

# Computer Vision at the Edge and in the Cloud: Architectures, Algorithms, Processors, and Tools



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- Visual perception is rapidly becoming ubiquitous, because:
  - **Value:** Perceptive devices can be much more capable, safer, more autonomous, more secure and easier to use
  - **Effectiveness:** Vision algorithms are becoming good enough to be useful in the real world
  - **Affordability:** Advances in enabling technologies are shrinking the cost and power consumption required to deploy vision

“Computer vision” has crossed the chasm from expensive niche technology to become “embedded vision,” a ubiquitous technology

- Rapidly expanding, large-scale deployments in diverse markets: consumer, automotive, healthcare, entertainment, defense, retail, security, ...
- Implemented in embedded systems, the cloud, mobile devices, wearables



# Making Things More Autonomous, Efficient, Capable, Ease to Use



Image: technicultr.com



Image: DJI

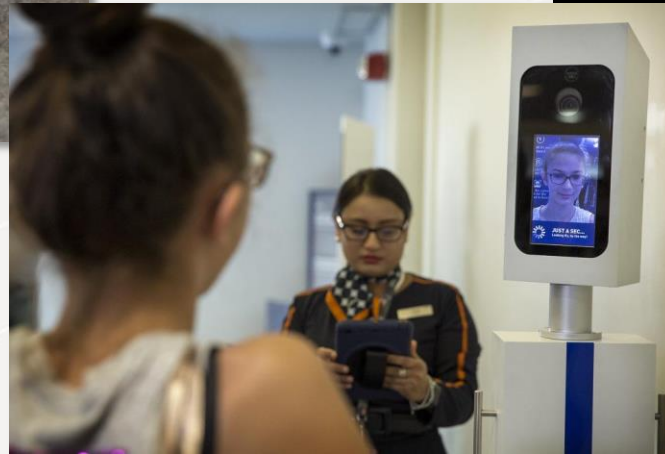
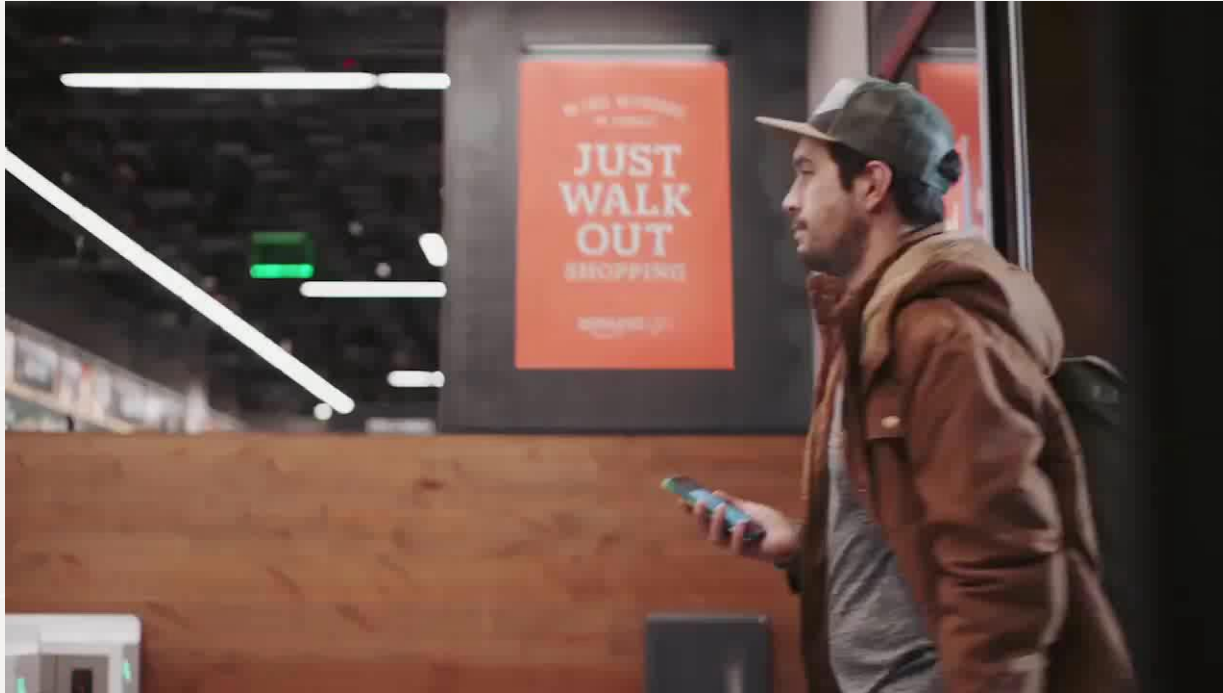


Image: WBUR



<https://www.youtube.com/watch?v=NrmMk1Myrxc>

# Perception Algorithms are Hard



[dot.gov](http://dot.gov)



[xkcd.com](http://xkcd.com)

IN CS, IT CAN BE HARD TO EXPLAIN  
THE DIFFERENCE BETWEEN THE EASY  
AND THE VIRTUALLY IMPOSSIBLE.

