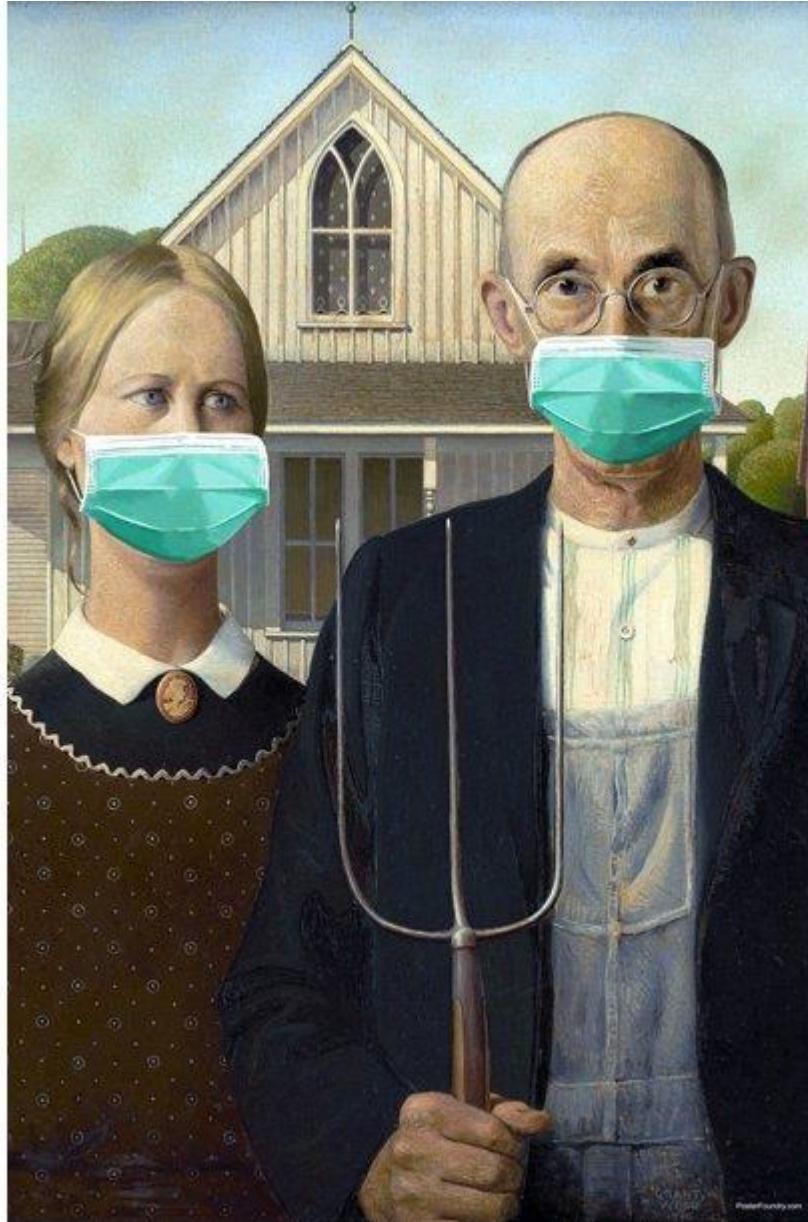


CS 194/294-26: Intro to Computer Vision and Computational Photography



Instructors: Alexei Efros
Angjoo Kanazawa
GSIs: Rui long Li
Evonne Ng
Readers: Jason Ding
Boyuan Ma
Kamyar Salahi
Jeffrey Shen
UC Berkeley, Fall 2022, in person

Covid Precautions



Today

Introductions

Why this Course?

