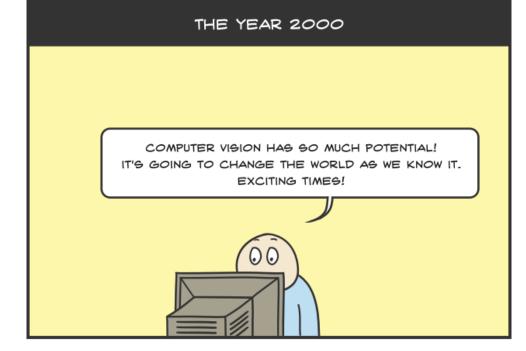
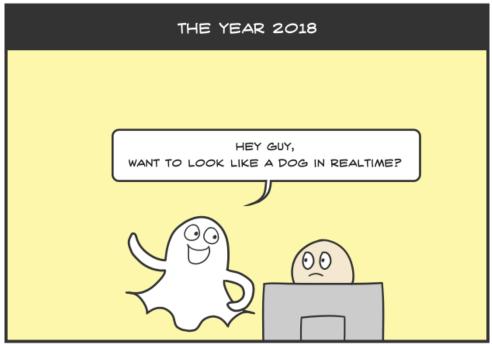
CMSC 472/672

### Lecture 1

# Computer Vision





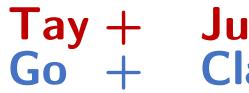
CREDITS TO /U/DEADBUILTIN

Some slides from Jayasuriya, Turaga, Szeliski

CONSOLIA-COMIC.COM

# Tejas Gokhale ~ Tejas: Gokhale:

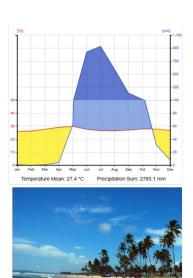




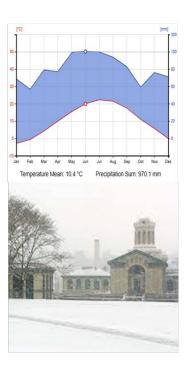




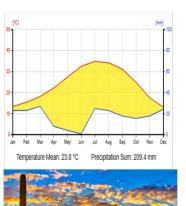
**Assistant Professor** Computer Science University of Maryland, Baltimore County



2011 - 2015B.E. (Honours) **BITS Pilani** (Goa)

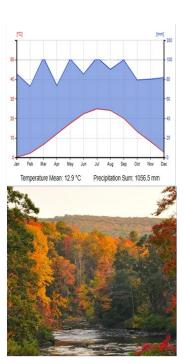


2016-2018: M.S. Carnegie Mellon University





2018-2023: Ph.D. Arizona State University



2023—present **Assistant Professor** University of Maryland **Baltimore County** 

https://www.tejasgokhale.com/

#### **Course Staff**

Instructor: Tejas Gokhale Assistant Professor, CSEE



Wednesday 2:30 - 3:30 PM

ITE 342-B gokhale@umbc.edu

TA: ???

. .



Office Hours

**TBD** 

#### Class Website

- This is your primary source for class material (slides, notes, readings, references, etc.)
- Assignments & Grades will be released on Blackboard

https://courses.cs.umbc.edu/graduate/672/

### Quick Round of Introductions

- Name
- 2. Major (e.g. CS, CE, EE, etc.)
- 3. Level (e.g. BS, MS, Ph.D. etc.)
- 4. Why are you taking this class?



### What is this course about ?

"Understanding Images"

### What is this course about?

# "Understanding Images"

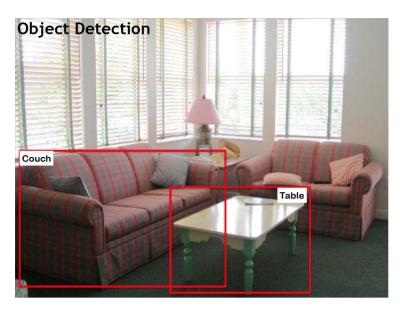


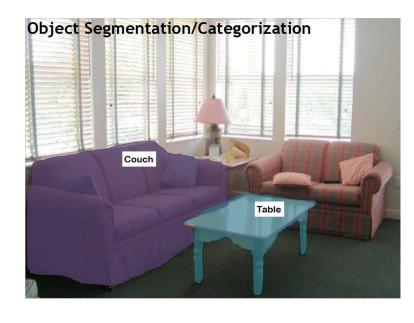
This course

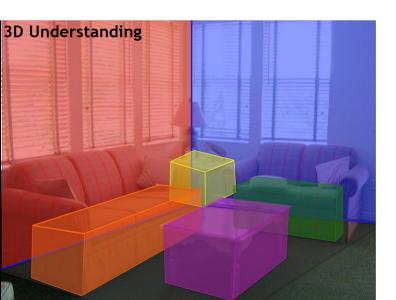


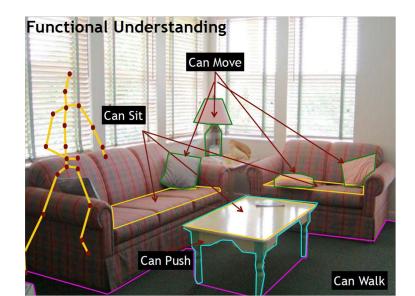
### Computer Vision: Understanding Images













## Why is CV difficult?

What I see



### Why is CV difficult?

What I see



What a computer sees

### Humans are good at it ...



### Are Humans good at it?





# Challenges: object intra-class variation













### Challenges: Motion

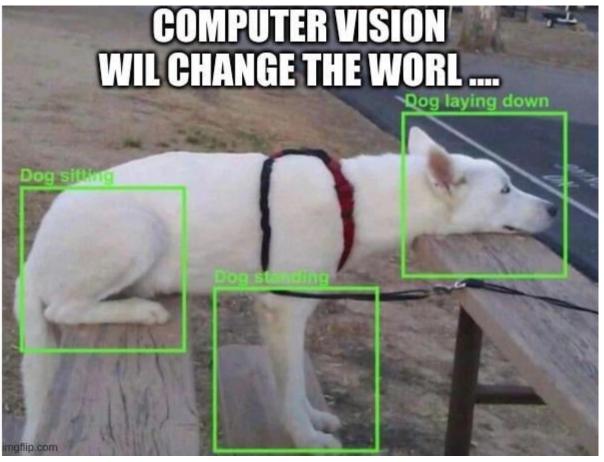


### Challenges: background clutter

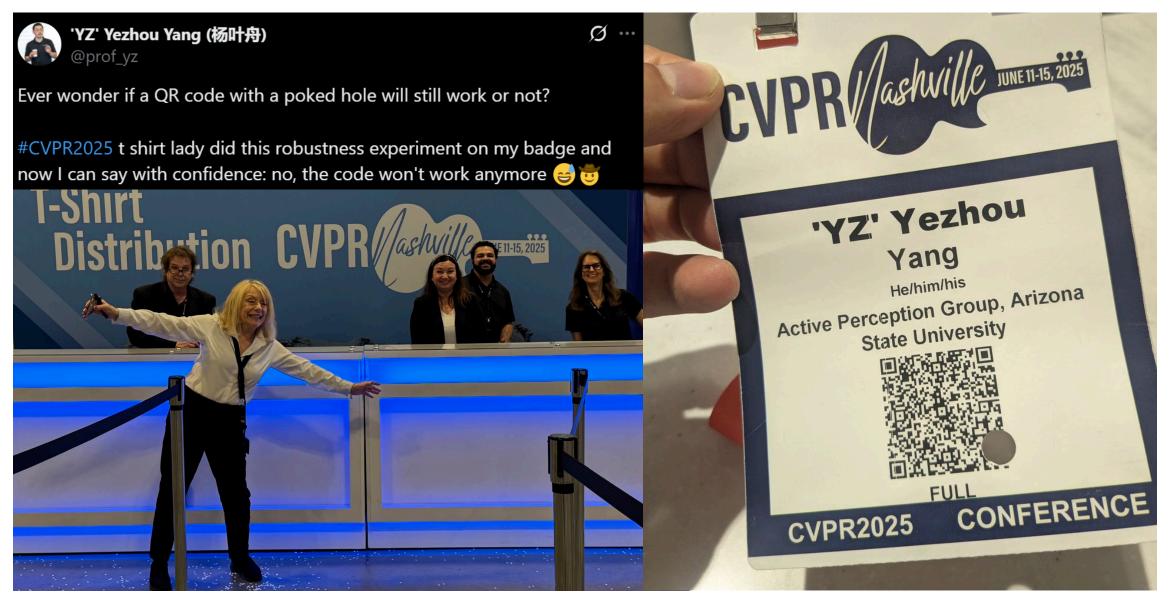


### Challenges: "Commonsense"





### Robustness Challenge: T-Shirt Lady at CVPR



#### What is computer science?

Typical answers: programming, coding, algorithms ...

An attempt to develop a theory of computation

to represent, understand, and interact with the world

in the form of computations.

