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# MNEMOSENE

## Computation-in-Memory Architecture based on Resistive Devices

**Said Hamdioui**

Delft University of Technology

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 **TU Delft**

**RWTH**AACHEN  
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*Inria*  
INVENTEURS DU MONDE NUMÉRIQUE

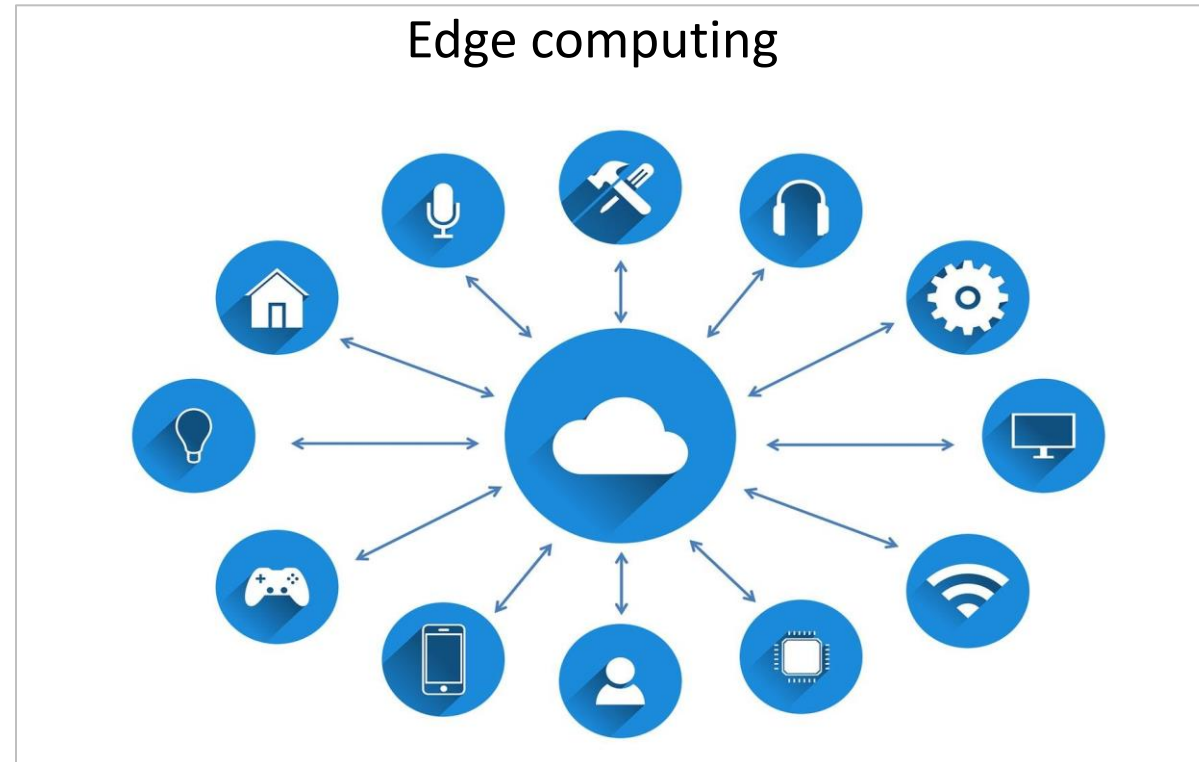
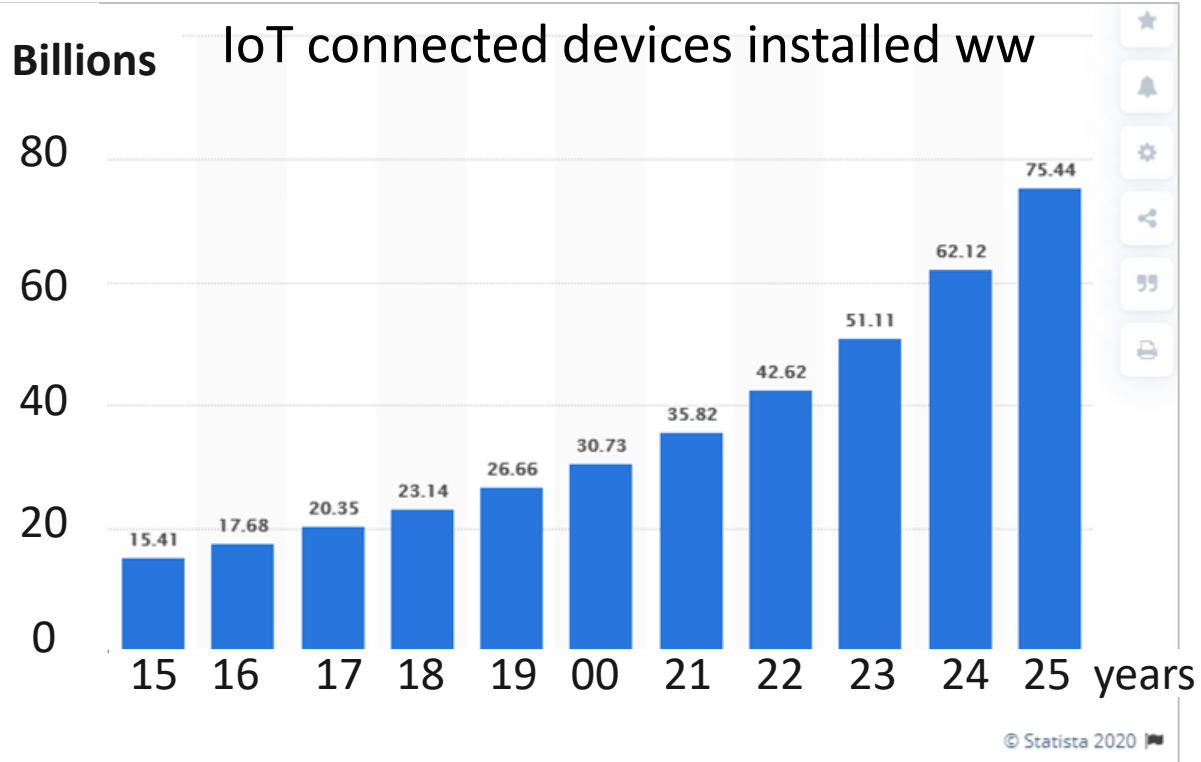
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# The opportunity: IoT-edge partnership



