# CSC 252: Computer Organization Spring 2022: Lecture 27

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#### **Announcements**

- Final exam: May 4, 19:15 PM -- 22:15 PM; online.
- Past exam & Problem set: <a href="https://www.cs.rochester.edu/courses/252/spring2022/handouts.html">https://www.cs.rochester.edu/courses/252/spring2022/handouts.html</a>
- Exam will be electronic using Gradescope, but we will send you an PDF version so that you can work offline in case
  - 1) you don't have Internet access at the exam time or
  - 2) you lose Internet access.
  - Write down the answers on a scratch paper, take pictures, and send us the pictures

#### **Announcements**

- Open book test: any sort of paper-based product, e.g., book, notes, magazine, old tests.
- Exams are designed to test your ability to apply what you have learned and not your memory (though a good memory could help).
- Nothing electronic (including laptop, cell phone, calculator, etc) other than the computer you use to take the exam.
- **Nothing biological**, including your roommate, husband, wife, your hamster, another professor, etc.
- "I don't know" gets 15% partial credit. Must erase everything else.

### Dark Silicon

n. [därk, sĭl'ĭ-kən, -kŏn']

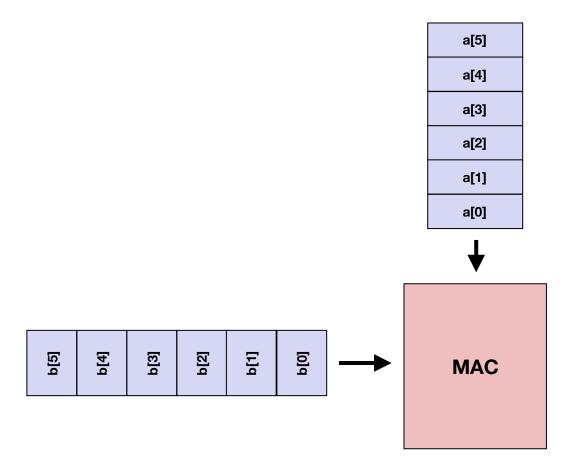
More transistors on chip (due to Moore's Law), but a growing fraction cannot actually be used due to power limits (due to the end of Dennard Scaling).

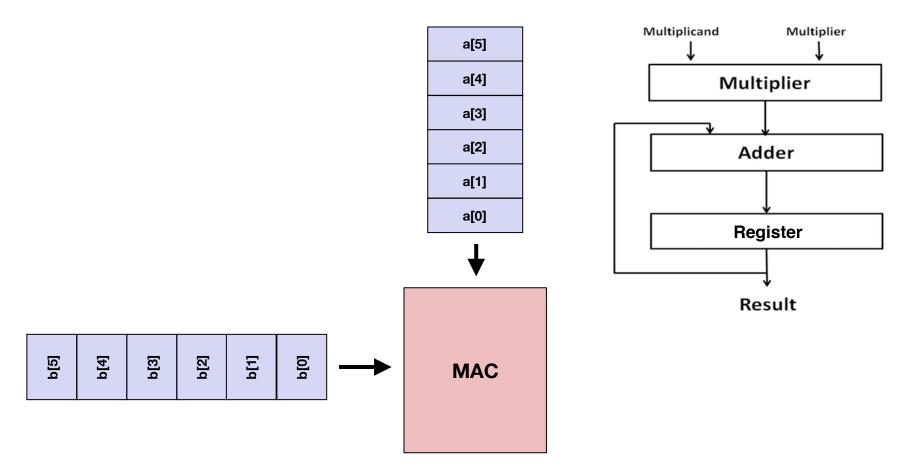
• GPUs are very efficient for massively parallel program

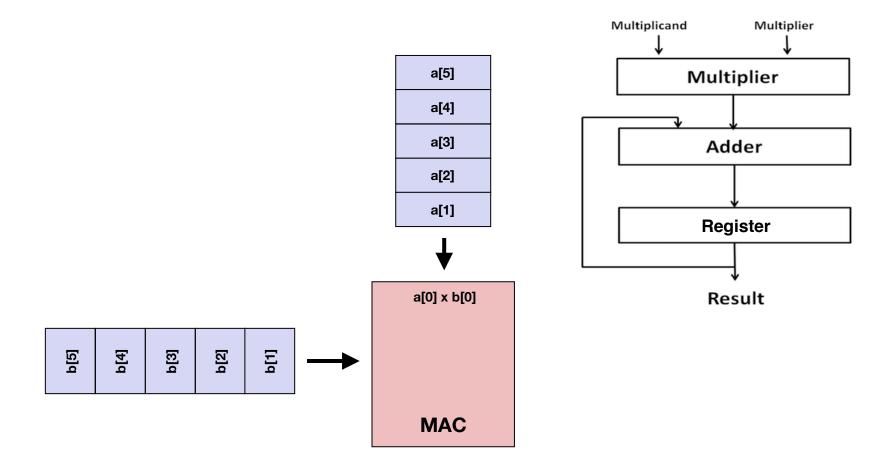
- GPUs are very efficient for massively parallel program
- But are still fairly general, so there are still many inefficiencies
  - Still need to fetch and decode instructions
  - Still have (very large) caches, so data delivery isn't efficient

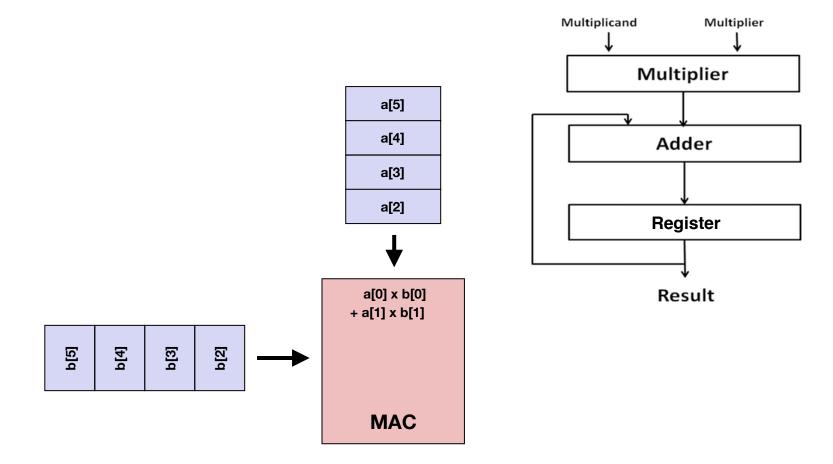
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- Idea: instead of building general-purpose processors that can do everything, but inefficiently, let's build specialized processors that can only do limited things, but extremely efficiently.