#### What is computer vision?

An attempt to develop a theory

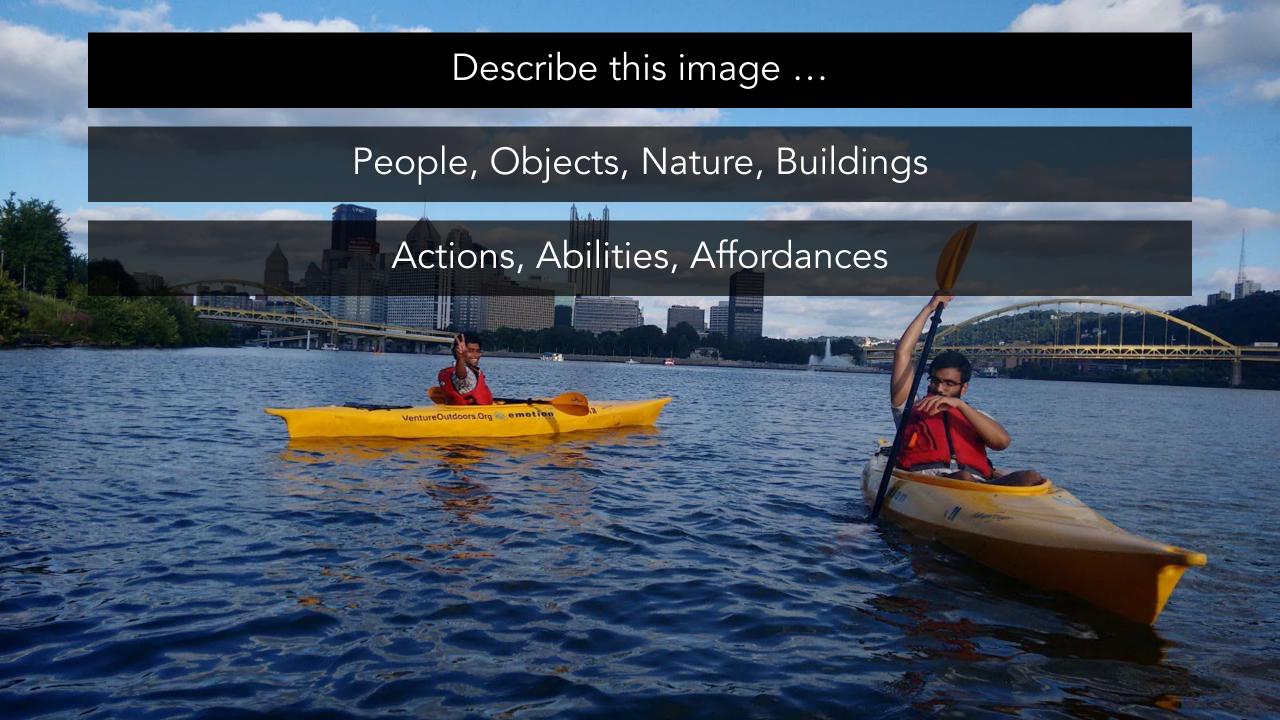
to represent, understand, and interact

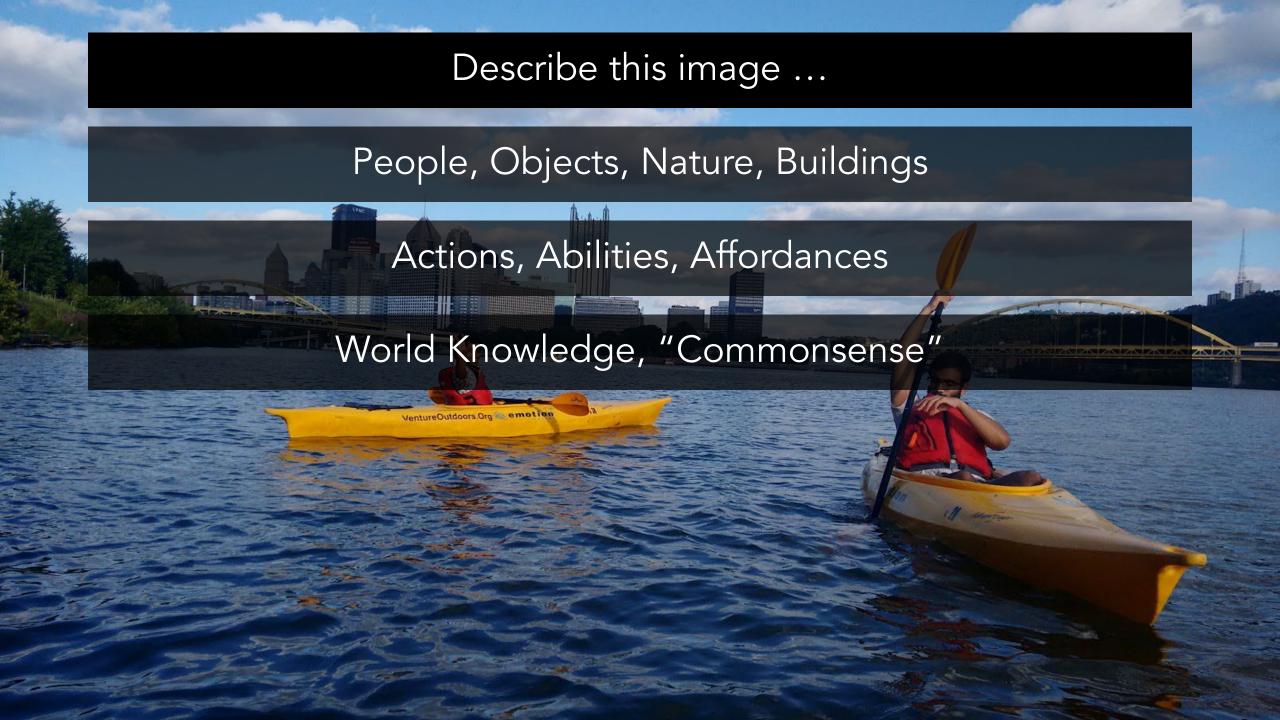
with the visual world

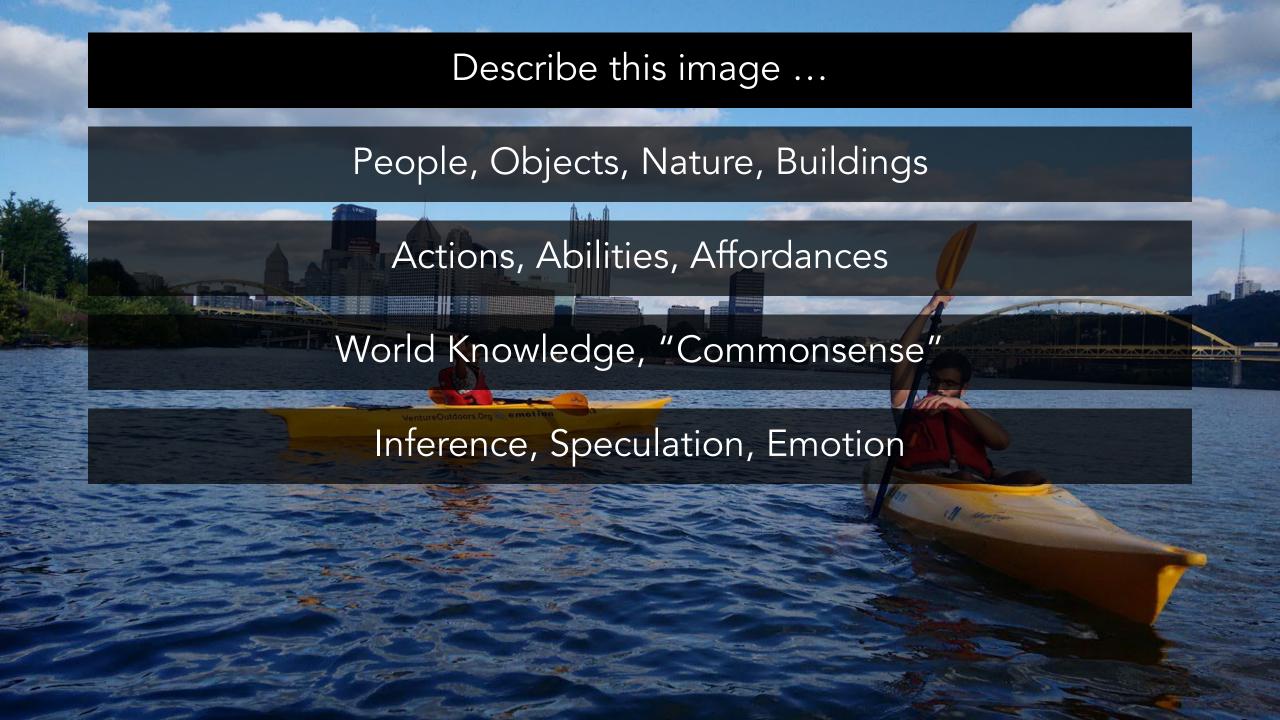
in the form of computations











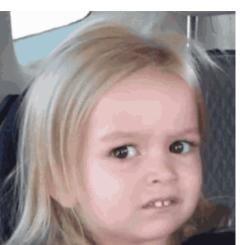
### Visuals convey meaning







### Visuals convey *emotions*

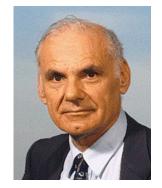


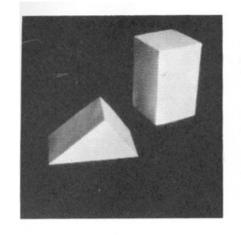




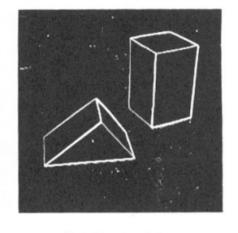


### Some history ...



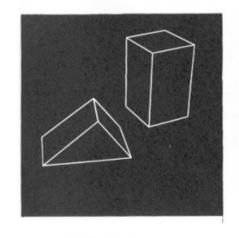


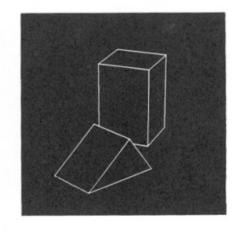
(a) Original picture.



(b) Differentiated picture.

L. G. Roberts (later also created ARPANET – precursor to the internet)
Machine Perception of Three Dimensional Solids
Ph.D. Dissertation
MIT Dept of Electrical Engineering
1963





(c) Line drawing.

(d) Rotated view.