## Many requirements

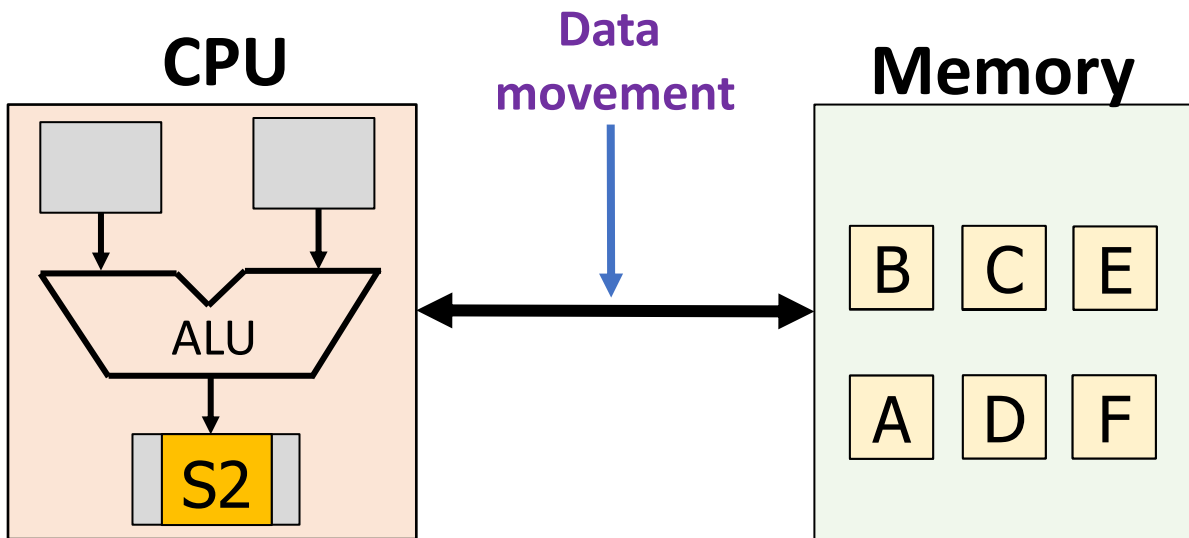
- **Energy constraints**
- Local computing
- More storage
- Data privacy
- Real-time decisions
- 24/7