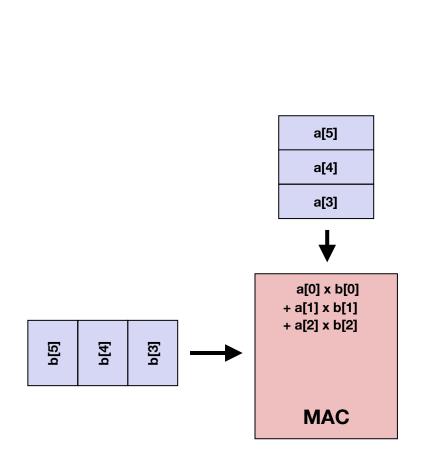
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- A.k.a., domain-specific accelerators

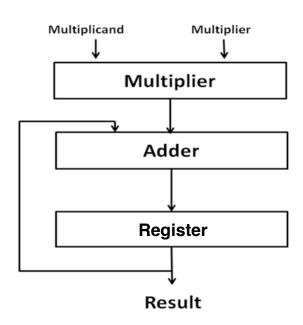


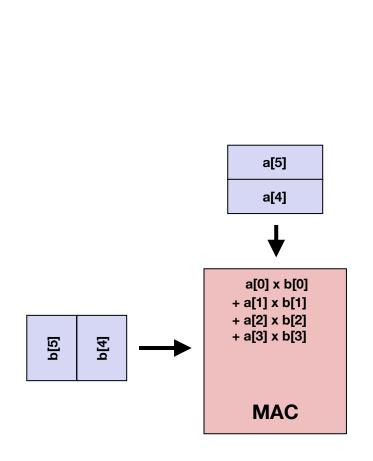


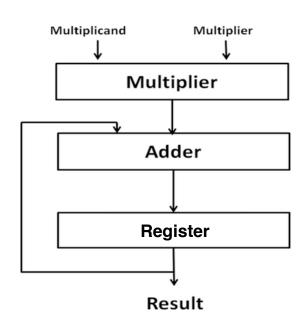


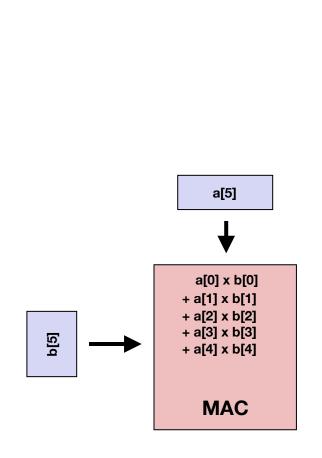


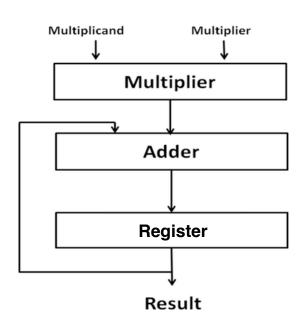


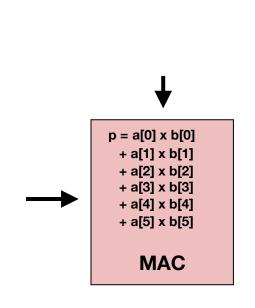


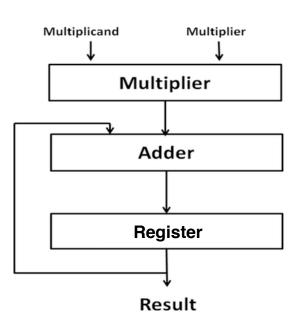




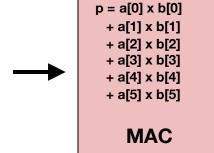


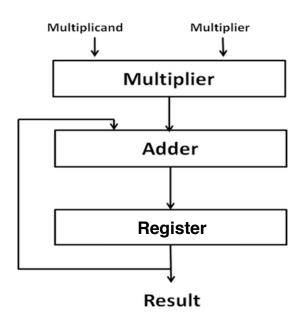


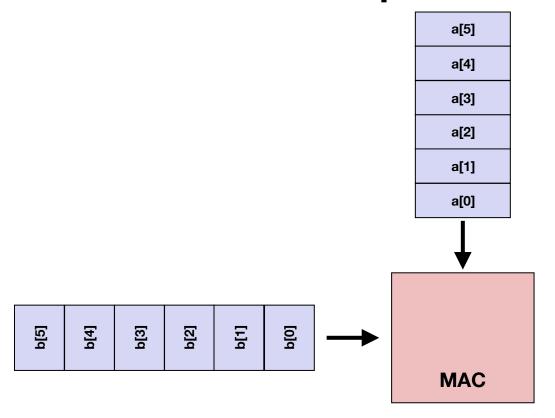


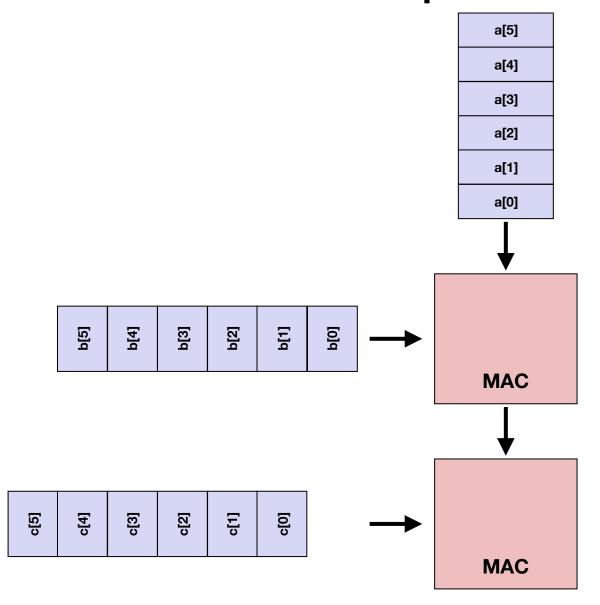


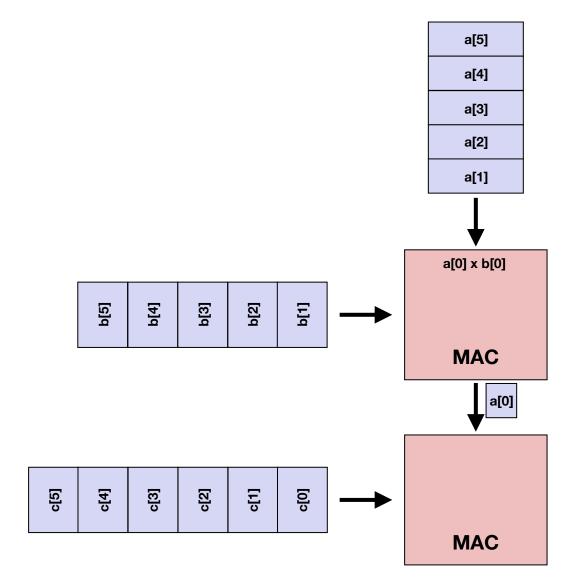
- Does nothing but vector dot product
  - No instruction fetch and decode (there is no instruction)
  - The register is close to the ALU and gets reused over and over: good data delivery efficiency
  - Very simple control