Computer Vision

is older than

MIT's Computer Science Program (1970s)

### Some history ...

MASSACHUSETTS INSTITUTE OF TECHNOLOGY
PROJECT MAC

Artificial Intelligence Group Vision Memo. No. 100. July 7, 1966

#### THE SUMMER VISION PROJECT

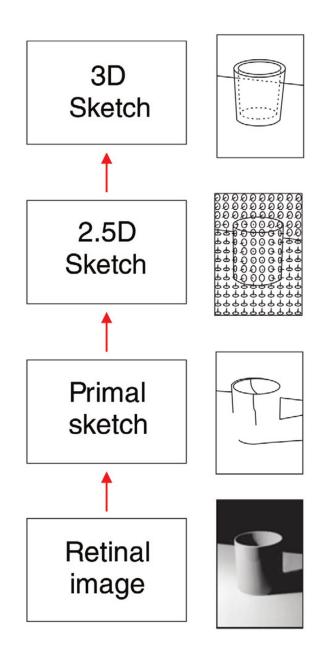
Seymour Papert

The summer vision project is an attempt to use our summer workers effectively in the construction of a significant part of a visual system. The particular task was chosen partly because it can be segmented into sub-problems which will allow individuals to work independently and yet participate in the construction of a system complex enough to be a real landmark in the development of "pattern recognition".



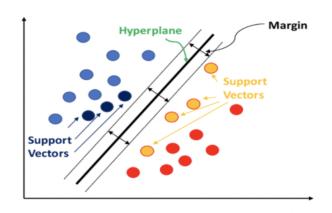
### Marr's Vision (1982)

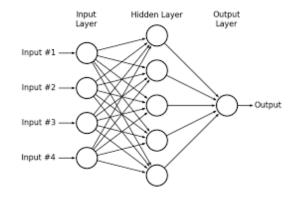
- British neuroscientist David Marr was very influential with his computational theory of vision
- Marr believed that visual understanding could be progressively grown from primitive lines/edges to 2.5D information and textures to finally 3D shapes
- It is still an open question of whether the brain actually works in this way, but many engineers and scientists found inspiration in making artificial vision systems based on Marr's model of vision.

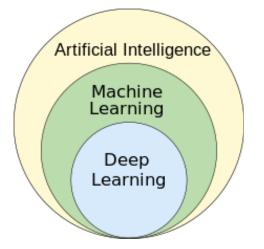


# Counterpoint: Machine Learning & Statistical Methods

- To counter the computational theories of Marr, statistics and data-driven methods were being invented in the 1980s
- Such methods *had* limited application due to lack of available data and compute power (more on this later)
- Deep learning (by 2012 onward) has become a backbone of most computer vision systems







### Fast Forward to Today



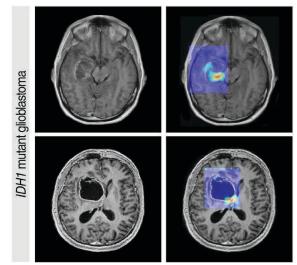






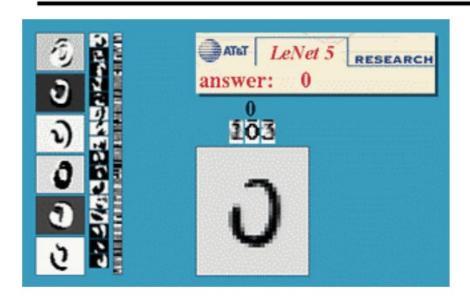








#### Optical character recognition (OCR)



Digit recognition yann.lecun.com



Automatic check processing



License plate readers

http://en.wikipedia.org/wiki/Automatic number plate recognition

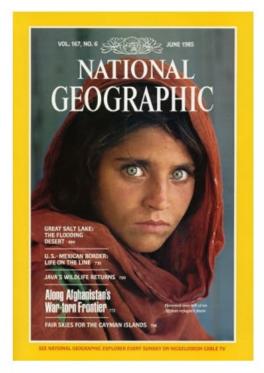


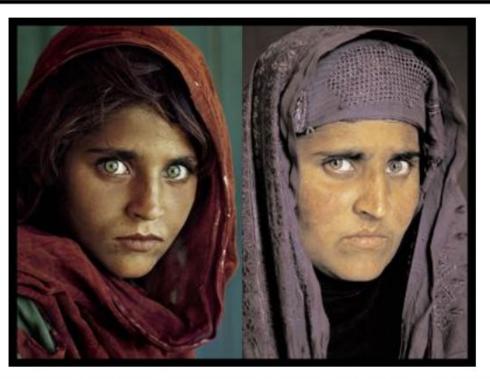
Sudoku grabber

http://sudokugrab.blogspot.com/

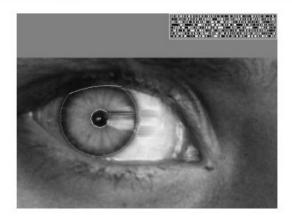
Source: S. Seitz, N. Snavely

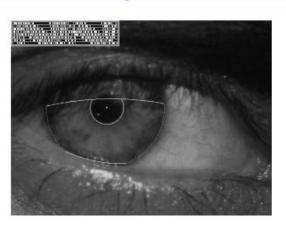
#### **Biometrics**





How the Afghan Girl was Identified by Her Iris Patterns



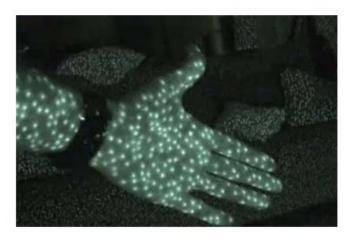


Source: S. Seitz

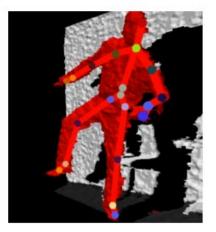
#### Vision-based interaction: Xbox Kinect











http://blogs.howstuffworks.com/2010/11/05/how-microsoft-kinect.htm kinect-works-an-amazing-use-of-infrared-light/

### Earth viewers (3D modeling)

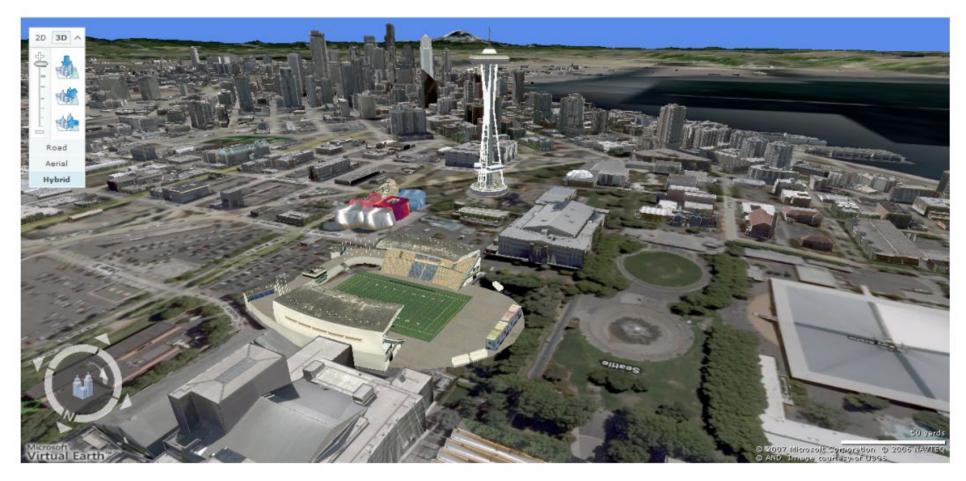


Image from Microsoft's Virtual Earth

(see also: Google Earth)

Source: Steve Seitz and Neel Joshi

#### Vision for robotics, space exploration



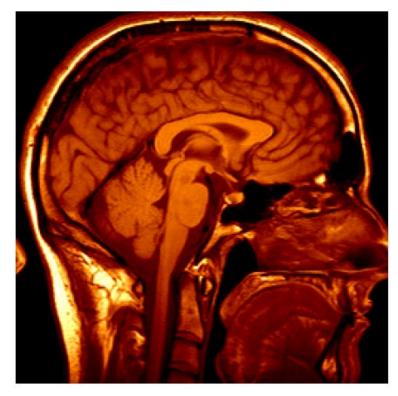
NASA'S Mars Exploration Rover Spirit captured this westward view from atop a low plateau where Spirit spent the closing months of 2007.

#### Vision systems (JPL) used for several tasks

- Panorama stitching
- 3D terrain modeling
- Obstacle detection, position tracking
- For more, read "Computer Vision on Mars" by Matthies et al.

Source: S. Seitz

### Medical imaging



3D imaging MRI, CT

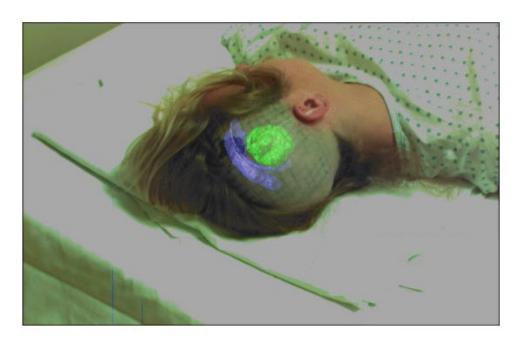


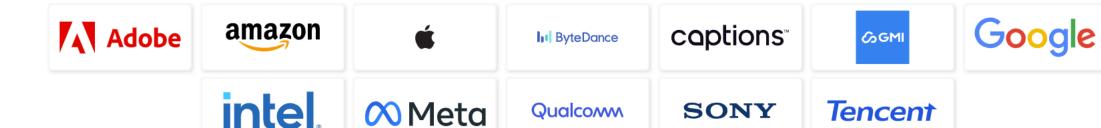
Image guided surgery

<u>Grimson et al., MIT</u>

Source: Steve Seitz and Neel Joshi

# LOTS (!!!) of Industry

PLATINUM



GOLD















SILVER



Motional





































### What this course is NOT about ...

- A "review" of the state-of-the-art:
  - we will talk about some recent work, but the main goal is to learn fundamentals
- Iust another ML course but with a focus on image-based applications
  - only one part of the course has ML / NN
- Broad introduction to "Al": CMSC 471/671: Artificial Intelligence
- "Hands-on" coding
  - We expect you to be proficient in Python programming
  - The TA will organize a PyTorch tutorial (during regular class hours)
  - Homework and Projects: implementation.
  - Lectures: mathematical concepts

