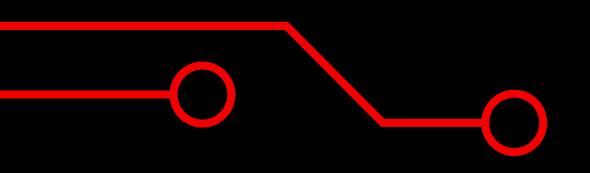
## **VIVIENNE SZE**

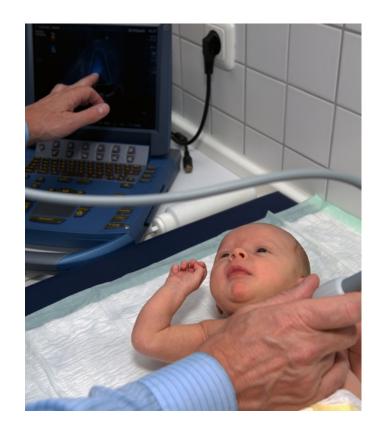
**Energy-Efficient AI** 



## Processing at the "Edge" Instead of in the "Cloud"



#### Communication



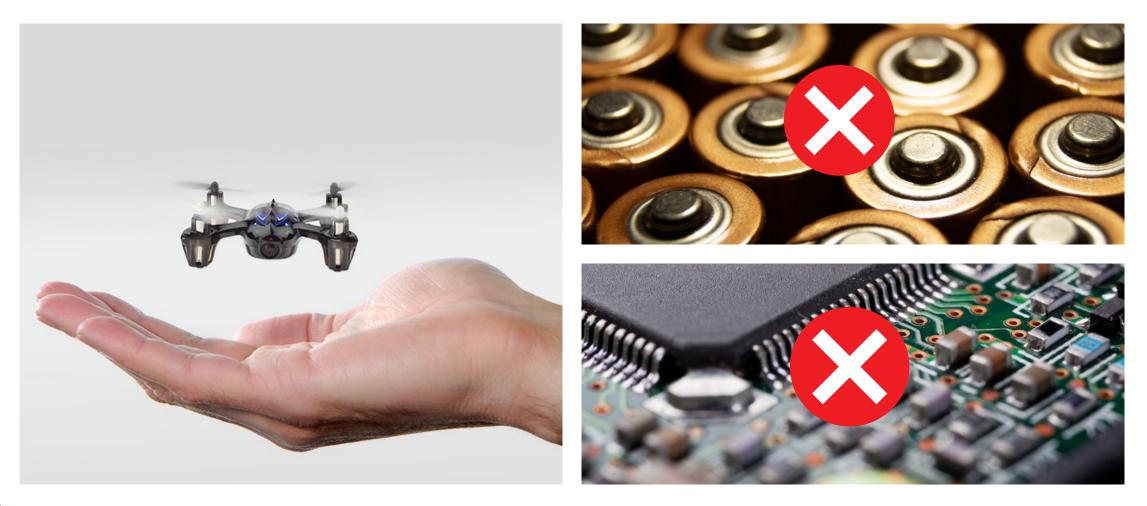


#### **Privacy**

Latency

### Self-driving car prototypes use approximately 2,500 Watts of computing power.

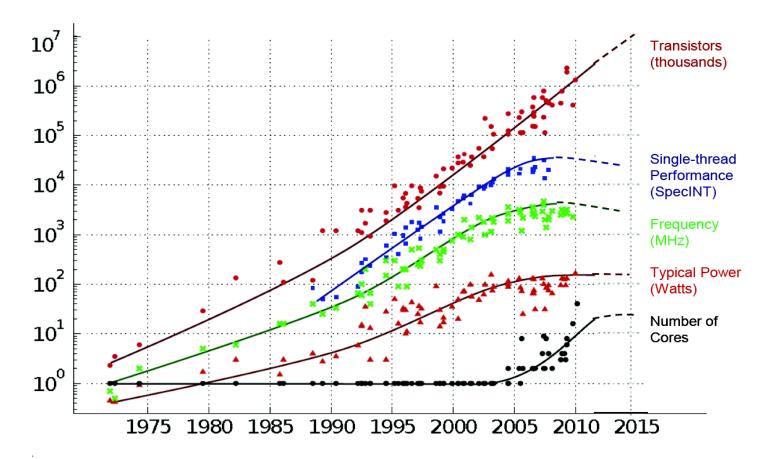
# Existing Processors Consume Too Much Power



< 1 Watt

> 10 Watts

#### 35 YEARS OF MICROPROCESSOR TREND DATA

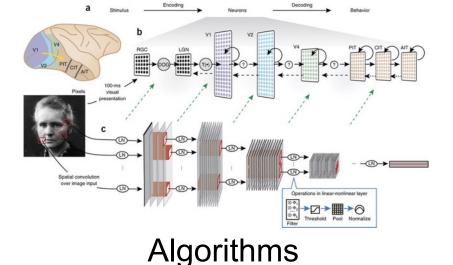


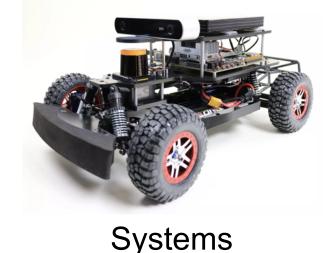
Original data collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond and C. Batten Dotted line extrapolations by C. Moore