- Over the past 5 years, deep neural networks have enabled big advances in accuracy for many machine perception tasks

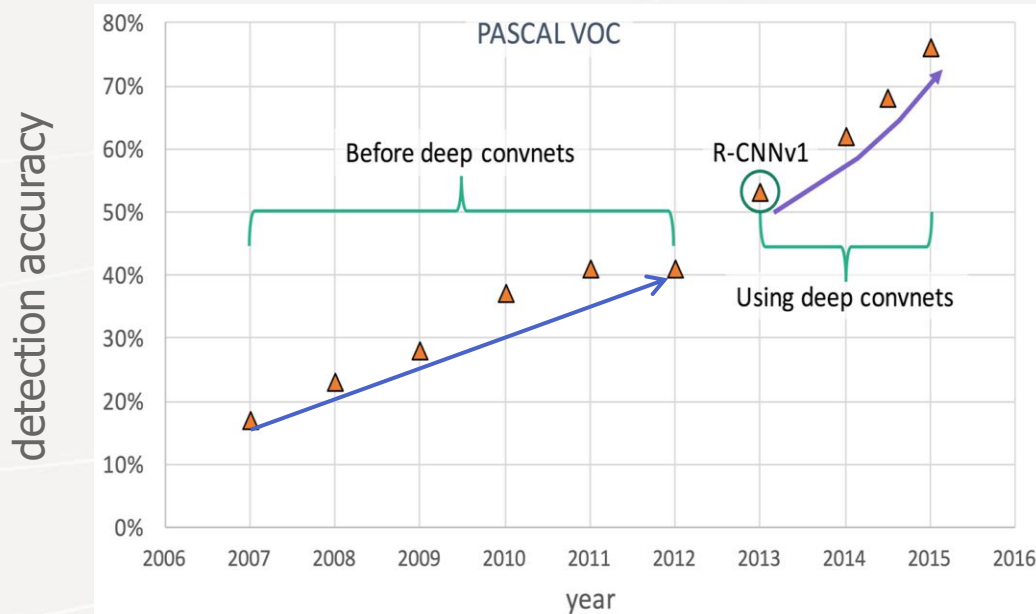
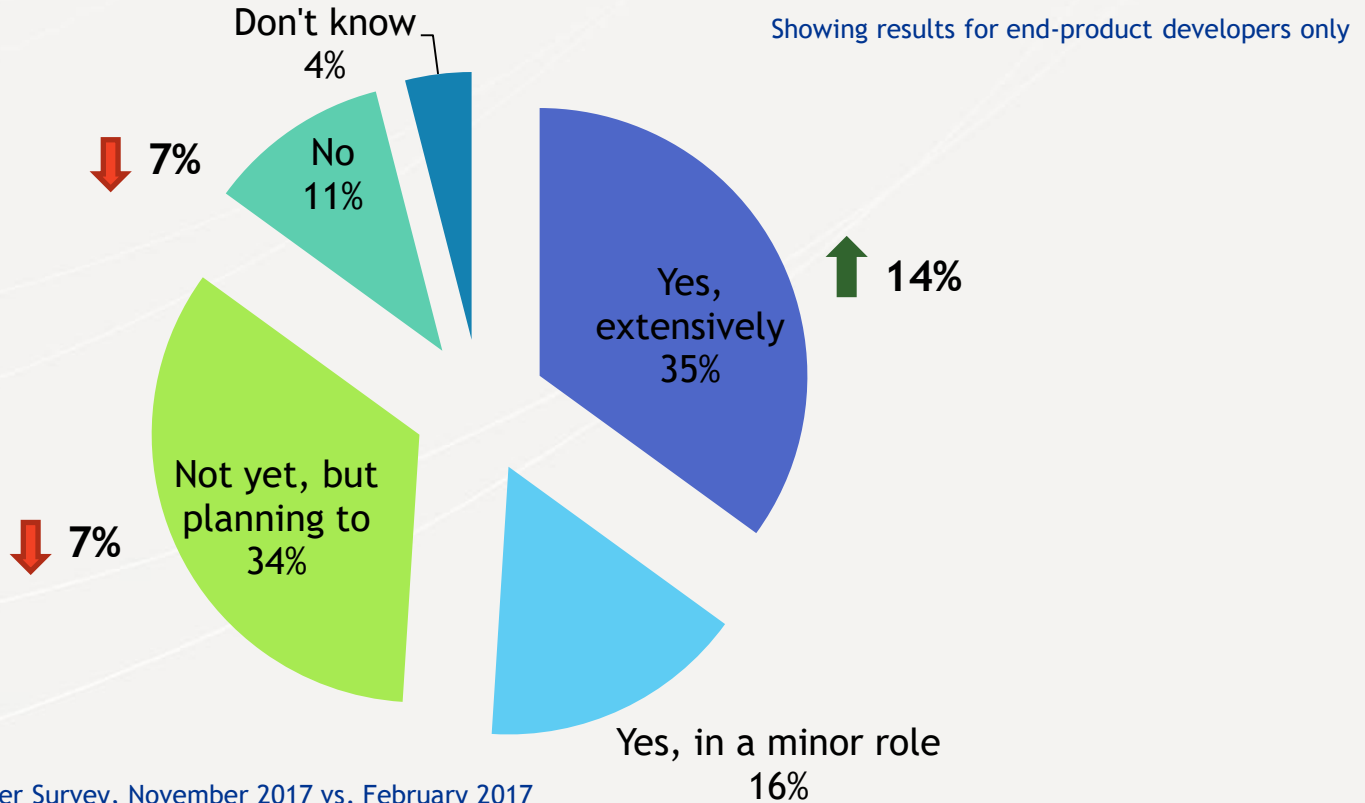