# The challenges: Data movement & static power

- Energy in conventional computer

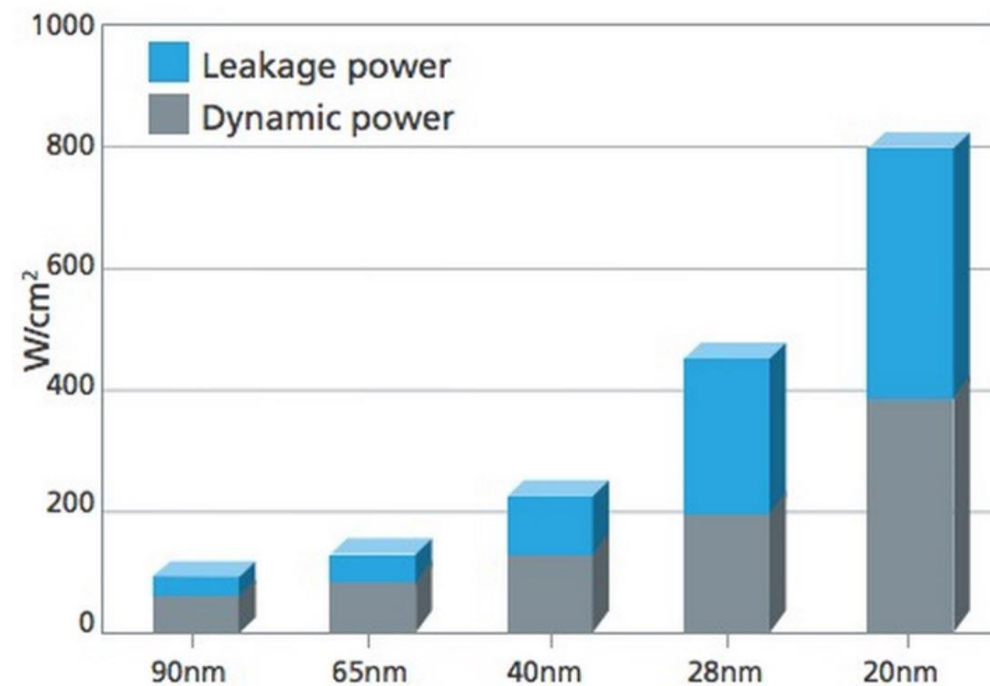
- $S1 = A + B$



Action (8 bit oper.)	Energy (45nm)	Relative (vs. ALU)
Add operation (ALU)	0.05 pJ	1X
Send to memory	320 pJ	6.400X