### What this course is about ....

First principles of computer vision

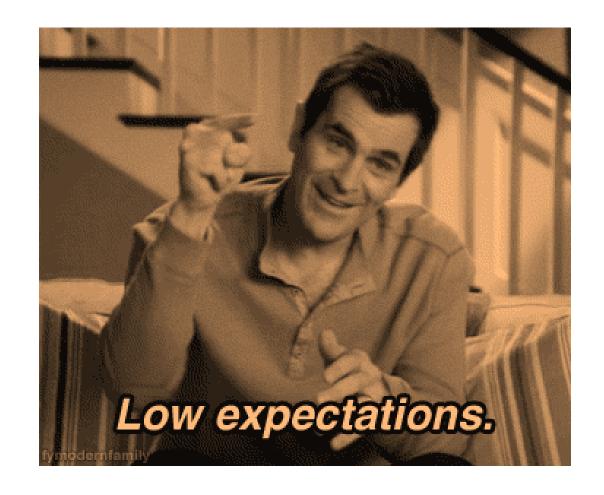
- Image Acquisition
- Image Processing and Features
- Geometry and Reconstruction
- Image Semantics (Recognition) some ML here
- Temporality (Video Understanding)
- Image Synthesis (Generation)

### In short, this course expects:

mathematical rigor

interest in fundamentals

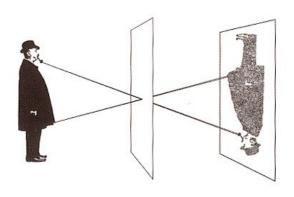
programming proficiency



# Class Topics (1) Image Acquisition

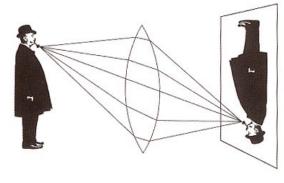
#### Photograph made with small pinhole



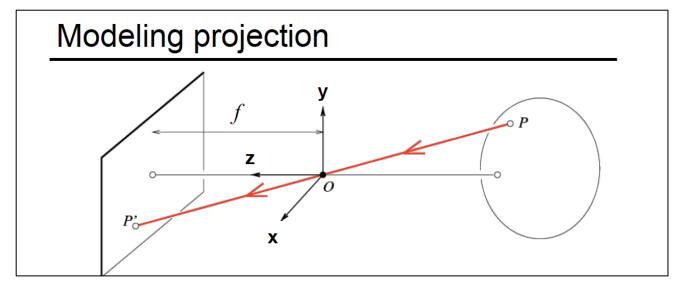


Photograph made with lens

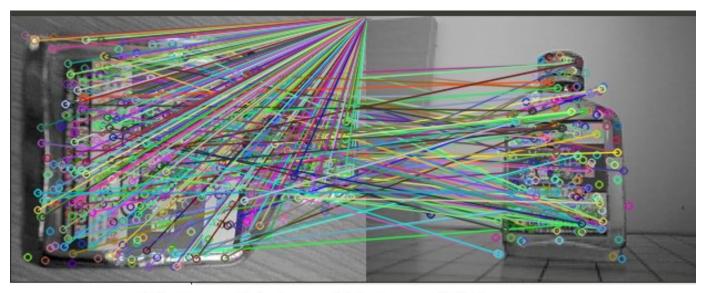


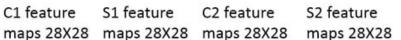


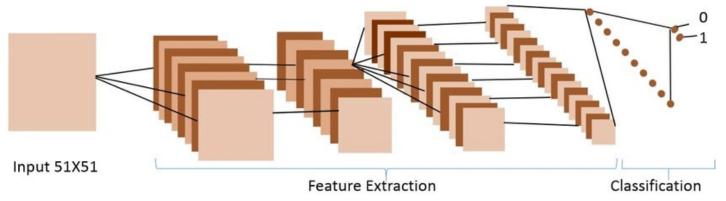


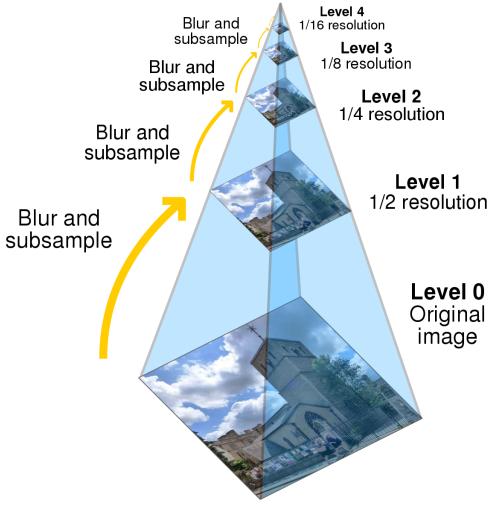


# Class Topics (2) Image Processing & Features







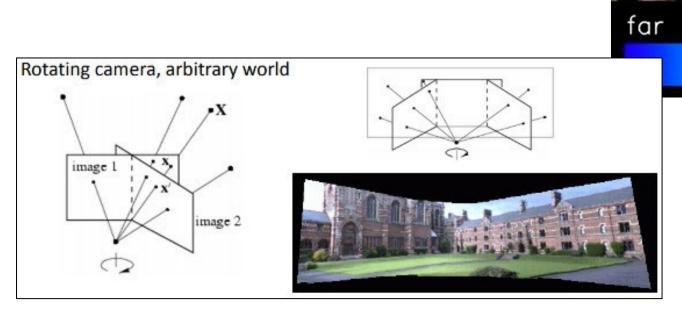


# Class Topics (3) Geometry (3D)

near

#### Topics:

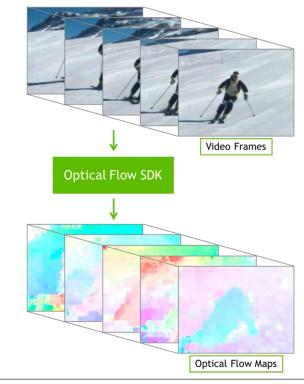
- Epipolar Geometry and Stereo
- 3D geometry estimation
- Structure-from-motion

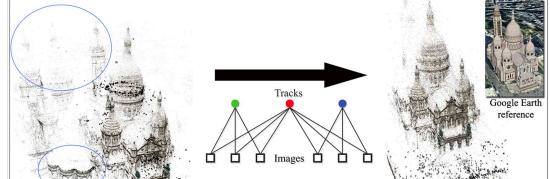


# Class Topics (4) Video (Temporal)

#### Topics:

- Motion/optical flow
- Video segmentation, tracking
- Simultaneous localization and mapping (SLAM)



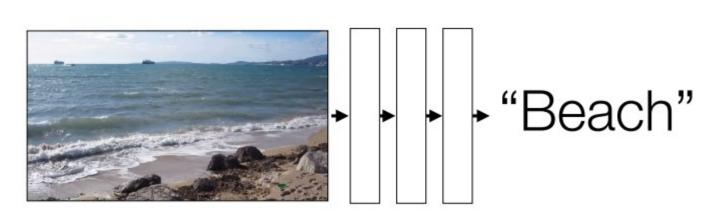


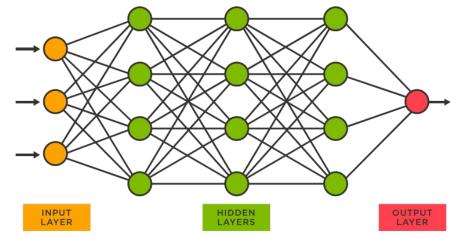
# Class Topics (5) Machine Learning for Vision