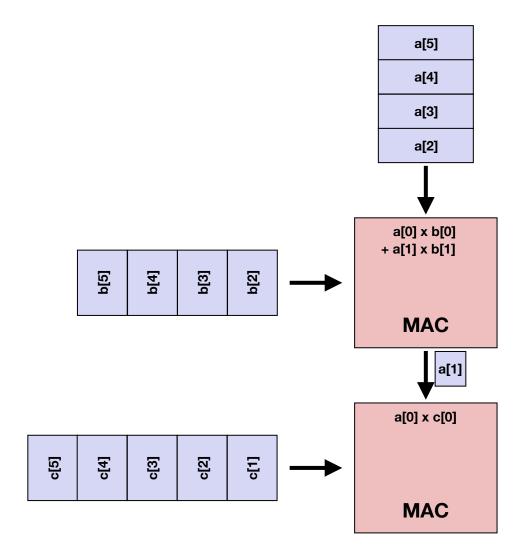


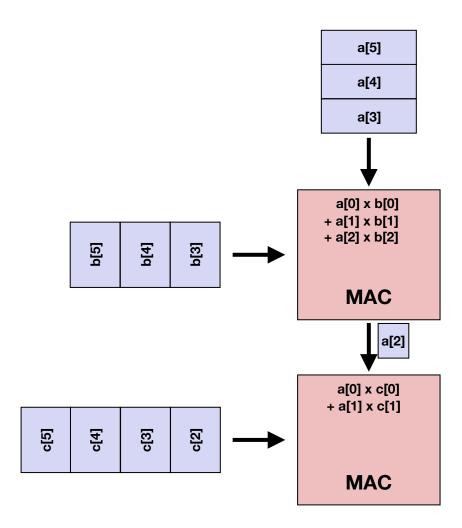


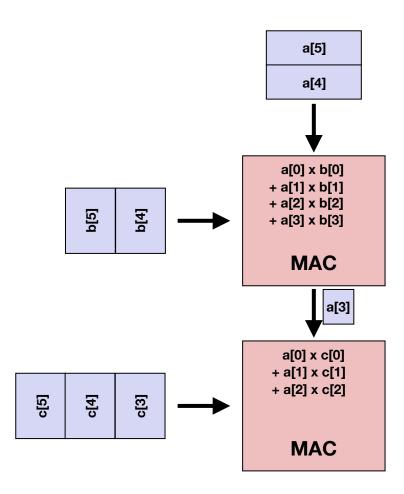


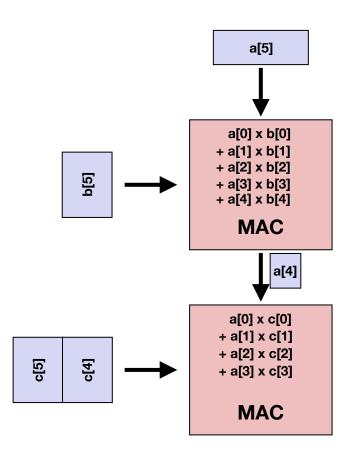


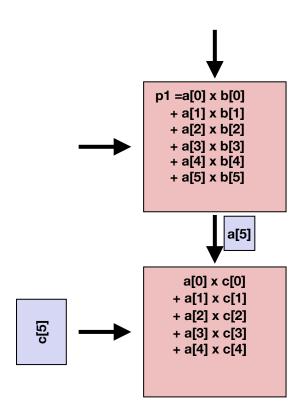


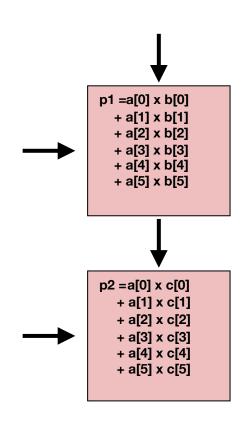




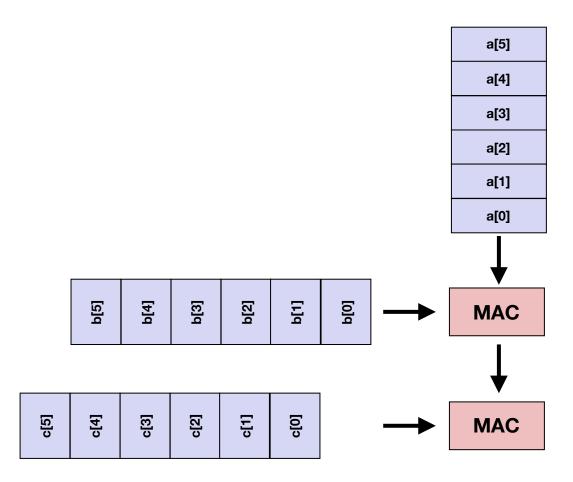




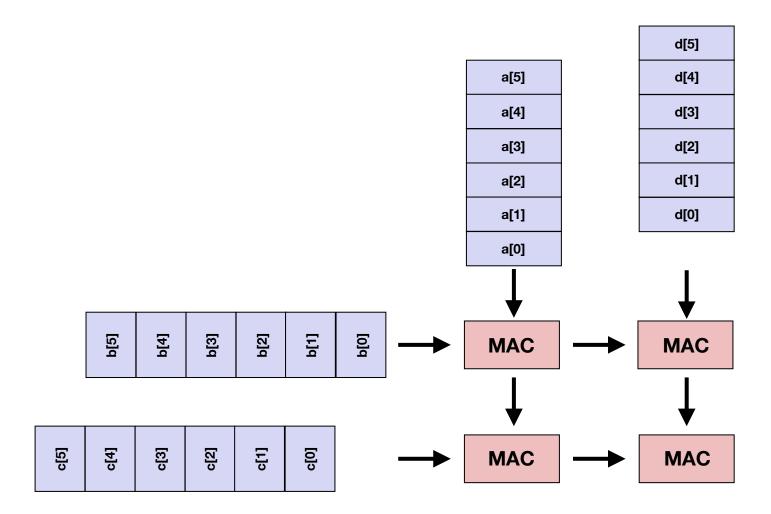




# Matrix Matrix Multiplication

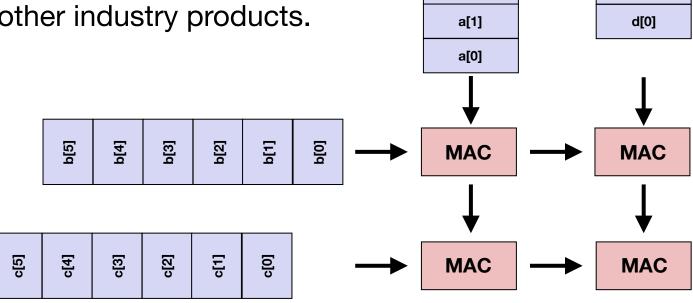


# Matrix Matrix Multiplication



# Matrix Matrix Multiplication

- Systolic array (Kung & Leiserson, 1978). Basically a matrix multiplication engine.
  Convolution neural network heavily
- Convolution neural network heavily relies on this. Used in Google's TPU, among other industry products.



d[5]

d[4]

d[3]

d[2]

d[1]

a[5]