Administrative stuff

Brief History of Visual Data

Teaching Team: professors

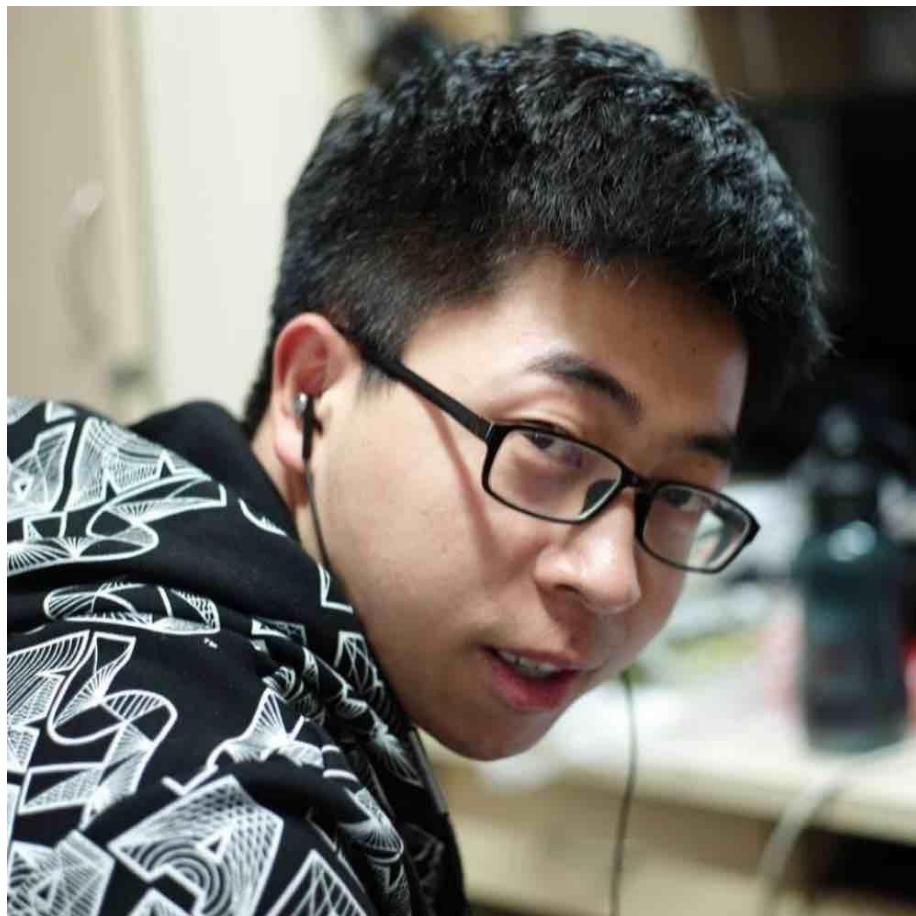


Angjoo Kanazawa



Alexei Efros

Teaching Team: GSIs



Ruilong Li



Evonne Ng

Teaching Team: Readers/Tutors



Kamyar
Salahi



Boyuan
Ma



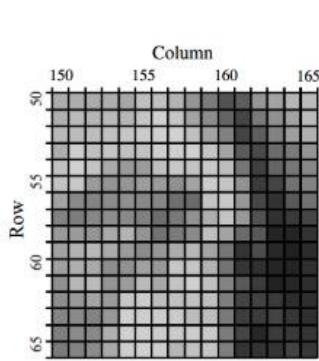
Jason Ding



Jeffrey
Shen

Why This Course?

Visual Computing in the old days...