*Need of new (unconventional)  
Architectures*

- Conventional technology



<https://semiengineering.com/>

*Need of new (unconventional)  
Technologies*



# The solution: MNEMOSENE

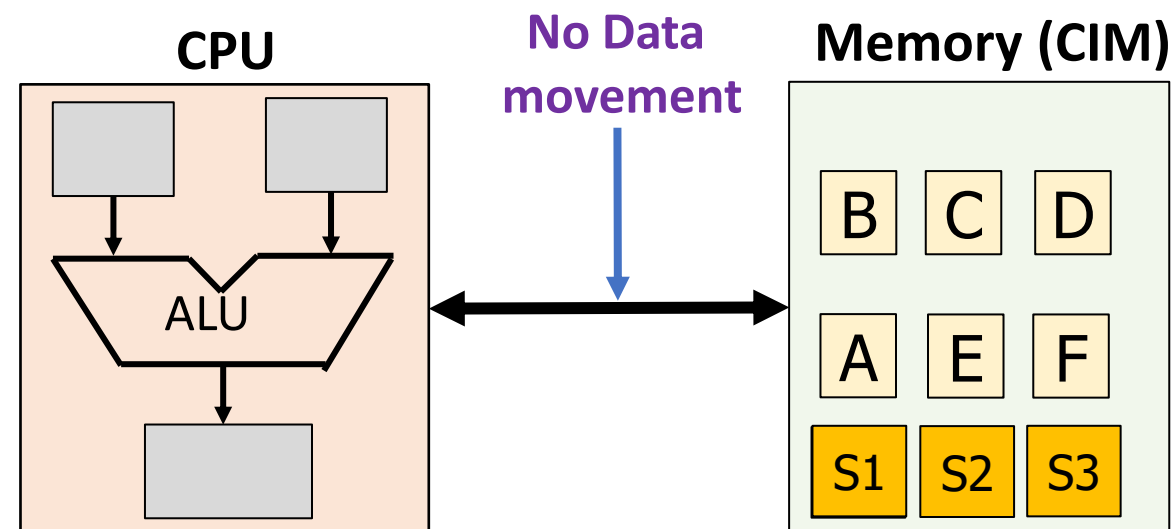
*Explore **alternatives architectures** in the light of emerging **non-volatile device technologies***