Image: R. Girshick

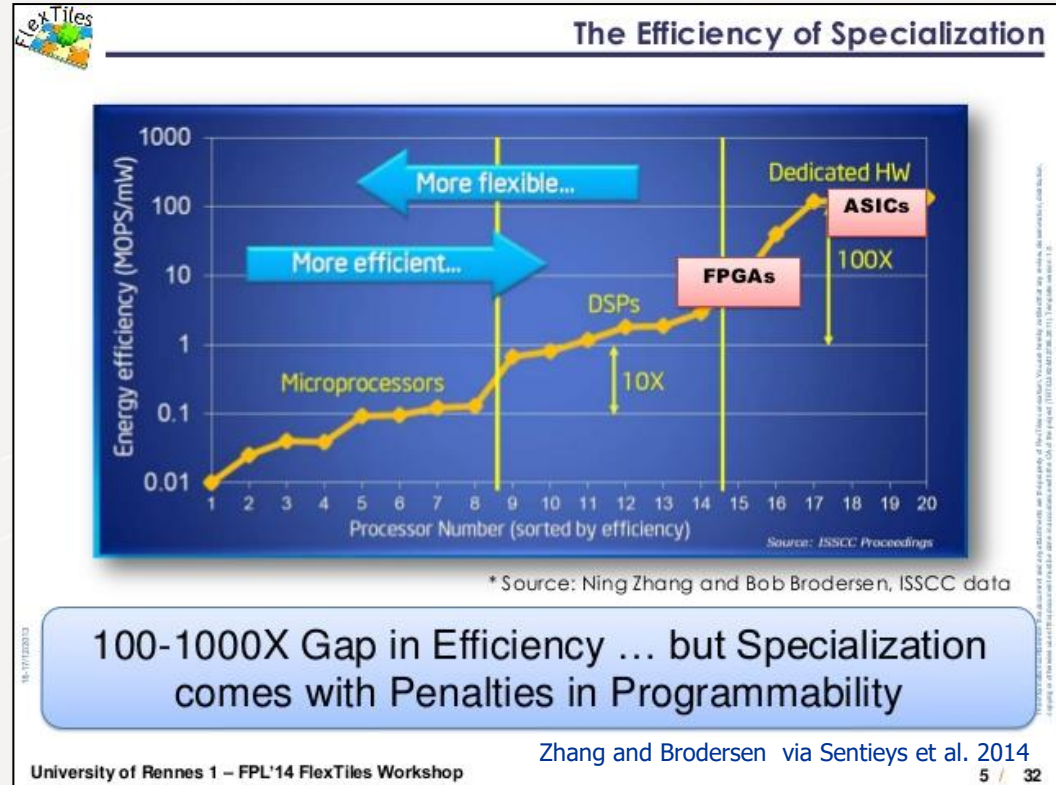
# Use of Neural Networks to Perform Computer Vision Functions



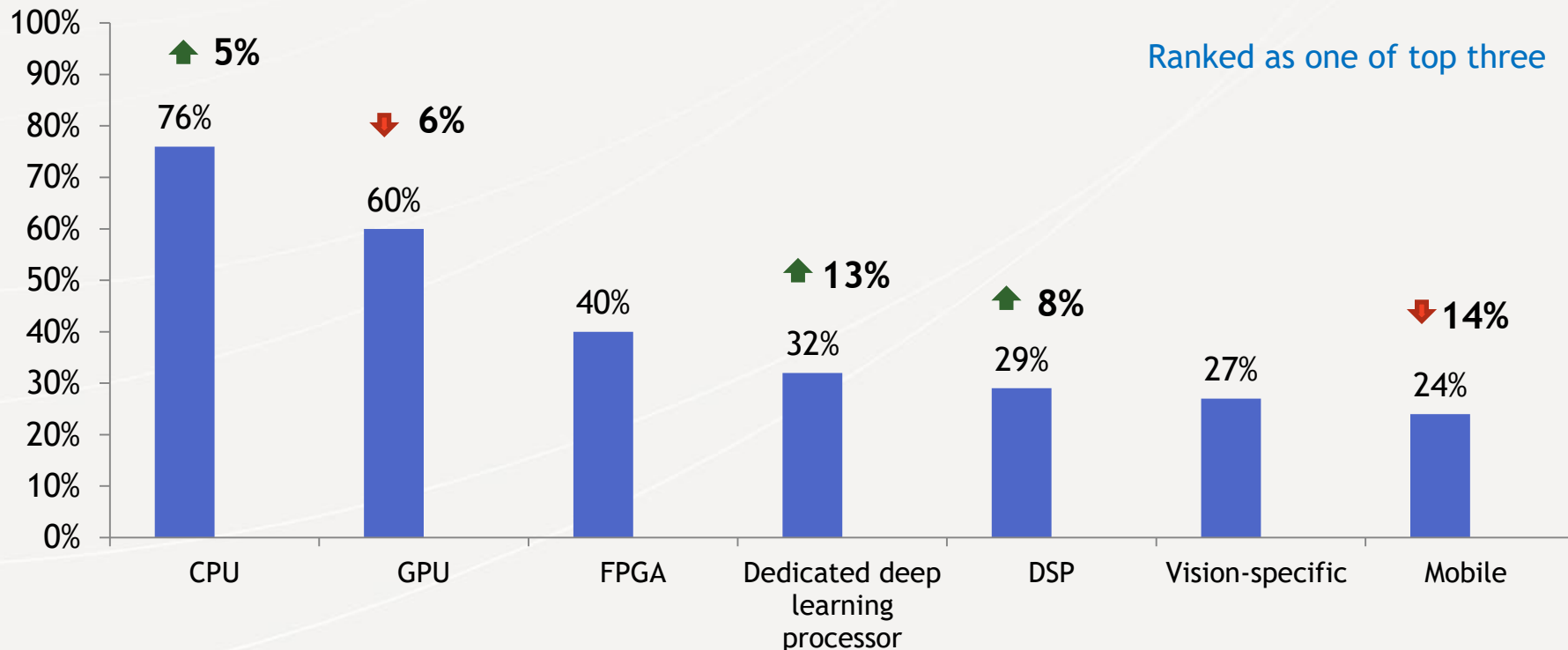
Embedded Vision Alliance Developer Survey, November 2017 vs. February 2017



For decades, chip designers have created specialized processors to get big gains in cost/performance and energy-efficiency



