm



Not inspired by biological sensing

Inspired by biological computation
(autoencoder and DNN)

An observation about today's AI-powered image coding paradigm



~~Not inspired~~ by biological sensing
Inspired

**Inspired by biological computation
(autoencoder and DNN)**

FRAME-BASED



EVENT-BASED



XE

1. Sequential static pictures (frames)
2. Clock-driven (pre-defined frame rate)
3. Requires minimum exposure time
4. Fixed amounts of data in raw format
5. Appealing to human consumption

1. Continuous events (asynchronous intelligent pixels)
2. Scene-driven (1 μ s time resolution - 10'000 fps equivalent)
3. Little exposure time (120dB HDR / 40mlux low light sensitivity)
4. Amount of data varies with scene dynamics (10x to 1000x less)
5. Efficient data for machine vision

The scope of JPEG XE is the creation and development of a standard to **represent Events** in an efficient way allowing **interoperability** between sensing, storage, and processing, targeting machine vision applications.

The JPEG XE is planned to become a joint standardization effort between ISO/IEC JTC1/SC29/WG1 and ITU-T SG21.”

JPEG XE will be the first international standard for coding of events

Requirements

- Efficient **coding, storage, compression** and **transmission** of event data
 - Better compression
 - Low memory requirements
 - Low power requirements
 - Low end-to-end latency
 - Low complexity
 - Recovery of absolute time-base
 - Interoperability with neural network processing architectures
 - Random access
- **Interoperability** with major **interface** specifications and protocols
 - Ease of **adoption** by **industry protocols** (DCMI, MIPI, ...)



- Lossless coding
 - Urgently needed in many of today's use cases
 - Two scenarios
 - **Constrained scenario**: Extreme low computational complexity, willing to sacrifice compression efficiency (**phase 1**)
 - **Unconstrained scenario**: More computational resources, aim for the highest possible compression efficiency (**phase 2**)
- Lossy coding (**phase 3**)
 - Desired by many use cases and tasks in the near future
 - Tasks allow assessing the impact of lossy compression.
 - Difficult to assess the impact of loss. Requires dedicated new metrics

Last words...

- JPEG has several standards and specifications that are relevant to embodied intelligence applications
- In addition to those mentioned in this talk, other relevant standards and specifications include:
 - JPEG XL
 - JPEG Systems Part 4: Privacy and Security
 - JPEG Systems Part 5: JPEG Universal Metadata Box Format (JUMBF)
 - JPEG Pleno Learning Based Point Cloud Coding
 - JPEG AIC: Assessment of Image Coding



■ XL ■



■ Systems ■



■ Pleno ■



■ AIC ■

More information

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