- **Computation-In Memory (CIM)**

- Single operation:  $S1 = A + B$
- Parallel operations

- **Use memristor devices**

- Practically **leakage is zero**

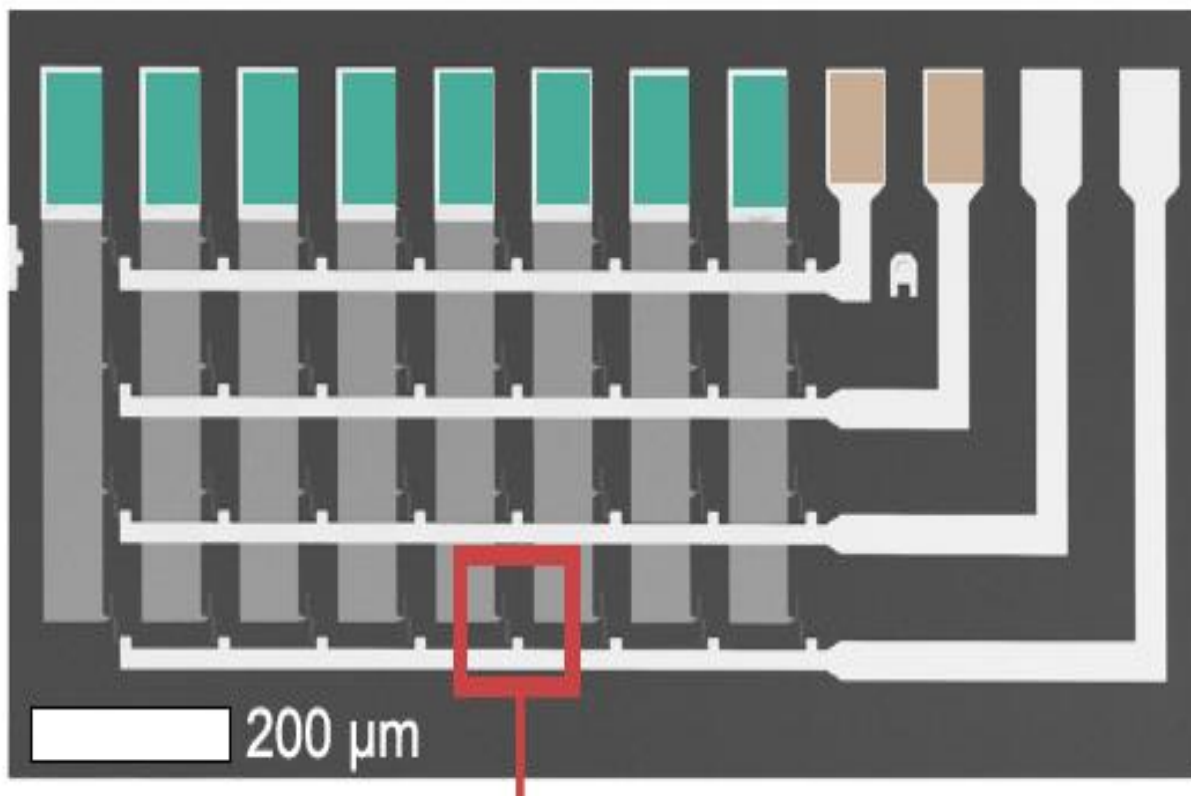


Improve the **energy efficiency** and **performance efficiency** by a factor of **10X to 100X**



## One selected highlight

### Heart disease-related Database (TUD, IBM): CIM demo



[Source: Iason Giannopoulos et.al, "In-Memory Database Query", Advanced Intelligent Systems, open access, 2020]

- **11-step** query in **36 ns**

Throughput: **92.9 GOPS**

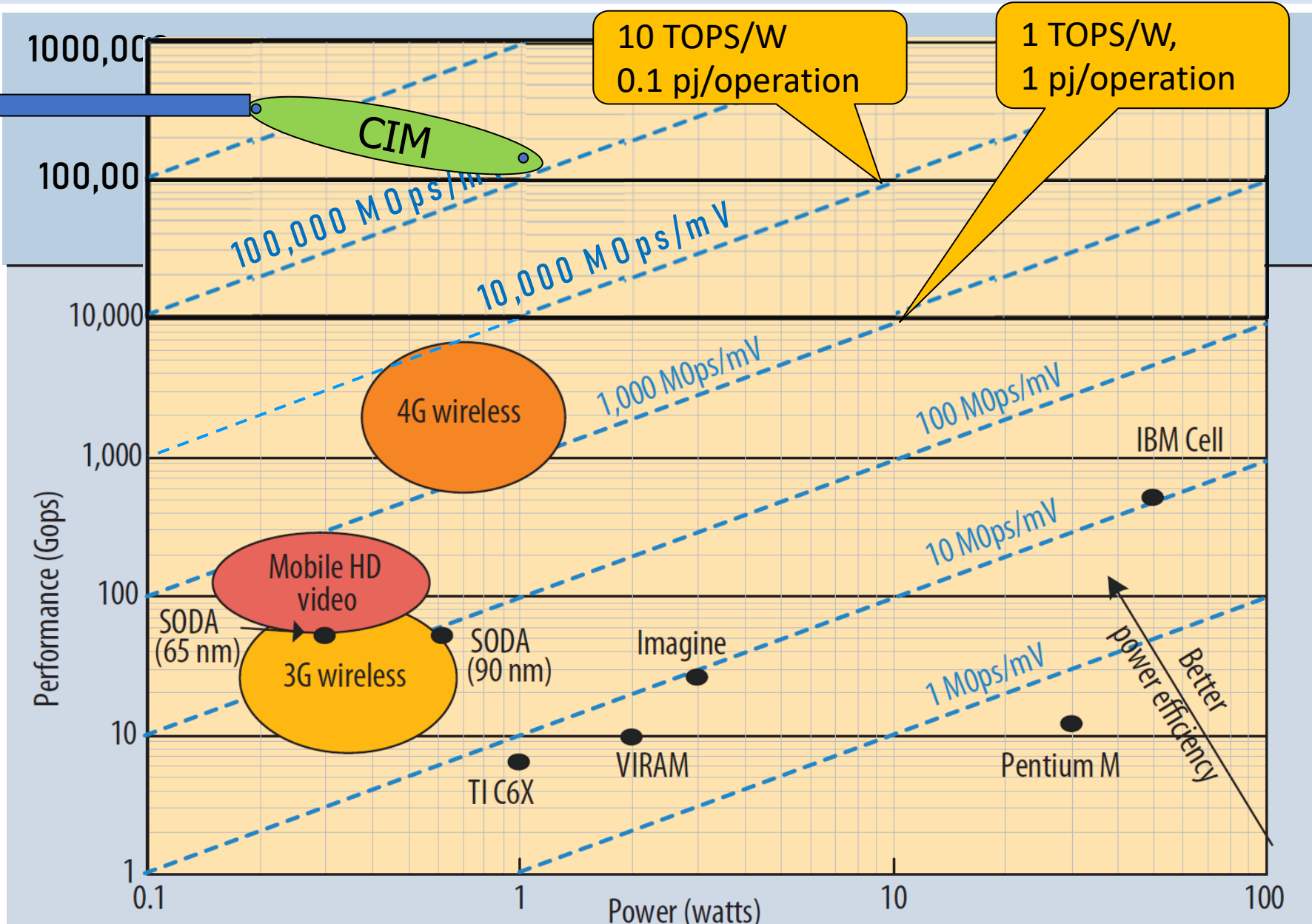
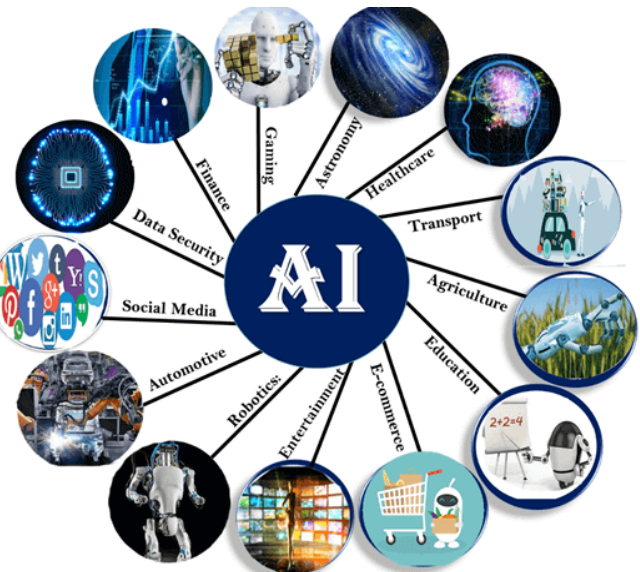
- Total energy: **20 pJ** (power: 558  $\mu$ W)