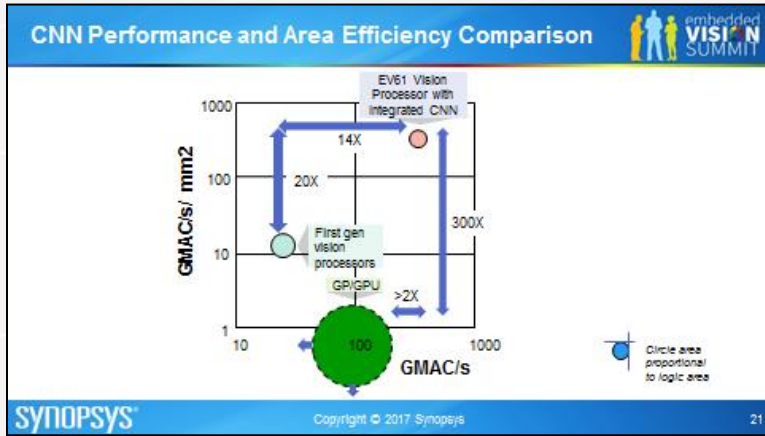
# Type of Processor Used for Vision Tasks



Embedded Vision Alliance Developer Survey, November 2017 vs. February 2017

Today, dozens of chip and IP core suppliers are creating processors specialized for deep neural networks