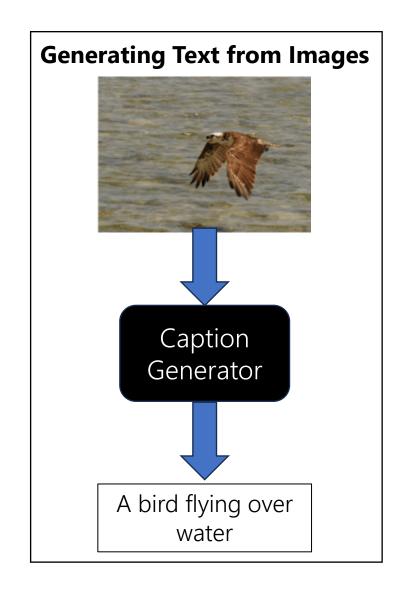


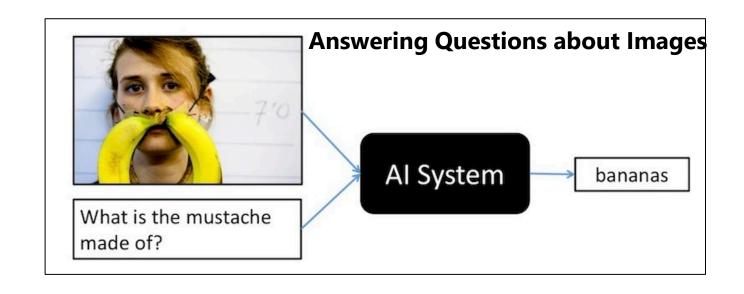


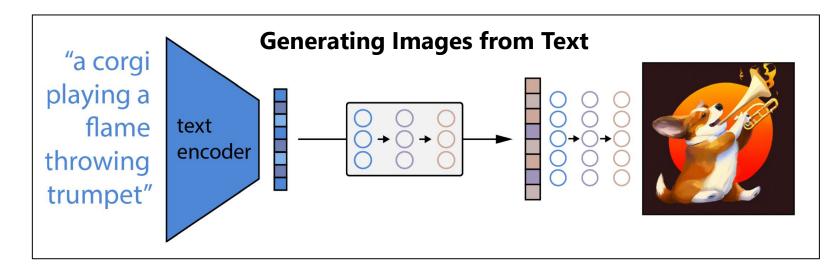




# **Advanced Topics: Vision + Language**



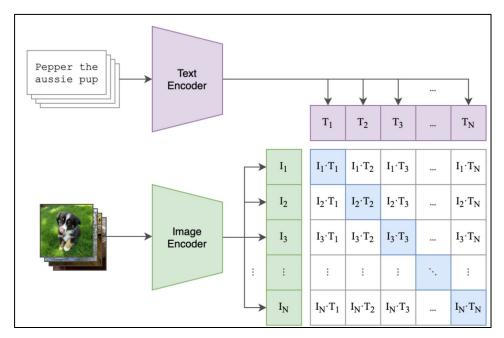


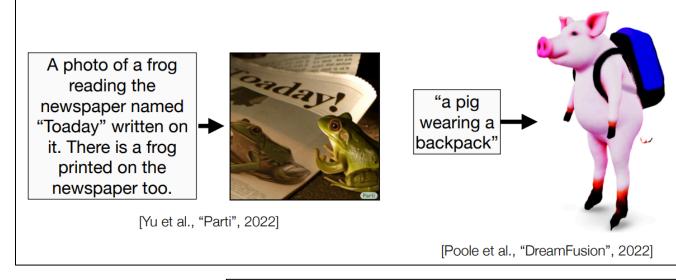


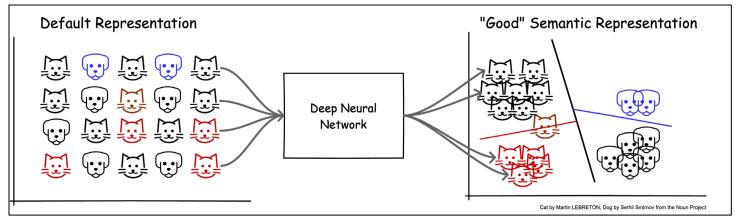
# **Advanced Topics**

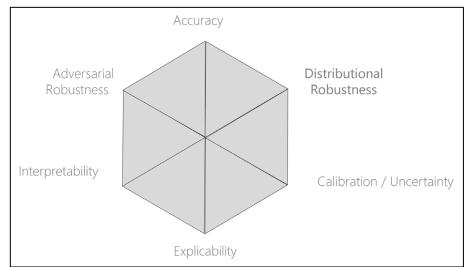
### **Representation Learning**

Generative Models Robustness & Reliability









# What we will learn to do





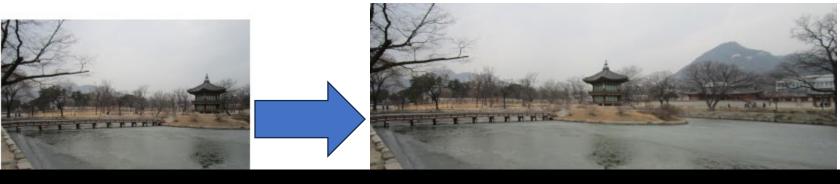


Image Stitching / Panorama (HW2)

# What we will learn to do

Classification

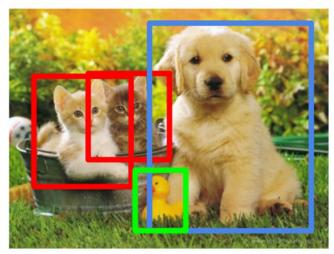
Classification + Localization

**Object Detection** 

Instance Segmentation









CAT

CAT

CAT, DOG, DUCK

CAT, DOG, DUCK

# Course Logistics

# Class Website

https://redirect.cs.umbc.edu/courses/graduate/672/



### CMSC 472/672: Computer Vision

UMBC. Fall 2025

Instructor: <u>Tejas Gokhale</u> (OH: Wednesday 2:30 PM - 3:30 PM or by appointment; ITE 214);

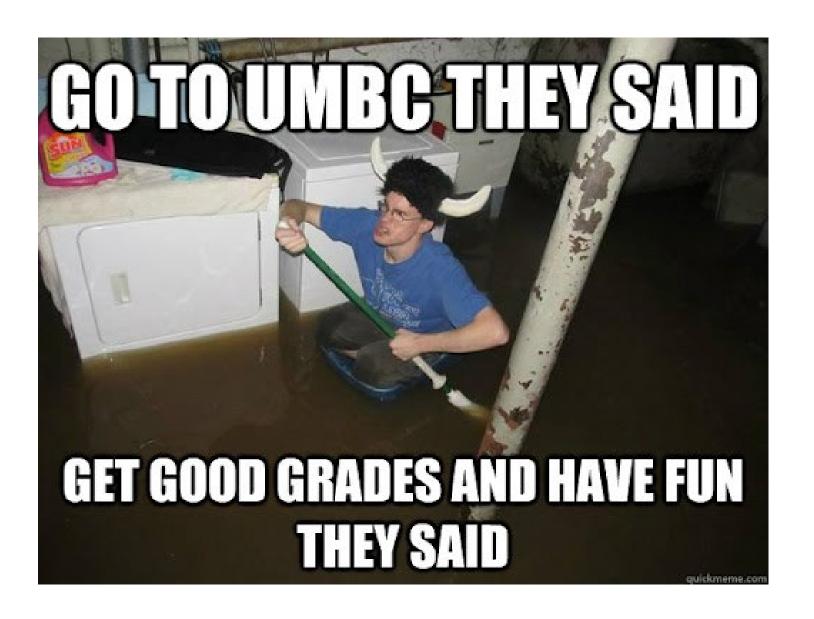
Teaching Assistant: <u>TBD</u>;

Time: Monday and Wednesday 4:00pm - 5:15pm

Location: ITE 229

Course Description | Schedule | Grading Syllabus

# Grading



# **Evaluation Components**

Homework	3-5 assignments including conceptual questions, exercises, and Python implementation and system design.	30%
Project	Course project in groups of 3-4 (smaller or individual groups only for PhD students with the professor's consent).	35%
	<ul> <li>5% for project proposal</li> <li>5% for status update video</li> </ul> Theore is a positive of the first proposal and the fir	L Evens
	<ul> <li>4% for individual reflection</li> <li>10% for final presentation</li> </ul> There is no Final	al Exam
	<ul> <li>8% for final report</li> <li>3% for summarizing other projects</li> </ul>	
Quizzes	short quizzes during class	10%
Scribing Midtons France	Take notes and typeset them for one lecture in the semester	5%
Midterm Exam	October 20 <sup>th</sup> or 22 <sup>nd</sup> (TBD) during class (4PM – 5PM)	20%

There will be opportunities for extra credit (max 10% of total grade) Open-ended questions, writing assignments, creative assignments etc.

## Homework

- Two major types of tasks:
  - Conceptual Questions (pen & paper)
  - Programming mini-projects in Python/Pytorch
- Conceptual:
  - Will be proofs / derivations
  - Points for steps (your thought process)
  - Show all of your work when answering
- Programming:
  - O Most will be open-ended (exploratory). No right or wrong answers! Do your best!
  - o Some tasks will result in bad results (by design). Evaluation will be based on your analysis and conclusions drawn from successful as well as failure cases.

When the teacher says you won't be able to do all the homework in one night



# Quizzes (in class)

- Multiple-choice / True-False / "draw a diagram" / short answer questions about previous lecture(s)
- Take notes during class (in your favorite format)
  - The very act of writing stuff down while you hear something new really really helps with information retention
- We will consider your "top k" grades out of "q" quizzes, with  $q k \ge 2$ 
  - E.g. q = 7; k = 5
  - There will be no make-up quizzes if you miss a class

# Scribing

- Scribing ==
  - Taking high-quality detailed notes during a lecture
  - Typesetting them using Overleaf/LaTeX
  - o CVPR template is available on the Class Website



You can sign-up for your preferred lectures (signup sheet: QR code)

#### • Due Dates:

- Notes for Monday lectures are due before class next Monday
- Notes for Wednesday lectures are due before class next Wednesday



### **Extra Credit**

- HW will have some optional problems (but for extra credit!)
  - Open ended questions or tasks where your creativity is required
  - We may showcase best outcomes of these in class
- Extra credit is capped at 10%
  - o 5 extra points and 91 in the rest of the class
  - $\circ$  18 extra points and 91 in the rest of the class

- → your final grade = 96
- $\rightarrow$  your final grade = 101

- Intention: an opportunity for
  - Doing original research in computer vision
  - Learning how to write coherent research reports based on your results
- Expectation: a simple original idea that
  - o you can *describe clearly*
  - o relate the idea to existing work,
  - o *implement and test* the idea on some real-world problem(s)
- How?
  - Write code, run it on some data, make some figures/tables to present results
  - o read relevant background papers, collect some references
  - o write a report describing your model, algorithm, and results.





- 5% for project proposal
- 5% for status update video
- 4% for individual reflection
- 10% for final presentation
- 8% for final report
- 3% for summarizing other projects

Regular, steady, well-planned work towards the final goal is the best way to complete your project

# Each student will be graded separately

### Project Topic

Pick from our list or choose your own \*

\* needs approval from Tejas

### Group Size: 3 to 4 students

Declare group by March 1
PhD / MS thesis students: can work alone\*

\* needs approval from Tejas

#### **Deliverables**

- 5% for project proposal
- 5% for status update video
- 4% for individual reflection
- 10% for final presentation
- 8% for final report
- 3% for summarizing other projects

### **Deadlines** (tentative)

Oct 3

Nov 7

Nov 7

Dec 3 or Dec 8

Dec 12

Dec 12

## **Deadlines & Late Days**

- Late Days: each student will get 10 late days (for projects and HW only)
  - Each late day extends the deadline by 24 hours
  - Using a late day does not influence the grade.
  - Late submissions turned in after all 10 late days have been exhausted will receive 0 points
- Projects: if a group uses 1 late day  $\rightarrow$  1 late day deducted from all group members!
- Quizzes: we will drop 2 (or more) lowest scores.
   No make up quizzes.
- Late days are provided to help you deal with illness or injury, emergencies, paper deadlines, conference travel, interviews, computer problems, or other personal reasons.