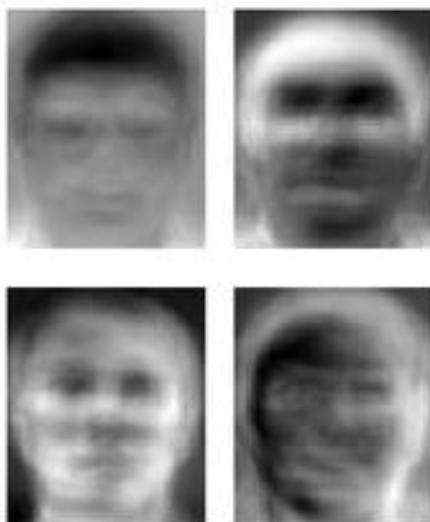


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Image Processing
EECS 225B

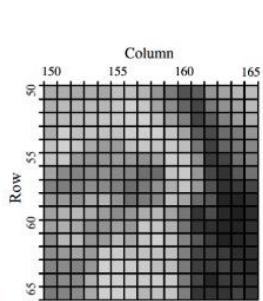


Computer Graphics
CS 184



Computer Vision CS 280

Visual Computing gets interconnected



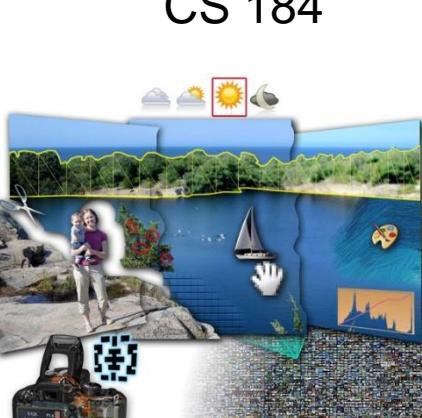
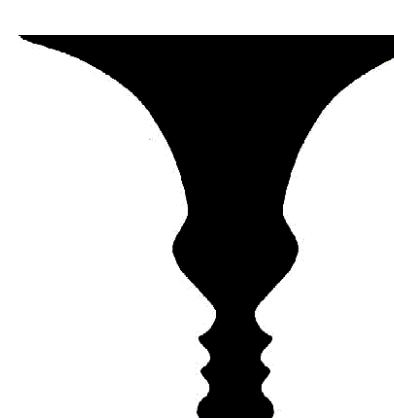
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Image Processing
EECS 225B

Art History
ART 10

Computer Graphics
CS 184



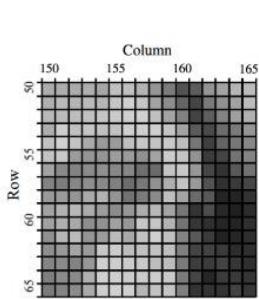
Computational
Photography

Machine
Learning

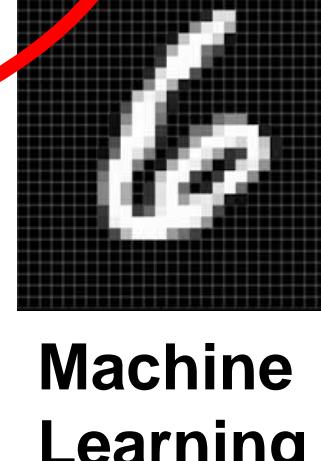
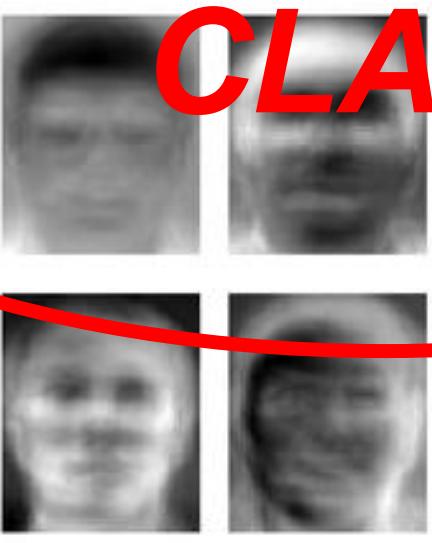
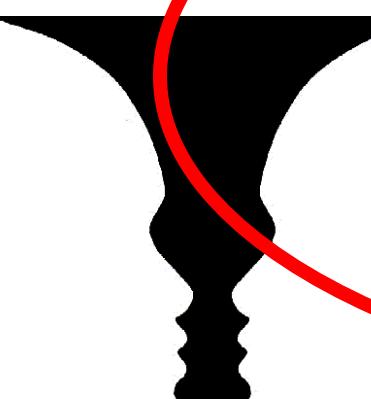
PSYCH