15x-  
300x



Pierre Paulin, Synopsys

## IPU 2.0 ACCELERATORS sub-system



### DEEP LEARNING ENGINE

~ 3 M gates, 1 MB SRAM,  
**30 mW** @ 30 frames/second



Petronel Bigioi, FotoNation

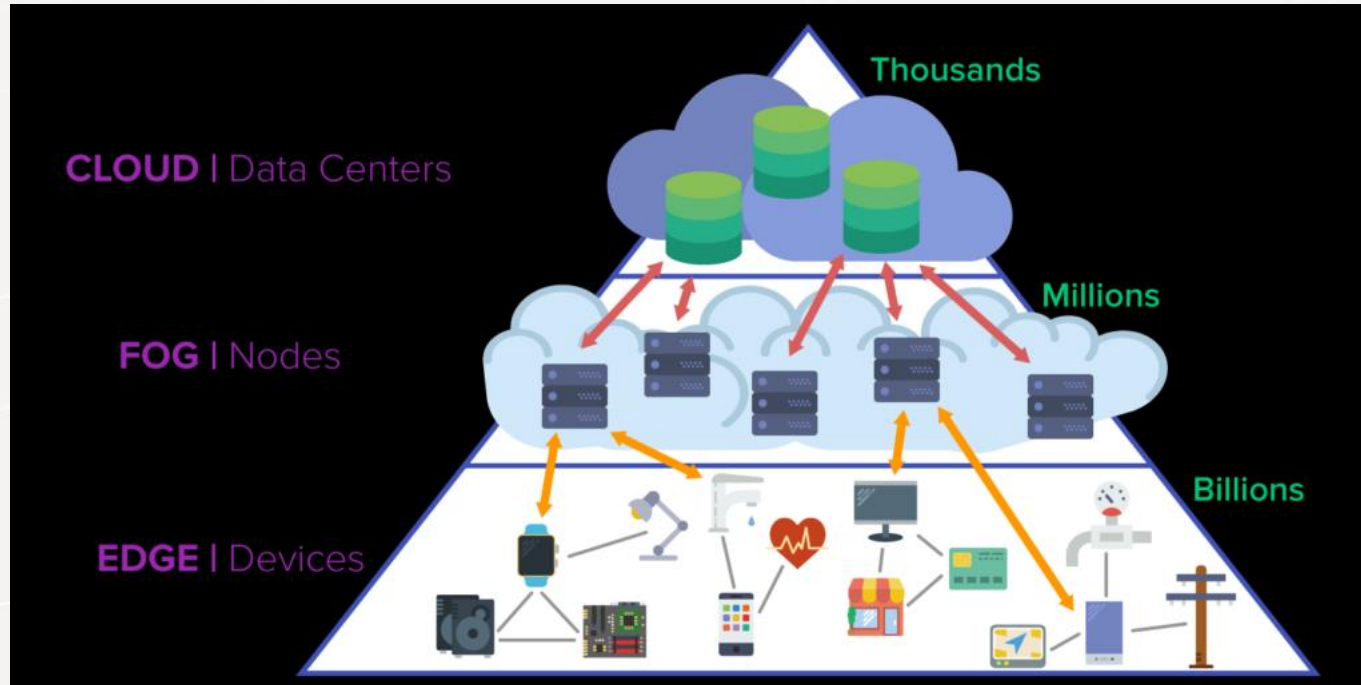


Image: erpinnews.com

## 5 Essential Characteristics of Cloud Computing

Ref: The NIST Definition of Cloud Computing

<http://csrc.nist.gov/publications/nistpubs/800-145/SP800-145.pdf>



On-demand  
self-service



Ubiquitous  
network  
access



Location  
transparent  
resource  
pooling



Rapid  
elasticity



Measured  
service with  
pay per use

Source: <http://aka.ms/532>

Image: microsoft.com

## 3 Cloud Service Delivery Methods



**SaaS**

**Consume  
the cloud**



**PaaS**

**Leverage  
the cloud**



**IaaS**

**Be a  
cloud**

Image: microsoft.com

## 2 Deployment Models

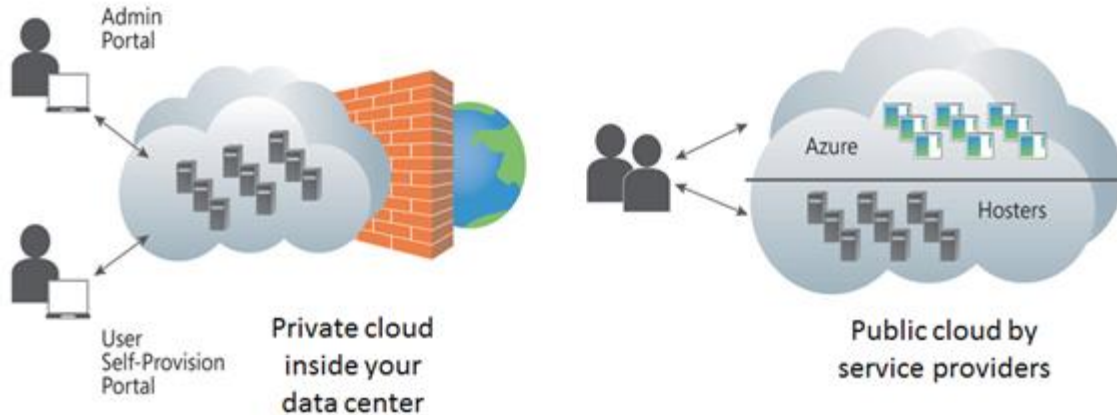
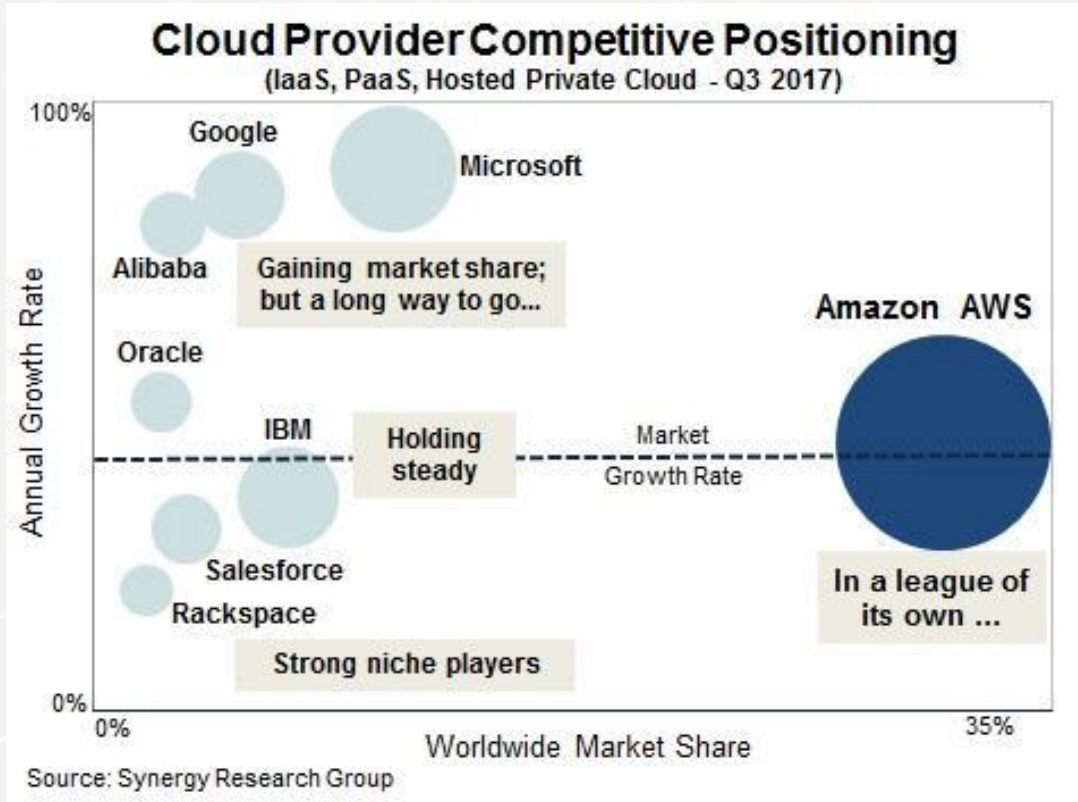


Image: microsoft.com





- Cloud-hosted APIs support common vision functions:
  - Object recognition/detection
  - Face recognition
  - People tracking
  - Age, gender, emotion analysis
  - Optical character recognition (including handwriting)
  - Scene analysis