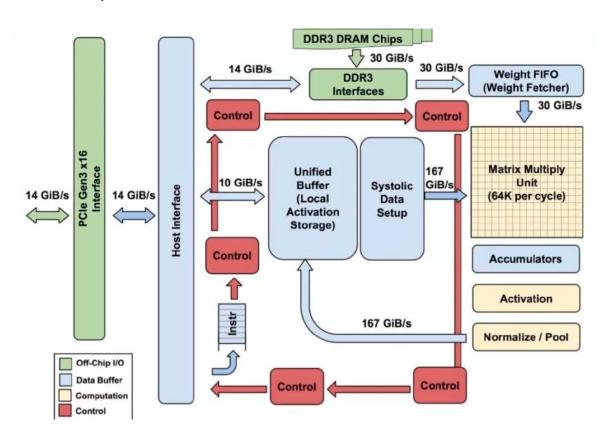
a[4]

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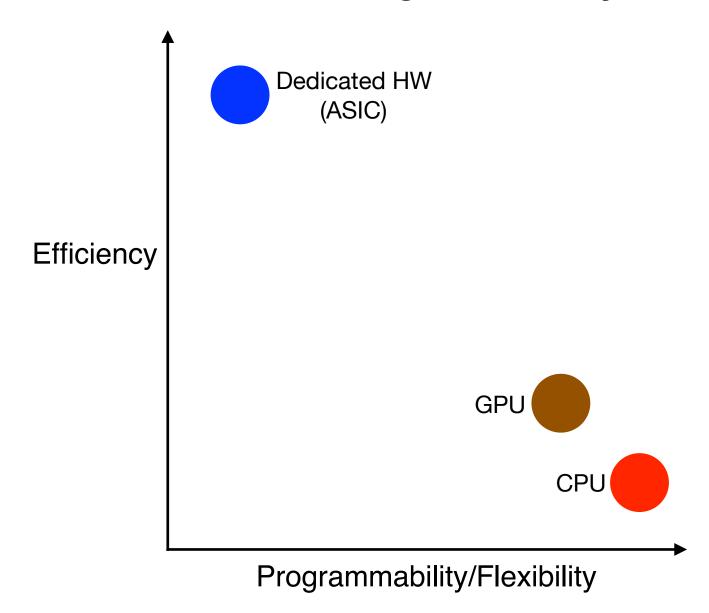
a[2]

# Google Tensor Processing Unit

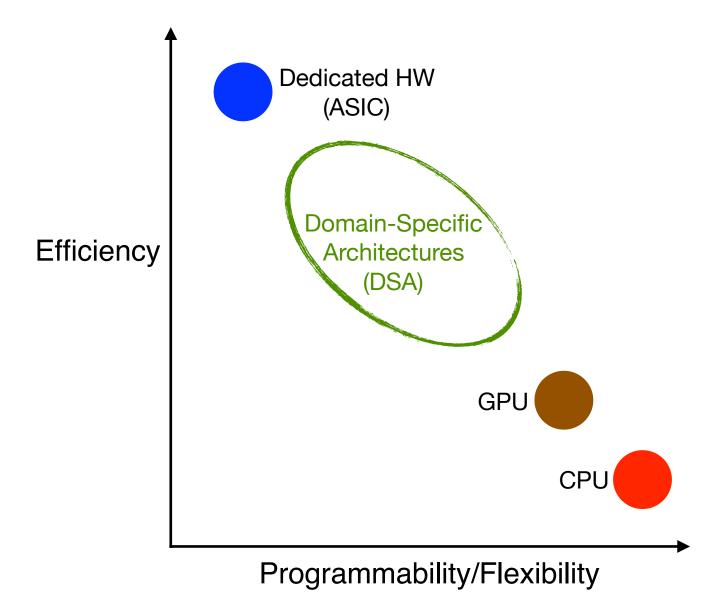
- Convolution in deep learning can be transformed to matrix multiplication.
- TPU: specialized processor (i.e., systolic array architecture) for tensor processing (matrix multiply)
  - 30x~80x more power-efficient than GPU



#### The Main Trade-off: Programmability vs. Efficiency



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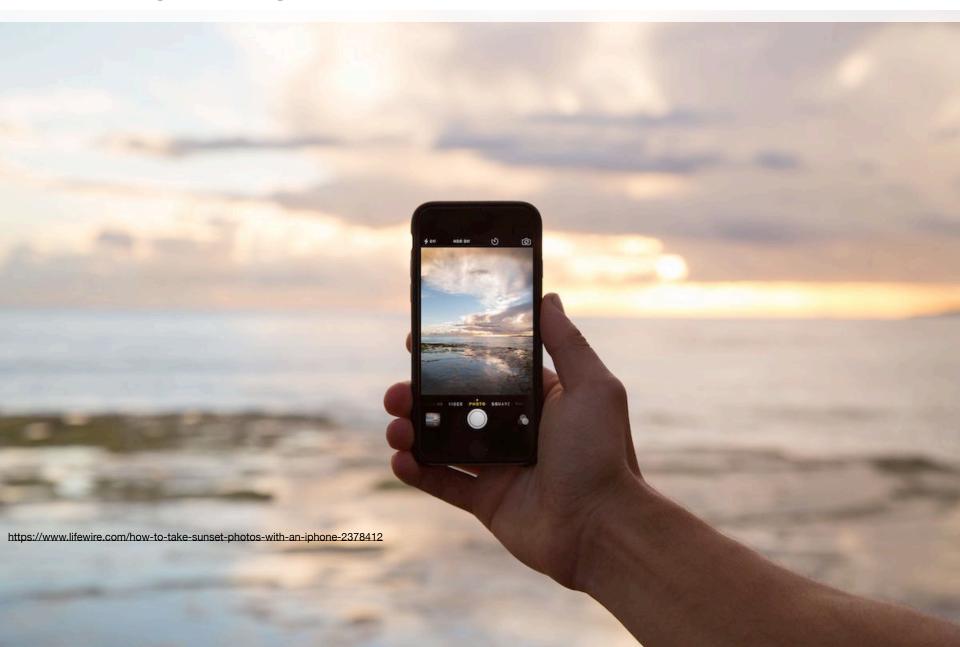