Efficiency: **166 TOPS/W**

Efficiency = **< 1pJ/operation**

# Potential of CIM: Enabling edge/IoT applications

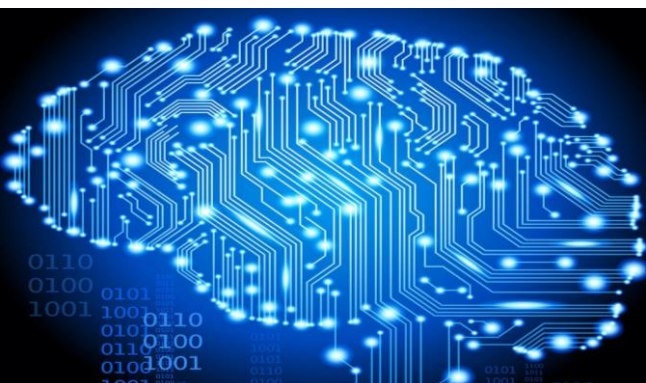
Enable  
deployment of  
AI at the edge







# Conclusion



- Enabling cost effective computation of currently infeasible **AI edge applications** fueling important societal changes; e.g., personalized healthcare
- Support breakthrough development in **Neuromorphic Computing**
- Puts **Europe in a leading position** in the areas of unconventional computer architectures and memristive technology.



<http://www.mnemosene.eu/>



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