 clarifai

 amazon  
web services

 gumgum<sup>®</sup>

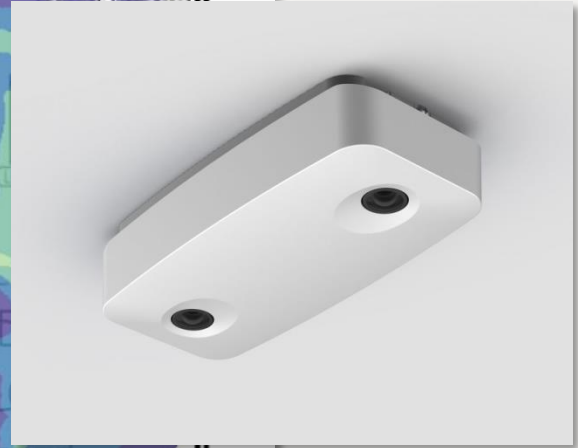
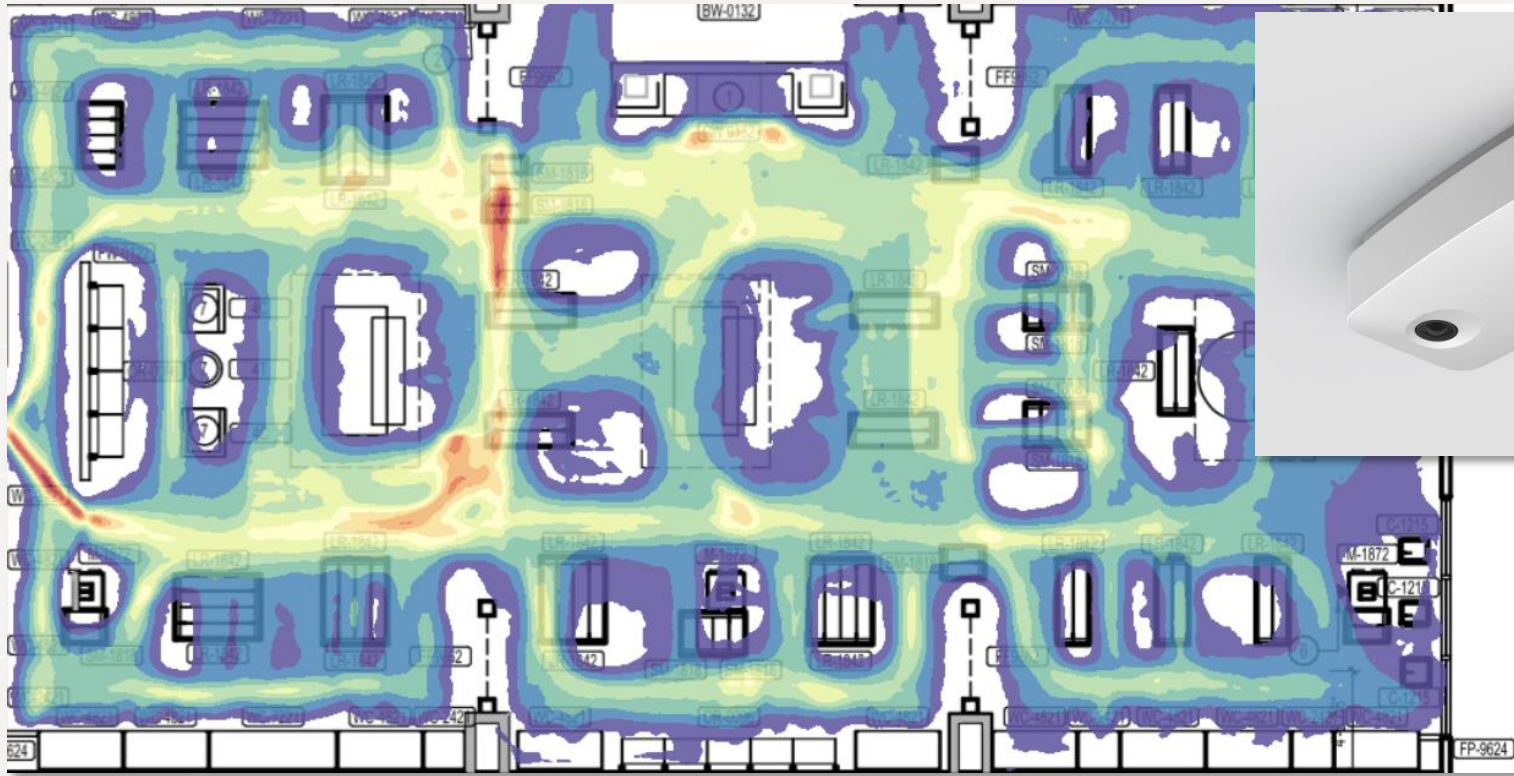
 Google  
Cloud Platform

 Microsoft Azure

 IBM Watson

- Cloud-hosted tools and frameworks facilitate creating your own vision functions and applications:
  - Pre-configured virtual machines (e.g., AWS AMIs)
  - Higher-level platforms (e.g., Amazon SageMaker)