# A Whirlwind of Application Domains (a.k.a., What CSC 292/572 Will Cover)

# **Conventional Digital Camera**



# **Today's Digital Camera**

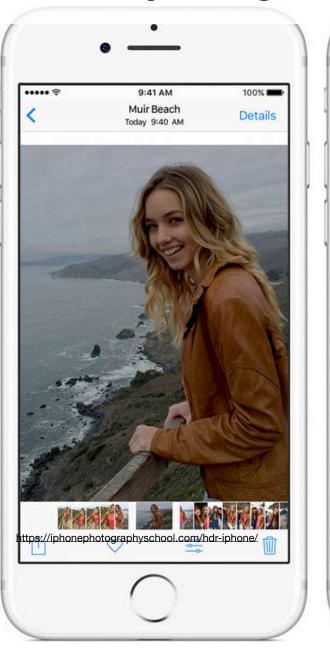


# Today's Digital Camera: Portrait Mode

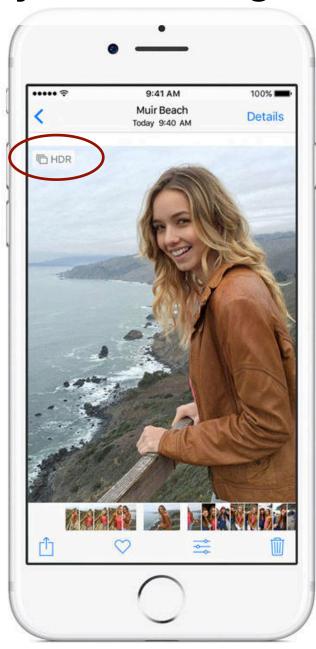


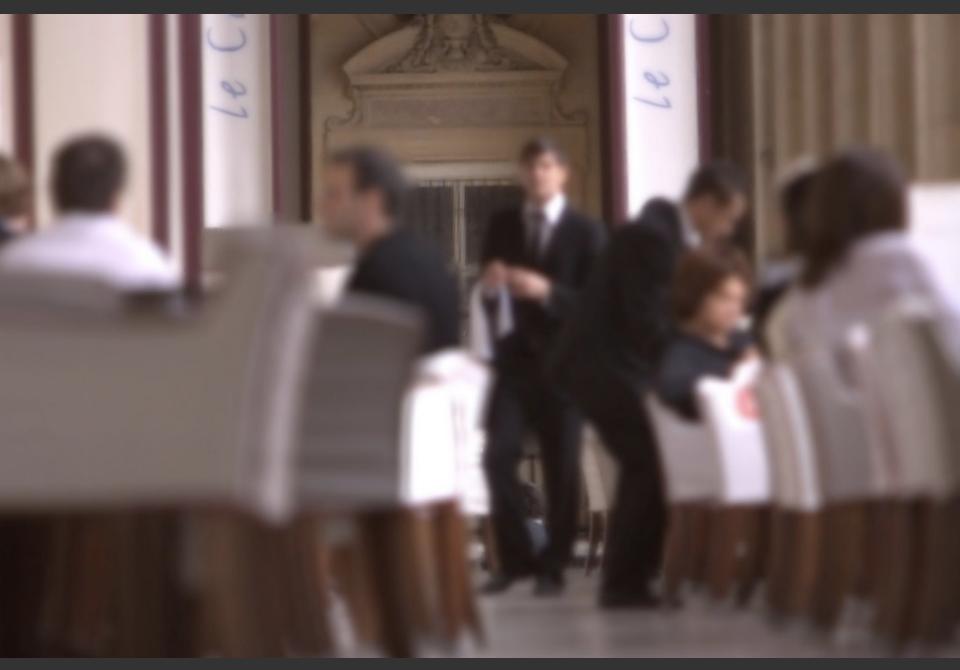


### Today's Digital Camera: High Dynamic Range









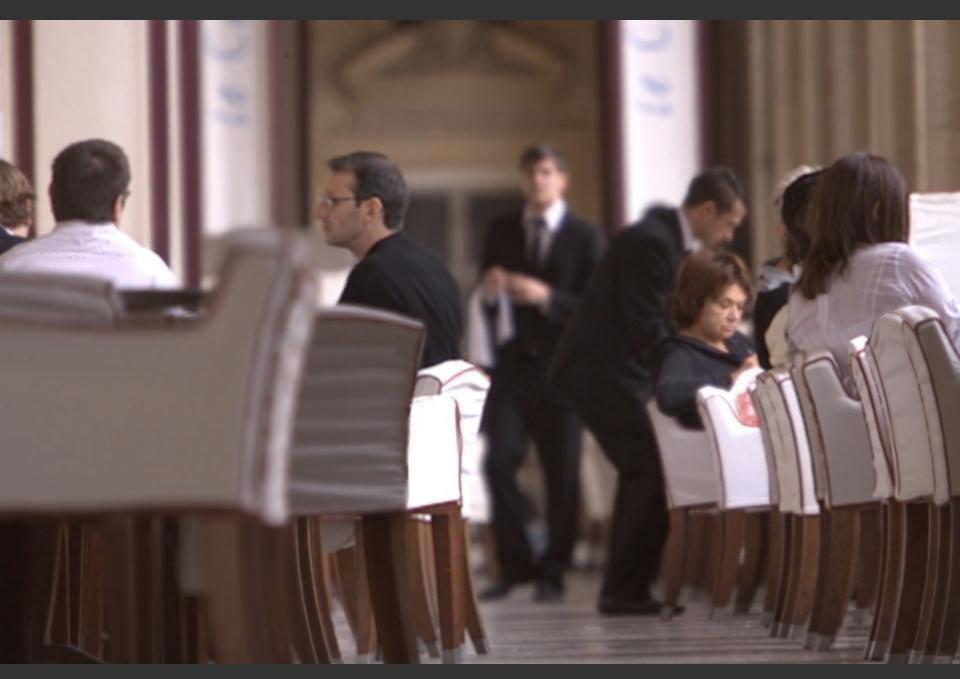
[Slide courtesy Ren Ng]



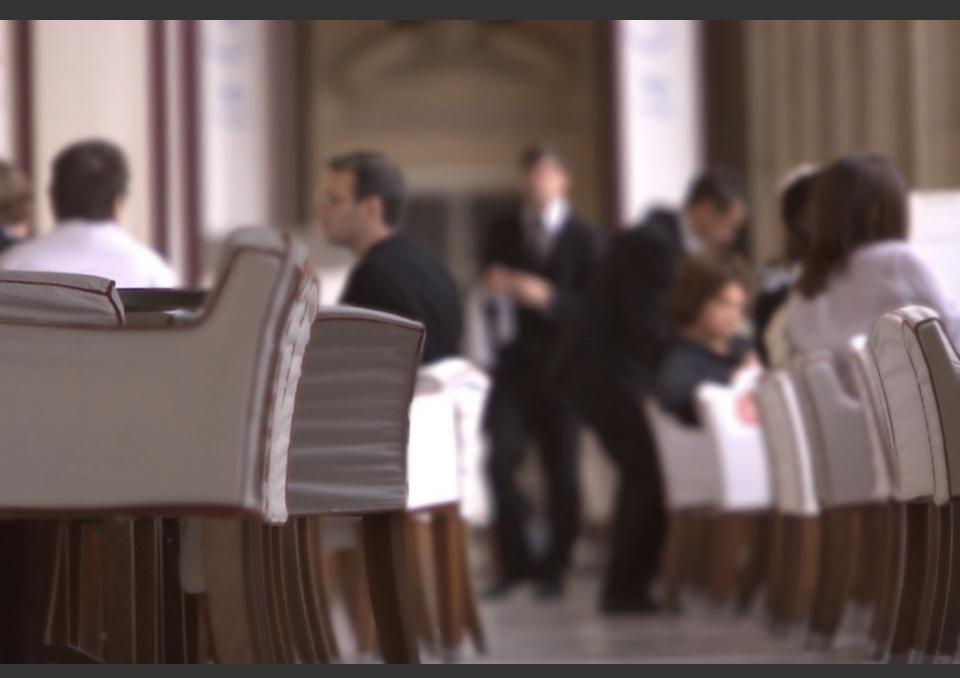
[Slide courtesy Ren Ng]