Do not use the late days as an excuse for procrastination ©

## **Attending Classes**

- Attendance is mandatory
  - Exceptions: health reasons and personal emergencies.
  - Impossible to do a good job at homework, quizzes, and midterm (70% of your grade) without your attendance and attention in class.

#### • Perks:

- Classes have (relatively easy) quizzes.
- Meet your future project team! Make new friends

You don't wanna miss these memes



I take academic integrity very seriously. You should too.

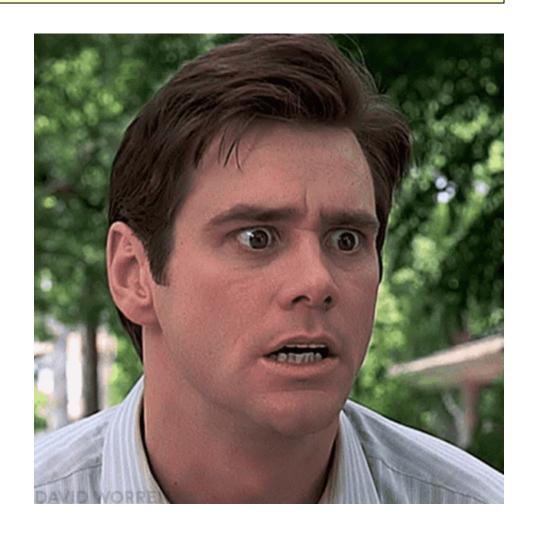
If you're unsure about something, ask us.

You are at a top-tier (R1) research university.

Use this privilege to learn. A good grade will follow.

Don't throw this opportunity away by cheating.

- Presentations, Survey Papers, Quizzes, Exams must be done independently.
- Do not plagiarize. Consequences will not be pleasant.
- Do not use "AI" assistants for any part of any assignment. Consequences will not be pleasant.
- Familiarize yourself with UMBC policy on plagiarism and other forms of cheating: <a href="https://academicconduct.umbc.edu/resources-for-students/">https://academicconduct.umbc.edu/resources-for-students/</a>
- Read the syllabus for consequences of academic integrity violations.



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#### 3.4 Use of AI Assistants

This is a class that teaches you how to design AI systems. Using AI systems to do class work is therefore an obvious form of cheating. The use of AI systems or AI assistants (including but not limited to language models such as ChatGPT) for completing *any* part of assignments in this class is considered cheating. There are no exceptions to this rule.

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#### 3.6 Good Practices

If the integrity of your work in this course is challenged, you are responsible for demonstrating proof that the work submitted is your own. A good starting point is to enable versioning/tracking in Google Docs, Word, Pages, or other software so that your writing activities/progress during the semester can be logged if necessary. Keeping copies of research notes, scribbles, and related material may be helpful, too.

#### 3.7 Viva or Oral Defense of Flagged Submissions

To ensure academic and professional integrity, I reserve the right to hold a one-on-one oral viva (defense) of submissions deemed questionable, to determine your knowledge and mastery of the topic/resources versus the material submitted. Failing that viva will result in an 'F' on the assignment and an Academic Integrity violation report filed with the Graduate School.

I take academic integrity very seriously. You should too.

If you're unsure about something, ask us.

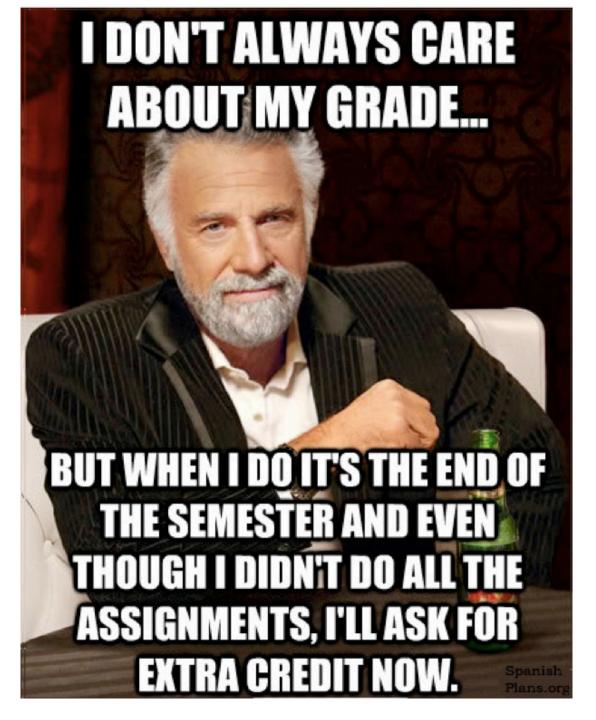
You are at a top-tier (R1) research university.

Use this privilege to learn. A good grade will follow.

Don't throw this opportunity away by cheating.

#### 3.8 Penalties

Academic misconduct could result in disciplinary action that may include, but is not limited to, suspension or dismissal. The absolute minimum penalty for a first offense of academic dishonesty in this course is a grade of zero on the assignment and a one-letter-grade reduction in the final class grade. However, depending on the nature of the offense, the penalty may be more severe, including but not limited to an F for the course, suspension, or expulsion. The minimum penalty for a second offense of academic dishonesty is an F for the course without possibility of dropping, but may be more severe.



# Seek Help Early!

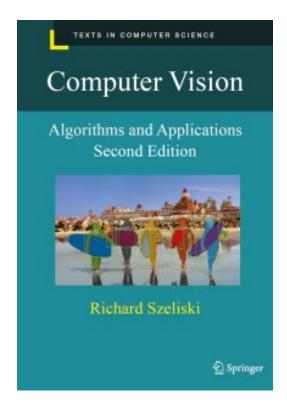


Help us help you.

### Recommended Background

- Linear algebra + calculus + geometry + prob/stats (required)
  - 472/672 should not be your first introduction to these topics
  - Without these tools, you are likely to struggle with the course.
- Python programming with numerical libraries like numpy
  - TA will give a tutorial on computer vision with PyTorch
- Useful resources to brush up on these topics
  - o deeplearningbook.org/contents/linear\_algebra.html
  - o <a href="https://www.deeplearningbook.org/slides/02">https://www.deeplearningbook.org/slides/02</a> linear algebra.pdf
  - o deeplearningbook.org/contents/prob.html
  - o <a href="https://www.deeplearningbook.org/slides/03\_prob.pdf">https://www.deeplearningbook.org/slides/03\_prob.pdf</a>

# Readings

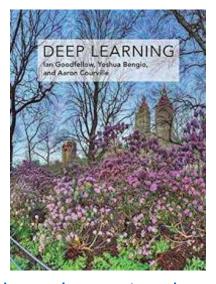


https://szeliski.org/Book/

Free download

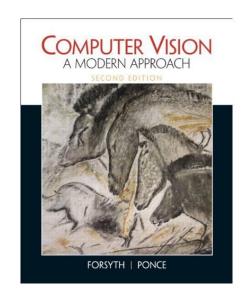
Topic-specific reading will be provided (pdf)

Other useful resources:



www.deeplearningbook.org/

Free download

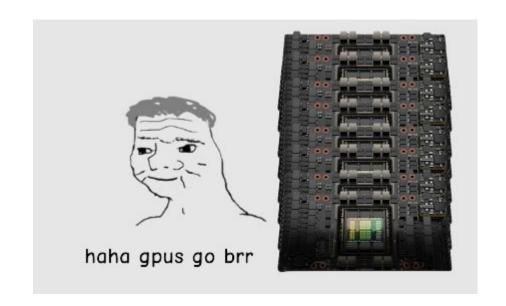


# **GPU Computing**

- Homeworks do not require GPUs
- Projects (depending on the topic you choose) might need GPUs
- GPUs are very expensive.

PLEASE DON'T UPGRADE
YOUR COMPUTER JUST FOR
THIS CLASS !!!

- Google Colab is your friend
  - Collab Pro is free for students!



# New Google Colab features for higher education

Jul 18, 2025 · 2 min read





Students and professors can get Colab Pro free of charge for a year, plus check out new features like an interactive slideshow mode.

## 472 (undergrad) vs 672 (grad)

- We are confident that 472 students are at least as capable than their 672 classmates
- No difference in class materials, exams, quizzes, majority of homework
- Homework: additional parts for 672
- Grad projects will be evaluated at a higher standard



### 472 (undergrad) vs 672 (grad)

#### Main difference: projects (scope and novelty)

- Projects will be graded in terms of "relative growth"
  - You may have previous research experience
  - You may be taking this class to get research experience
- Grad projects:
  - Original & unique research hypothesis with a potential for publication
- Undergrads projects can be:
  - Original & unique research hypothesis with a potential for publication
  - Working on an idea that we provide (i.e. you get to skip "ideation")
  - Innovative applications or combination of existing work



#### FAQ: I'm waitlisted - what can I do?

1. I'm sorry this is happening to you. Thanks for your patience. I (like you) am also bound by UMBC's waitlist policy.

09/03/2025	Waitlist Deadline	Last day to add yourself to a waitlist for a course		
09/04/2025	Waitlists Deactivated	Waitlists are deactivated and purged		
		Last day to make changes to your schedule		
		Last day to change grade method		
09/10/2025	Schedule Adjustment Deadline	Last day to drop a course without a W grade		
		Last day to add internships, independent studies, or		

2. On 09/08 if you're still interested, see me after class. No promises, but I'll try.

#### FAQ: Access to Practice Quizzes and Midterm?

- This is a graduate-level class we will test your concepts (and not your ability to do fast arithmetic / memorization)
  - Make sure you understand the concepts
  - Read the slides and references mentioned in class
- Enjoy the class. Be rigorous. Don't be afraid to fail.
- Don't study just for the grade
  - study because you enjoy the topic!
- There are no study guides, question bank, practice tests
  - this is not high school!
- Welcome to the real world!