#### **Transistors Are Not Becoming More Efficient**

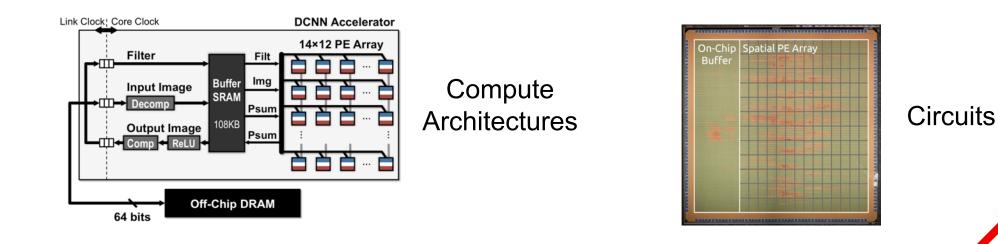


## **C** Energy-Efficient AI with Cross-Layer Design





**Specialized Compute Hardware** 



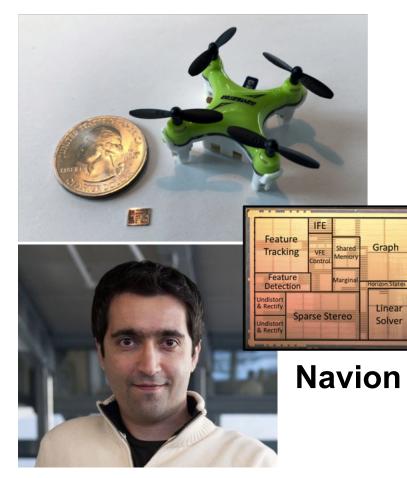
### **Deep Neural Networks**

- Cornerstone of AI applications
- Specialized hardware focuses on reducing data movement and memory accesses
- Image classification under a third of a Watt
- > 10x energy reduction comparable to mobile GPU

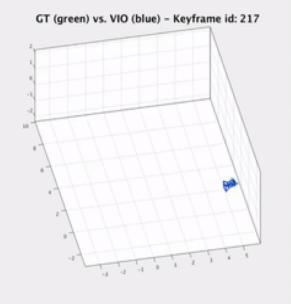
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# Robot Localization Under a Tenth of a Watt







<sup>[</sup>EuRoC Dataset]

Sertac Karaman









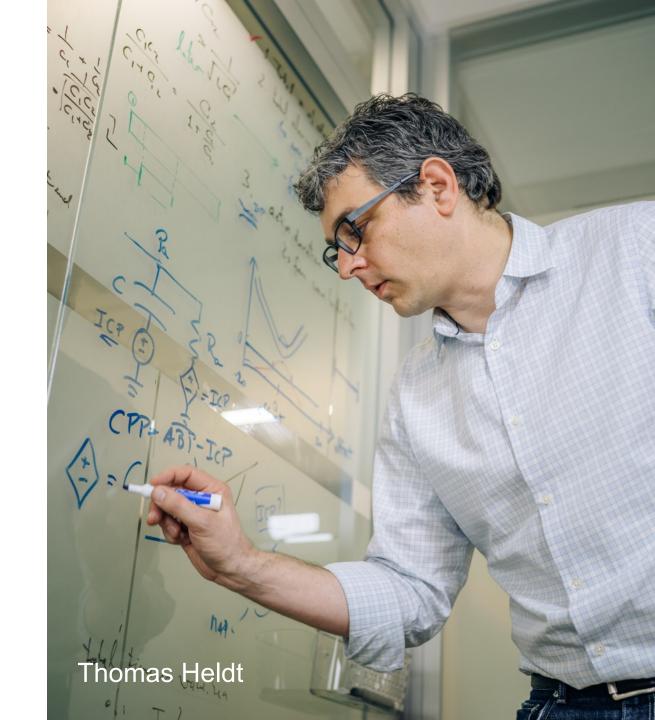


Miniature Satellites

Origami Robots

### Neuropsychological Testing

- Important component in treatment of:
  - traumatic brain injury
  - dementia
  - psychiatric disorders
- Assessments are:
  - pencil and paper test
  - time consuming
  - require a trained specialist
- Repeat assessments are:
  - sparse
  - mostly qualitative
  - high retest variability





We are investigating how to perform eye movement tests on a smart phone in order to enable low-cost, in-home measurements.

## "Whatever it is that [chip vendors and researchers] build will influence the progress of Al over the next decade."

Yann LeCun, Facebook's chief AI scientist