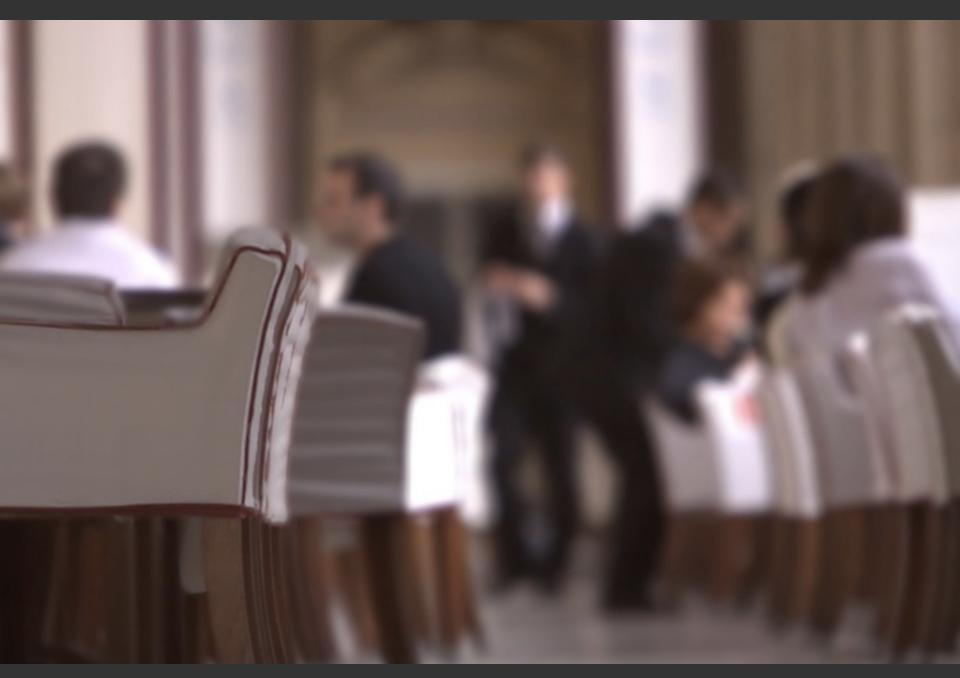
[Slide courtesy Ren Ng]



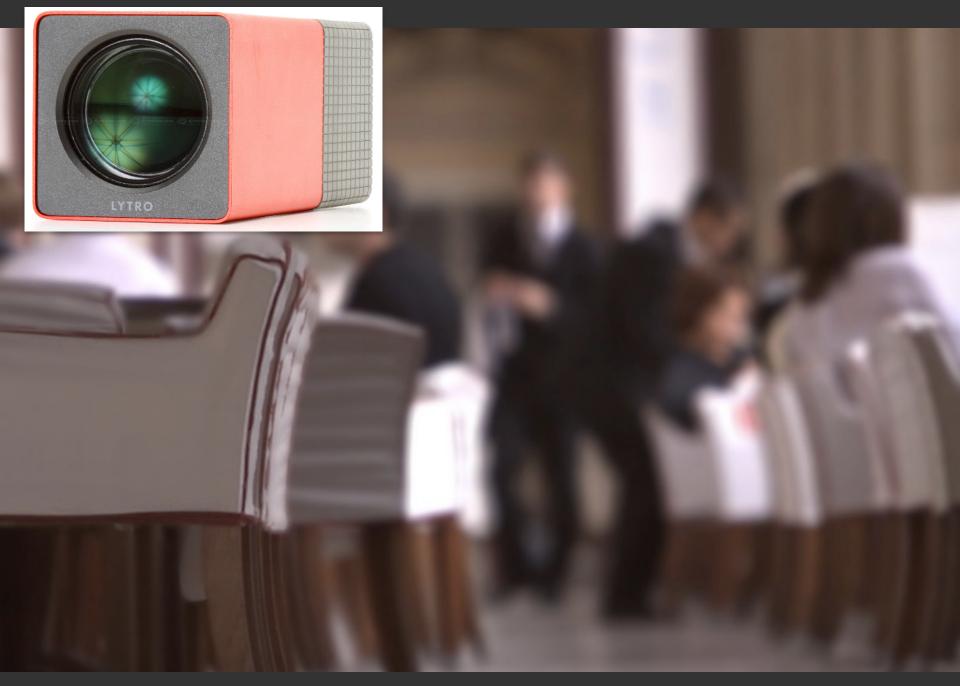
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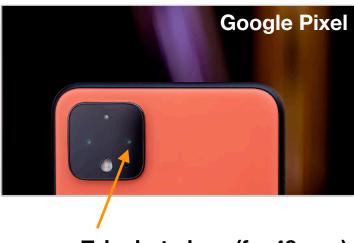
#### **Cameras in Modern Smartphones**



Autofocus and portrait mode at night.

#### Telephoto (Long-Focus) Lens

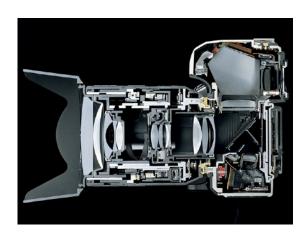




Telephoto lens (f = 48 mm) + computational photography algorithm for super resolution

## Traditional Telephoto (Long-Focus) Lens







Conventional cameras use complex and expensive lenses and sensors to minimize imperfections.



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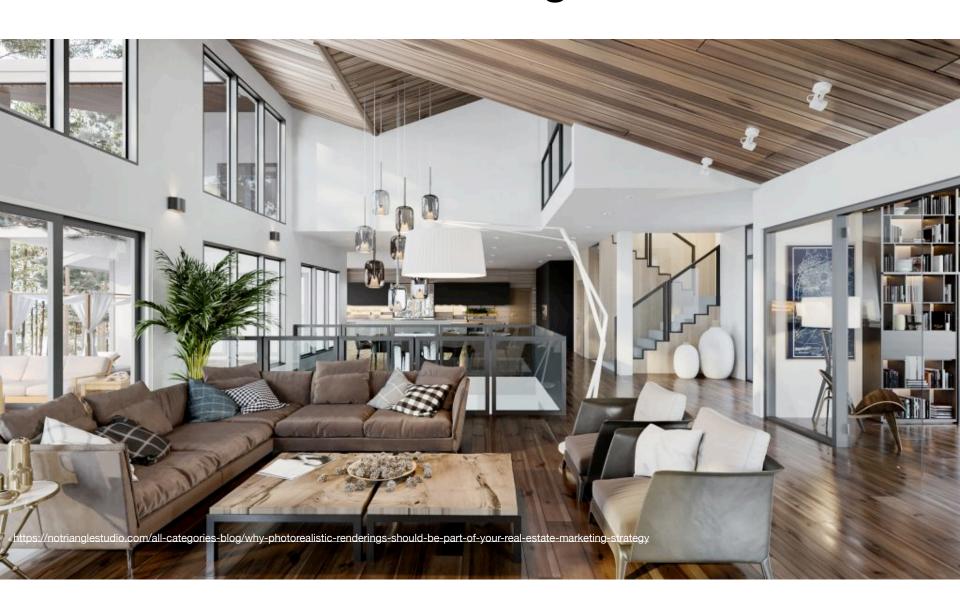
Conventional cameras use complex and expensive lenses and sensors to minimize imperfections.