#### FAQ: How do I succeed in this class?

- Use pen-and-paper. Draw! Draw! Draw!
- Computer vision is a very popular and open-source topic
  - o Feel free to read or watch lectures from other professors
- Focus on grasping fundamentals!
  - HW will become easy once you know the concepts behind the problems and projects.
- Ask for help
  - o TA Office Hours
  - o Tejas Office Hours

## FAQ: Can I join your research lab?

- The Cognitive Vision Group (CVG) broadly works on "conceptual characterization of visual scenes" with some goals including:
  - o interpretation of visual data in presence of incomplete information,
  - o recognizing and adapting to novelty and variations,
  - leveraging external knowledge and reasoning modules to generalize to new contexts, domains, environments, and tasks,
  - o acquiring visual knowledge and communicating it to other machines and humans.
- Joining (See FAQ/note on my website)
  - Take this class and talk to me during office hours about your interests
  - o <a href="https://www.tejasgokhale.com/docs/cvg\_starter\_pack.pdf">https://www.tejasgokhale.com/docs/cvg\_starter\_pack.pdf</a>



#### Other Questions?



Scribing /
Project Team
Signup Sheet



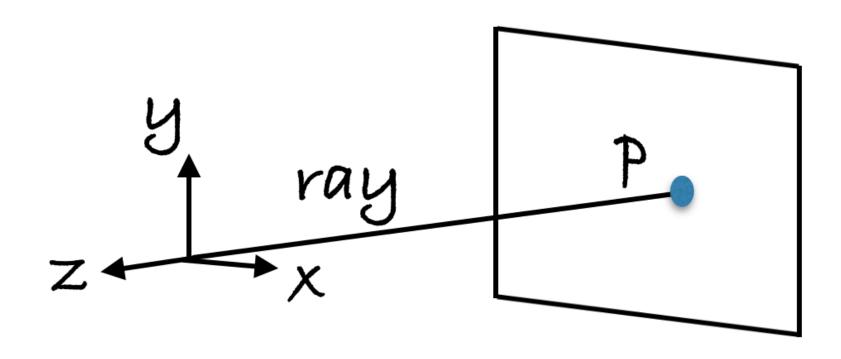
Class Website



# Timeline of Buzzwords in Vision

1970 1980 1990 2000 2010 2020 Digital image processing Intrinsic images Optical flow Image pyramids Shape from shading, texture, and focus Projective invariants Graph cuts Feature-based recognition Machine learning Deep learning Vision and language Blocks world, line labeling Generalized cylinders Pattern recognition Stereo correspondence Structure from motion Physically-based modeling Regularization Markov random fields Kalman filters 3D range data processing Factorization Physics-based vision Particle filtering Energy-based segmentation Face recognition and detection and rendering **Texture synthesis and inpainting** Modeling and tracking humans Semantic segmentation Computational photography Category recognition SLAM and VIO Image-based modeling

# **Image Formation**



## Let's say we have a sensor...

digital sensor (CCD or CMOS)

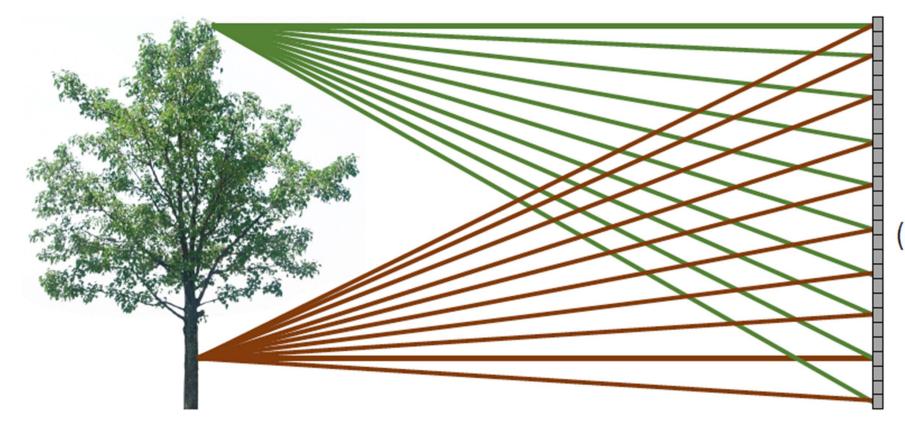
#### ... and an object we like to photograph



digital sensor (CCD or CMOS)

What would an image taken like this look like?

#### Bare-sensor imaging



real-world

object

digital sensor (CCD or CMOS)

All scene points contribute to all sensor pixels

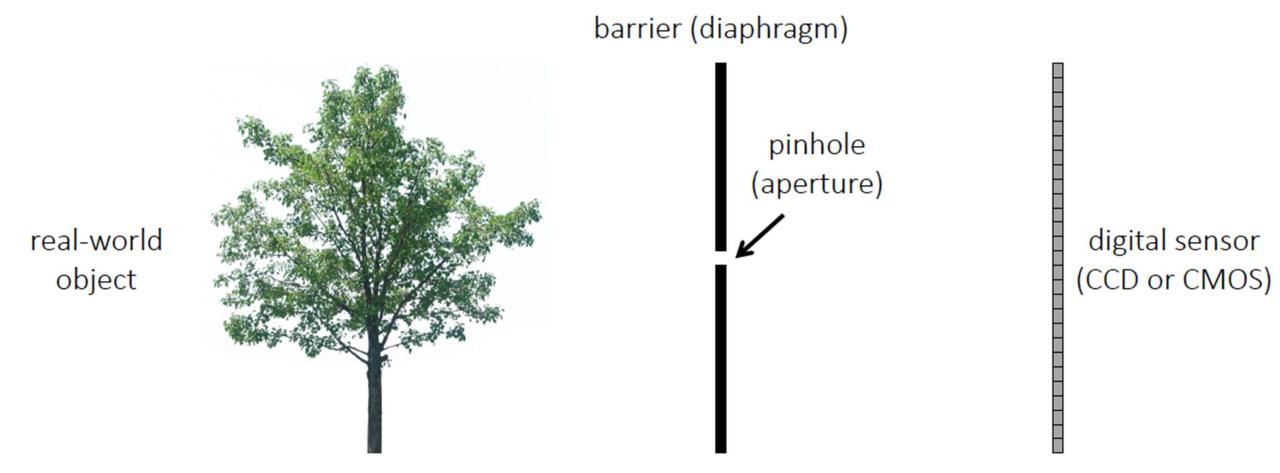
What does the image on the sensor look like?

#### Bare-sensor imaging

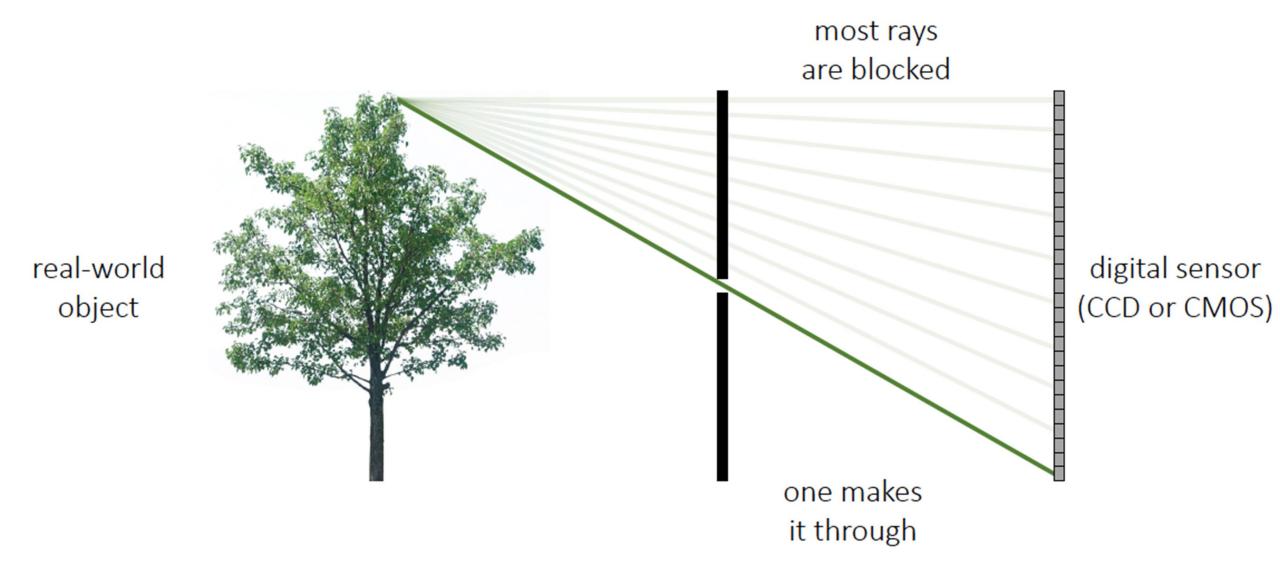


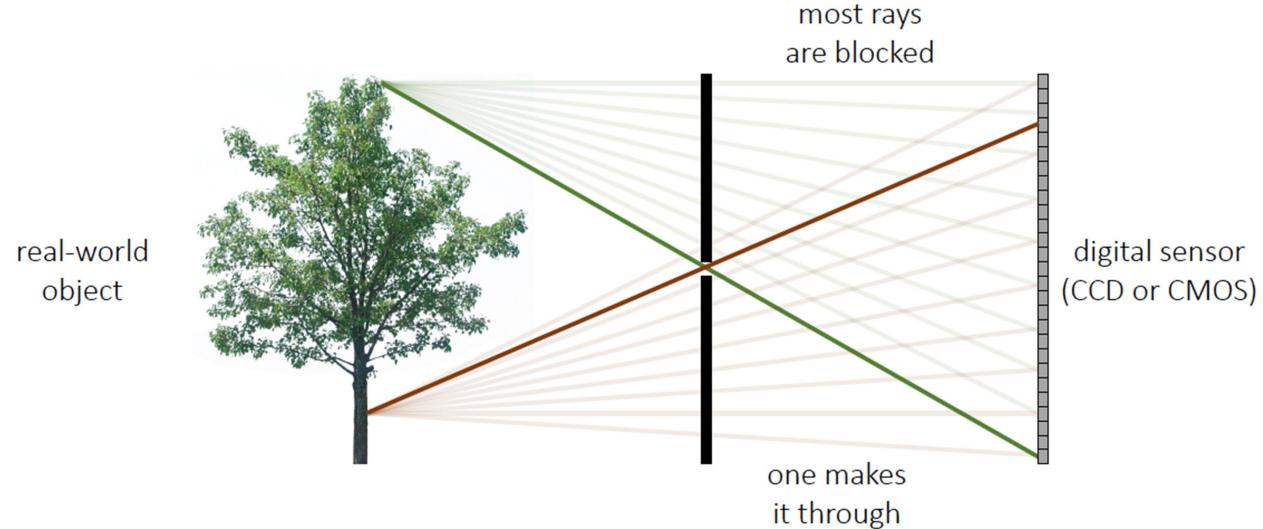
All scene points contribute to all sensor pixels