# Edge or Cloud?



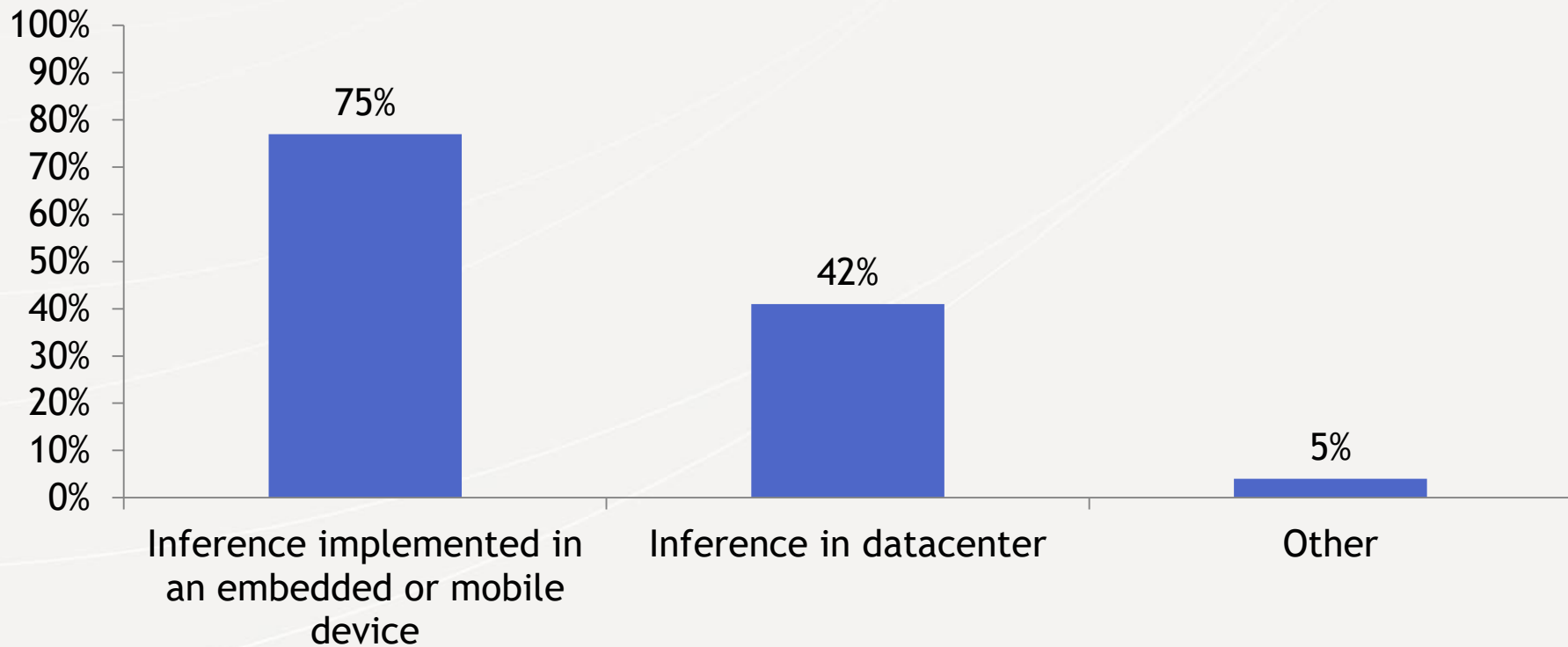
Images: RetailNext

	Edge	Cloud
Time-to-market		✓✓✓
Upgradability		✓✓
Accuracy		✓✓✓
Coordination among distributed devices		✓✓✓
Device cost		✓✓
Recurring costs	✓✓✓	
Internet connectivity, bandwidth required	✓✓✓	
Response time	✓✓✓	
Privacy/security	✓	

	Edge	Cloud
Latest algorithms	✓✓	✓✓✓
More powerful and efficient processors	✓✓✓	✓
Better software development tools	✓	✓✓✓

✓ = Available sooner

# How is Your Neural Network Deployed?



Embedded Vision Alliance Developer Survey, November 2017



<https://www.youtube.com/watch?v=JJPSsqMQajA>

# Case Study: Remote Check Deposit



Image: Bank of America



# Case Study: Camio Video Monitoring

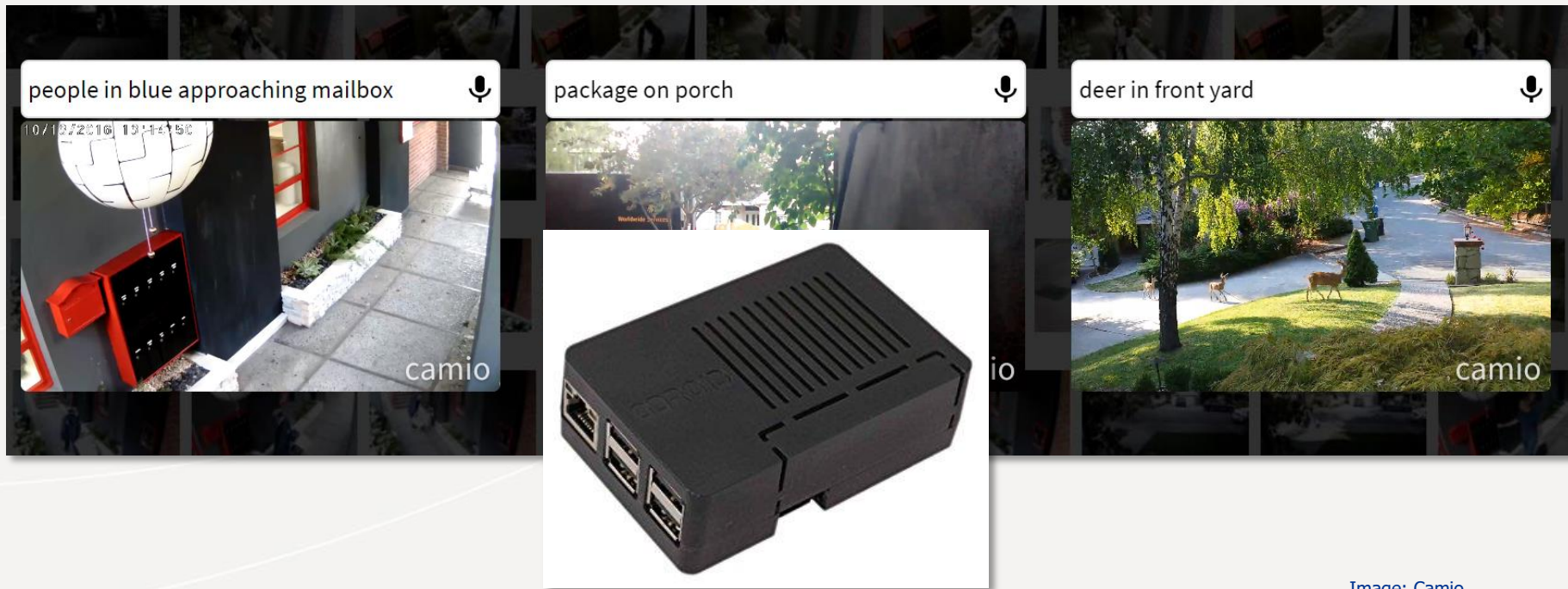


Image: Camio



<https://www.youtube.com/watch?v=o2FAMzhi2Eo>

# Case Study: Anki's Cozmo Interactive Robot



Image: Target.com

- Use Smart Device for heavy computation
  - Reduce robot cost
  - Better development environment