Today's cameras use better processing algorithms to make up for the weak optics and sensors —in real time.





## Photorealistic Rendering



## Photorealistic Rendering



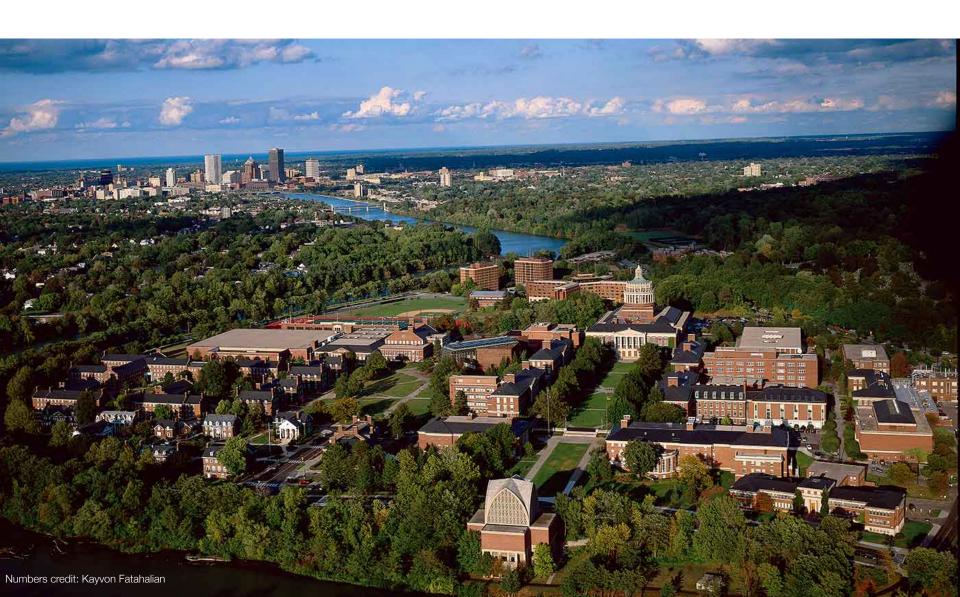
#### Real-Time Photorealistic Rendering (Gaming)



# **Physics Simulation**



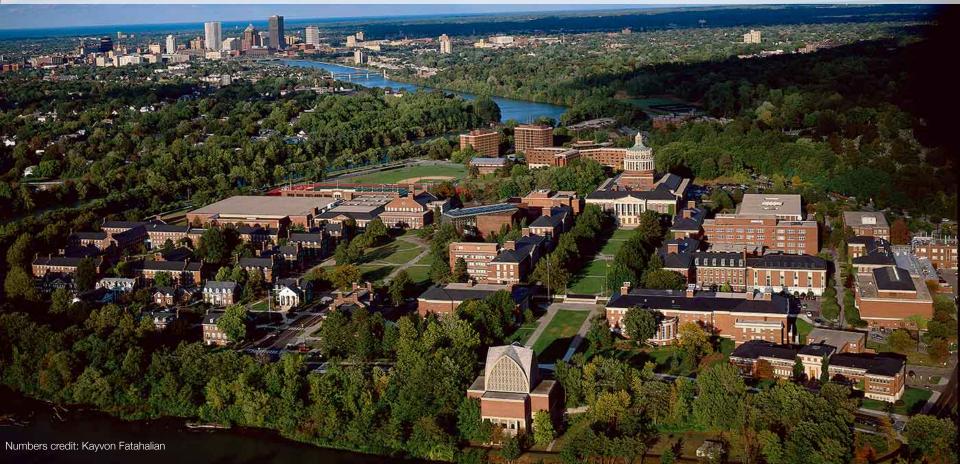
### **Another Domain: Video Compression**

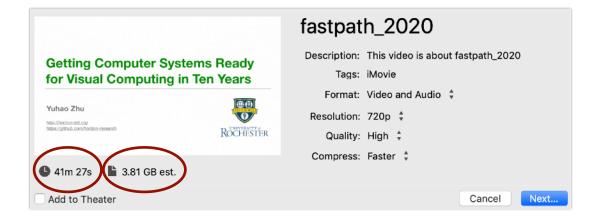


#### **Another Domain: Video Compression**

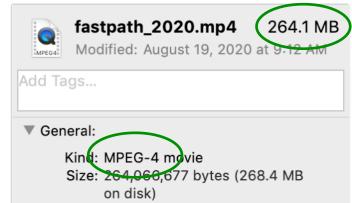
30-second video @ 1080p resolution (1920 x 1080 pixels per frame) @ 30 frames per second (FPS) 3 colors per pixel + 1 byte per color → 6.2 MB/frame → 6.2 MB x 30 s x 30 FPS = 5.2 GB total size Actual H.264 video file size: 65.4 MB (**80-to-1 compression ratio**).

Compression/encoding done in real-time without you even realizing it!