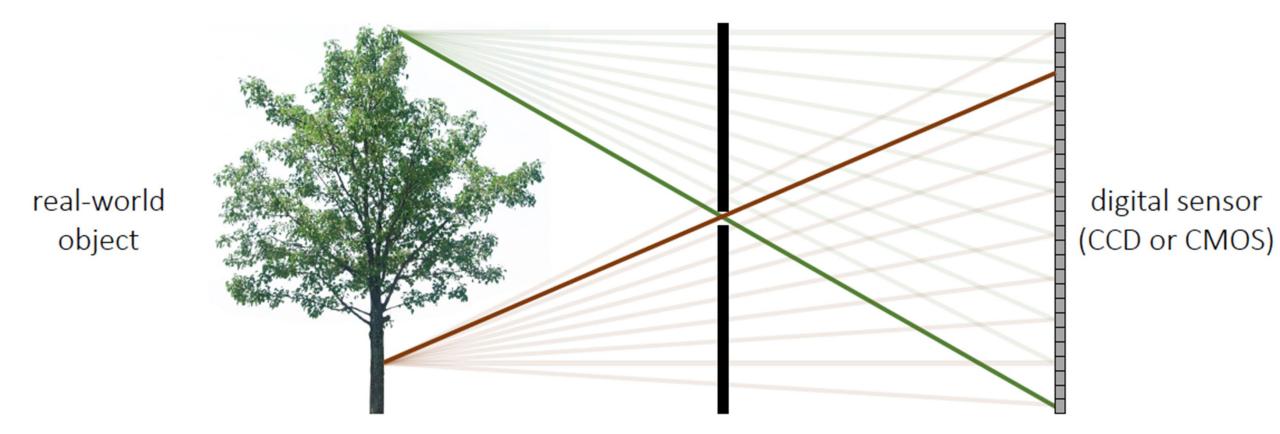
#### Let's add something to this scene



What would an image taken like this look like?

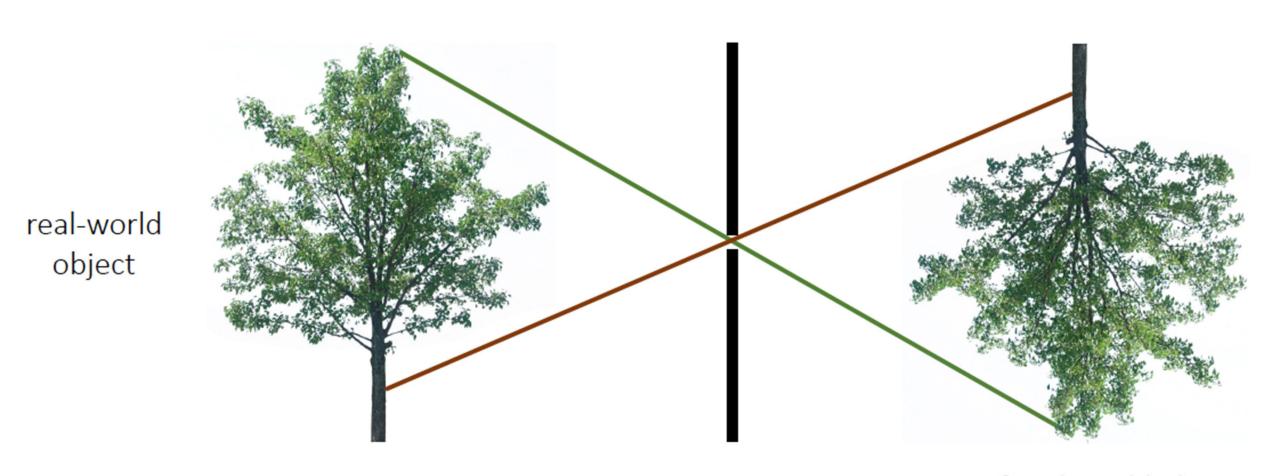






Each scene point contributes to only one sensor pixel

What does the image on the sensor look like?



copy of real-world object (inverted and scaled)

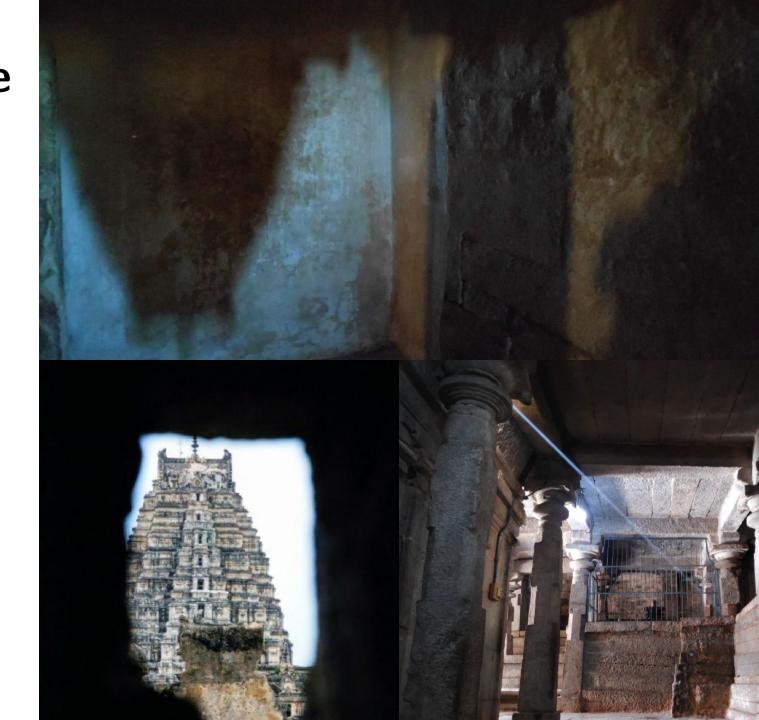
# "Camera Obscura"

- Camera obscura = "dark chamber" in Latin
- Theorized to be the reason for distortions in prehistorical neolithic paintings ...
- Mozi (China, ~ 400 BC)
- Aristotle (Greece, ~ 350 BC)



# Ancient Architecture or Accidental Pinhole Camera?

- Shiva Temple in Hampi (India)
- inverted image can be seen
- Built in ~600 AD



# Make your own pinhole camera while the sun shines (Ancient Computer Vision Proverb)

Paper with a hole in it ... some creative friends ... an auspicious day ...



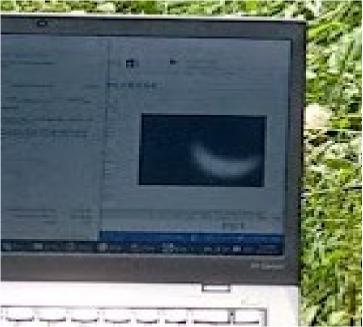


Where are they now? Faculty at UMBC, Faculty at UC Riverside; Fellow at Allen Institute; Research Scientist at Adobe ...

# "Make your own pinhole camera while the sun shines" (Ancient Computer Vision Proverb)

"Great American Eclipse" of August 21, 2017

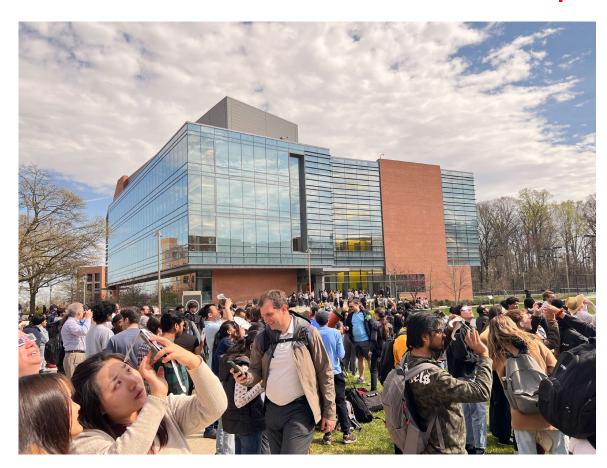






# "Make your own pinhole camera while the sun shines" (Ancient Computer Vision Proverb)

"Great North American Eclipse" of April 8, 2024 at UMBC



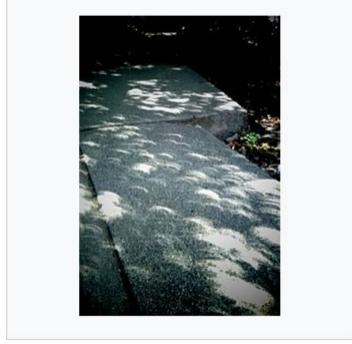


# "Make your own pinhole camera while the sun shines" (Ancient Computer Vision Proverb)

Images produced by natural pinholes [edit]

(Images of the eclipse created by natural pinholes formed by tree leaves)







North Cascade mountains (British Columbia and Washington).

East Wenatchee, Washington

Moon, Pennsylvania

#### Pinhole camera terms