Computer Vision CS 280

Visual Computing gets interconnected



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PSYCH

Computer Vision CS 280

Computational
Photography

Machine
Learning

Visual Computing gets interconnected

Image Processing EECS 225B

Art History ART 101

Computer Graphics CS 184

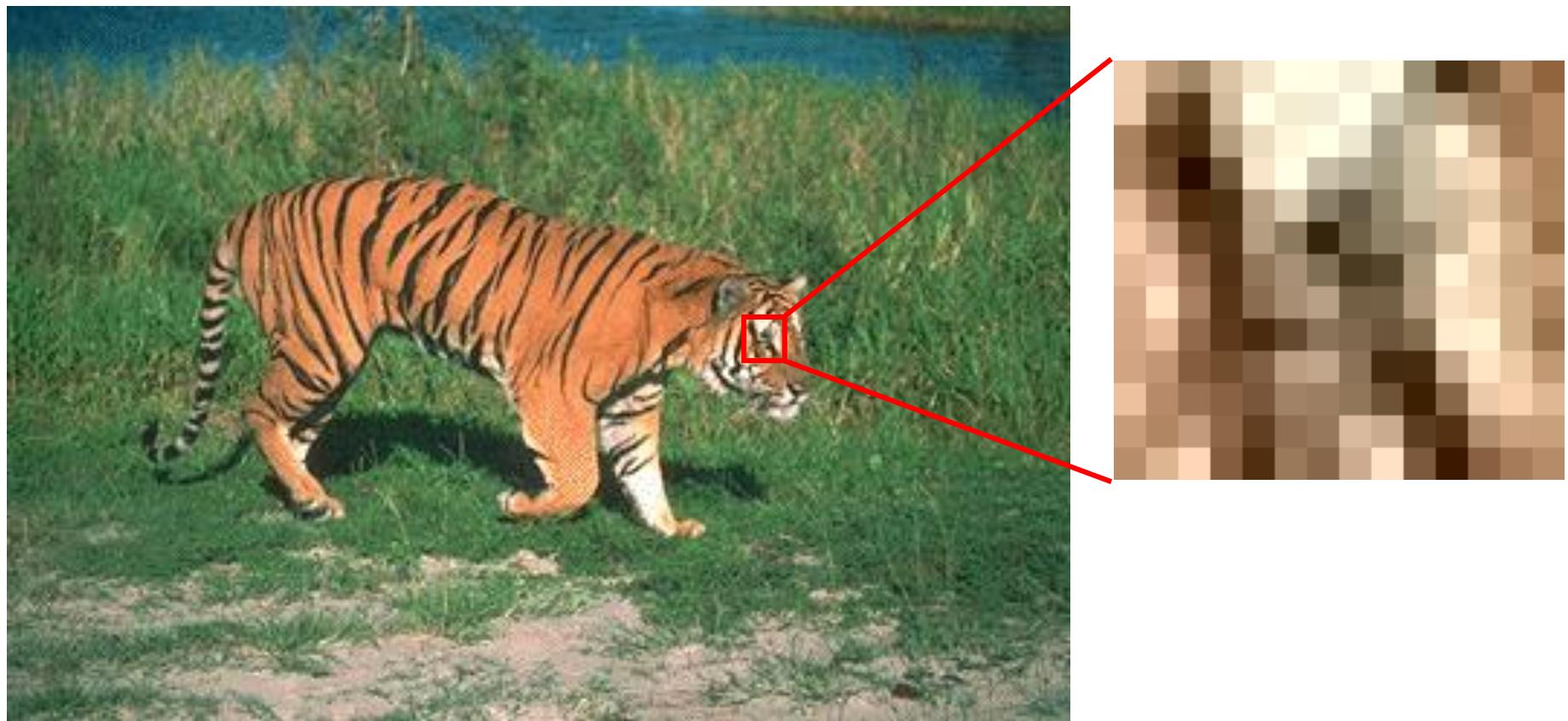
Visual Perception PSYCH

CS194-26: Focus on Visual Data

The key objective of this class is *to become friends with every pixel!*

Course objectives

1. You will appreciate the fundamental difficulty of understanding and computing with visual data



Course objectives

2. You will get a foundation in image processing and computer vision

- Camera basics, image formation
- Convolutions, filtering
- Image and Video Processing (filtering, anti-aliasing, pyramids)
- Image Manipulation (warping, morphing, mosaicing, matting, compositing)
- Projection, 3D, stereo
- Basics of recognition
- ...