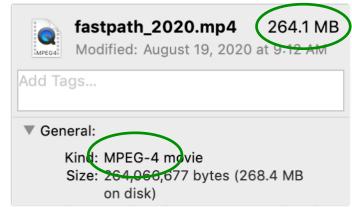






WiFi bandwidth test at my home

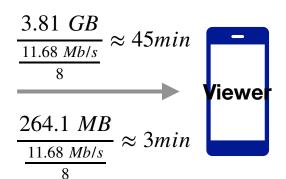


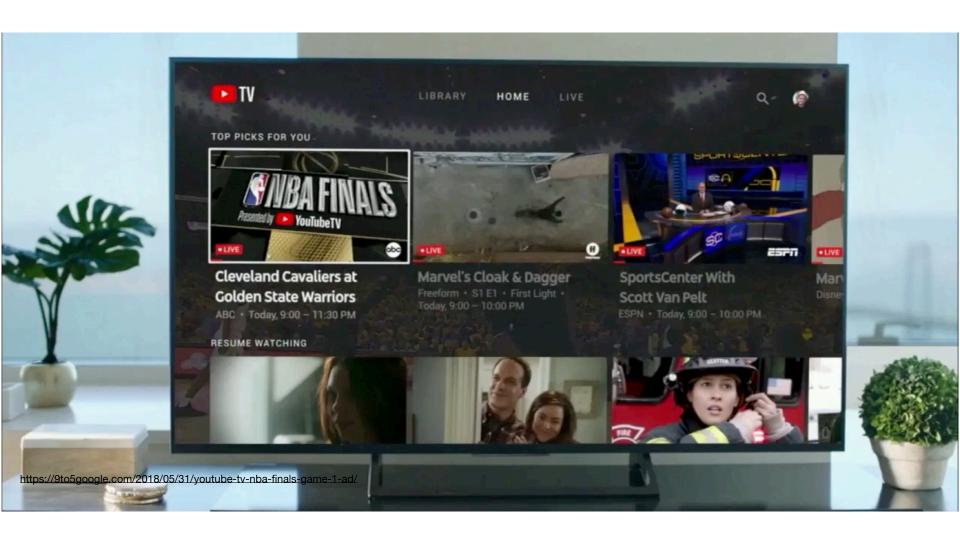




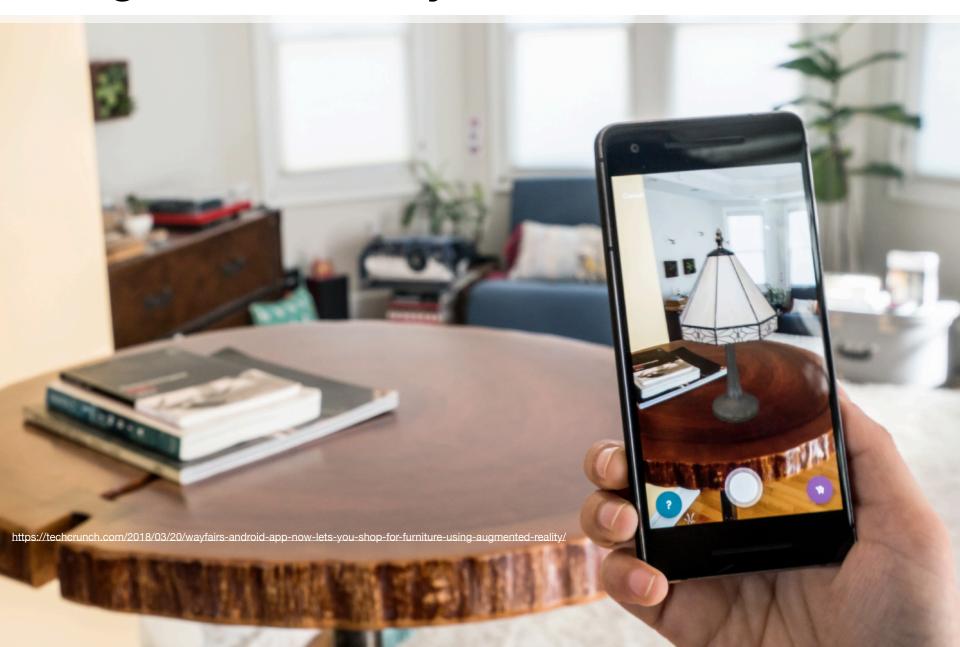


WiFi bandwidth test at my home



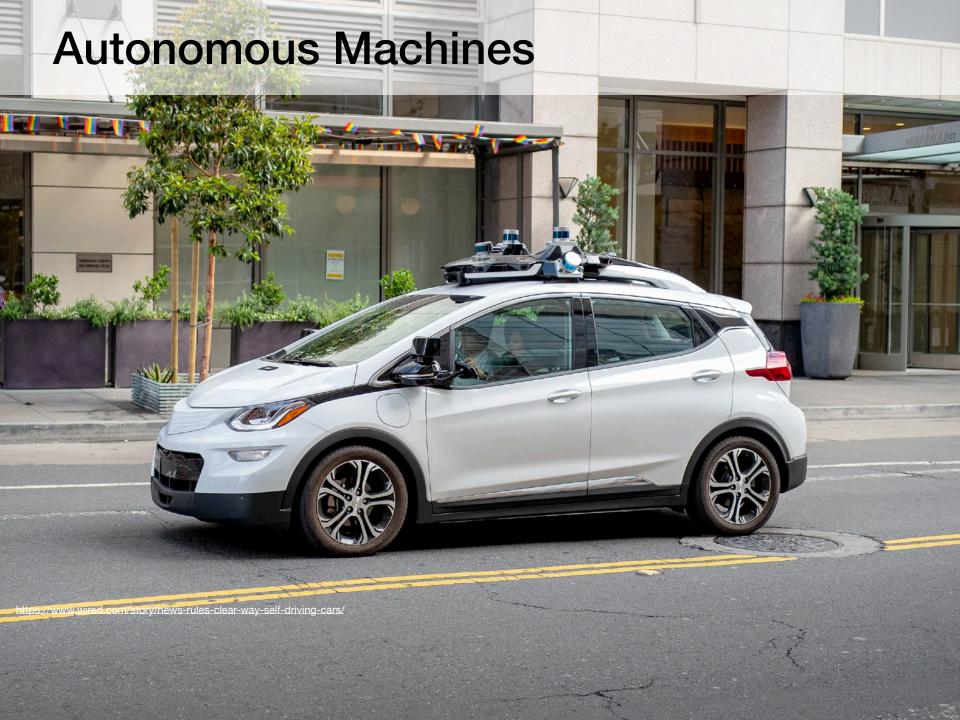


## **Augmented Reality**



# Virtual Reality





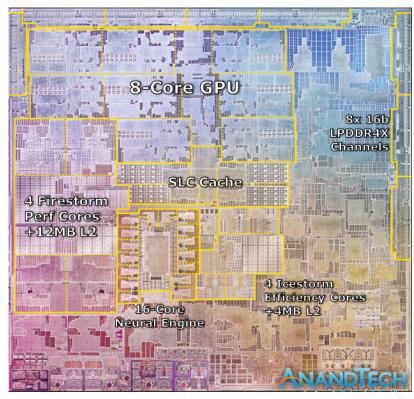
#### **Autonomous Machines**



https://www.wired.com/2017/05/the-physics-of-drones/

#### Today's Processor Chips are Full of Accelerators





### Traditional Scope of Computer Systems

 Take a program and try to figure out how to best execute on the hardware

**Problem** 

Algorithm

Program

Instruction Set Architecture

Microarchitecture

Circuit

### Real Scope of Computer Systems

- Understand the problem to be solved, design algorithms, understand algorithms characteristics to design the best computer systems.
- It's no longer enough to work with a given program without understanding it.

**Problem** 

Algorithm

Program

Instruction Set Architecture

Microarchitecture

Circuit

#### CSC 292/572: Mobile Visual Computing

Computational photography

Display and lightning systems

Computer graphics

AR/VR

Video/image compression

**Problem** Algorithm Program Instruction Set Architecture Microarchitecture

Circuit

### The Most Important Take Away of 252

- "There is no magic."
- Every thing can be derived from first principles. Trust your logical reasoning.
- Apply to virtually everything in science and engineering.

#### The Second Most Important Take Away of 252

- "Things don't have to be this way."
- As long as you don't violate physics, you can design a computer however you want.
- But every design decision you make usually involves certain tradeoffs. Be clear what your design goal is.

#### The Third Most Important Take Away of 252

- Virtual all computer system design practices follow a small set of basic principles.
- It is these basic principles that are important, not the practices.