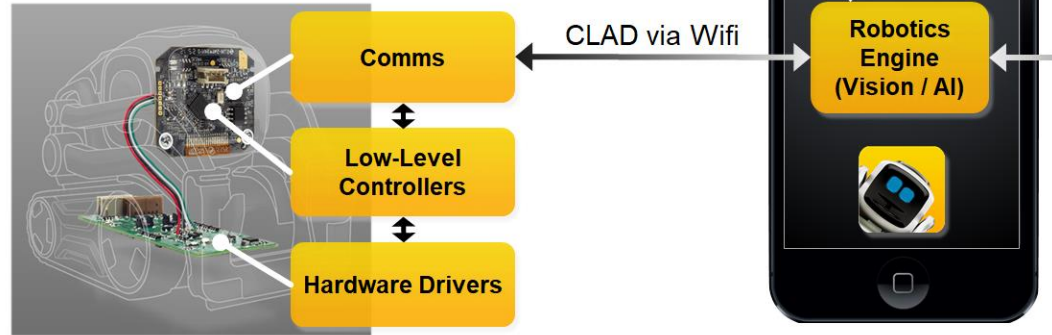
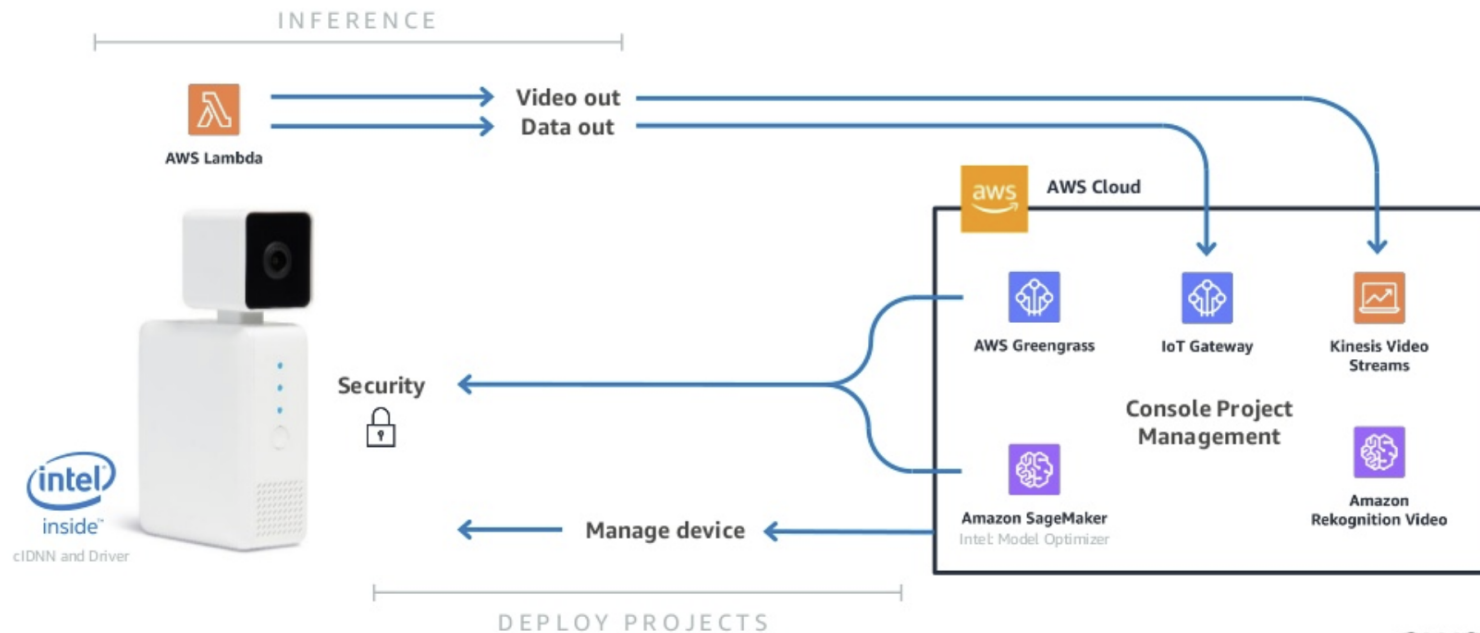


Image: Anki

## AWS DEEPLENS ARCHITECTURE



**AWS re:Invent**

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# Dee – DeepLens Educating Entertainer



[https://www.youtube.com/watch?v=dTXblzhq\\_po](https://www.youtube.com/watch?v=dTXblzhq_po)

- Thanks to improved algorithms, processors, tools and cloud services, thousands of diverse systems are now integrating vision...
- ...making them safer, more autonomous, easier to use and more capable
- Cloud platforms and services ease development and deployment for many applications
- The best allocation of processing to edge, fog and cloud requires balancing complex trade-offs unique to each application

# Empowering Product Creators to Harness Embedded Vision



The **Embedded Vision Alliance** ([www.Embedded-Vision.com](http://www.Embedded-Vision.com)) is a partnership of 75+ leading embedded vision technology and systems companies



**Mission:** Inspire and empower product creators to incorporate visual intelligence into their products

The Alliance provides practical technical educational resources for product developers



- Website offers tutorial articles, video presentations, etc.
- Register for the newsletter at [www.Embedded-Vision.com](http://www.Embedded-Vision.com)

Alliance membership provides companies with early insights and connections to customers and partners

Embedded Vision Insights  
*The Latest Developments on Designing Machines that See*

*The only industry event focused on enabling developers to create “machines that see”*

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

**Embedded Vision Summit 2018 highlights:**

- **Inspiring keynotes** by leading innovators
- **Practical technical, business and product talks**
- **Learn edge and cloud vision techniques** and trade-offs
- **New: Hands-on TensorFlow class** May 21
- *Visit [www.EmbeddedVisionSummit.com](http://www.EmbeddedVisionSummit.com) for details*

The logo for the Embedded Vision Summit 2018. It features the word "embedded" in a light blue, lowercase sans-serif font at the top. Below it, the word "VISION" is written in a large, bold, blue sans-serif font, with a rainbow-colored horizontal bar across the middle of the letters. Underneath "VISION", the word "SUMMIT" is written in a smaller, blue, uppercase sans-serif font, and "2018" is written in a large, blue, uppercase sans-serif font at the bottom.

*Enabling Computer Vision,  
At the Edge and In the Cloud*

*May 21-24, 2018  
Santa Clara, California*



# Embedded Vision Alliance Member Companies



Email me for:

- PDF file of these slides
- Details about the Embedded Vision Summit, May 21-24, 2018 in Santa Clara, California
- Information about how your company can become a Member of the Embedded Vision Alliance

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