Course objectives

3. You will get a more intuitive understanding of important mathematical and computational concepts

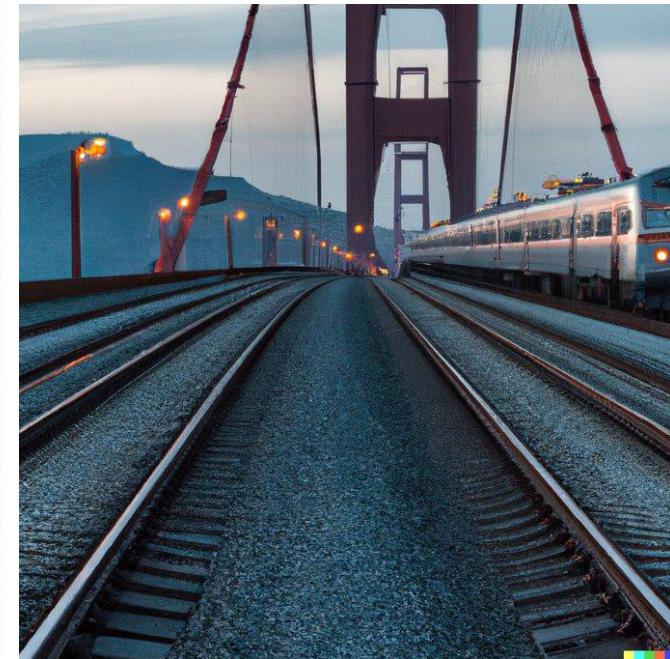
- Gradients
- Change of basis, interpolation, extrapolation, PCA
- FFT
- Dynamic programming, recursion
- Machine learning, Convolutional Neural Networks
- Large-data Approaches
- ...

Course objectives

4. You will learn approaches for visual synthesis



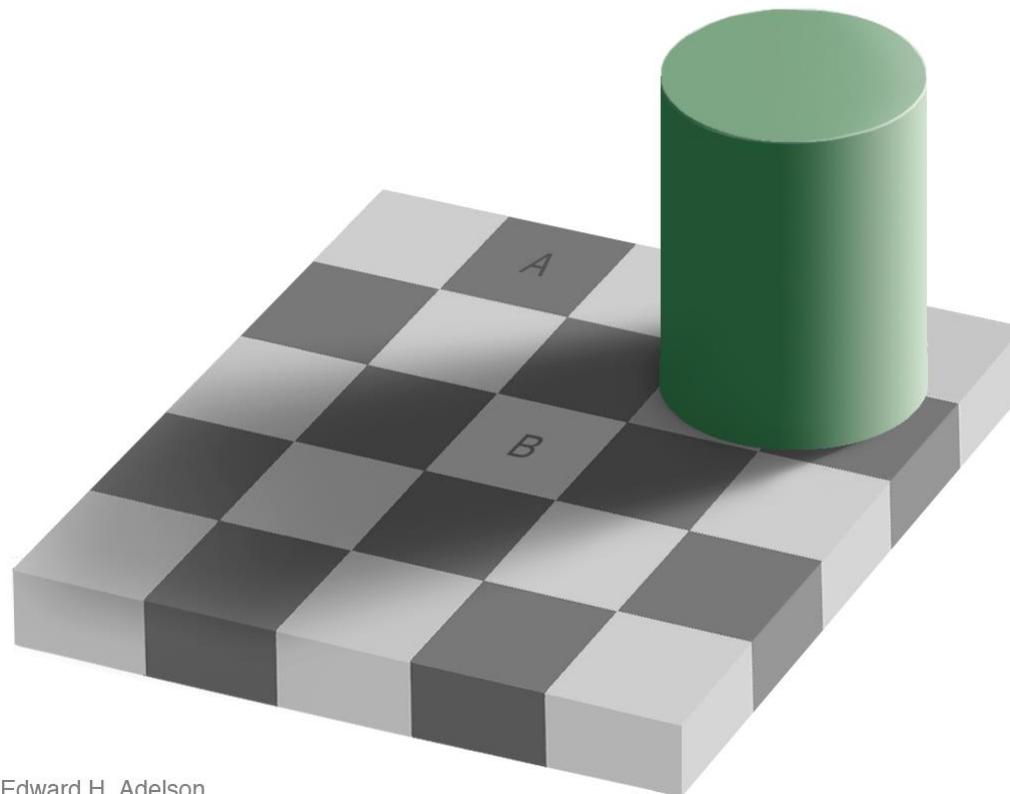
Graphic by James Hays



DALL-E + Danielle Baskin

Course objectives

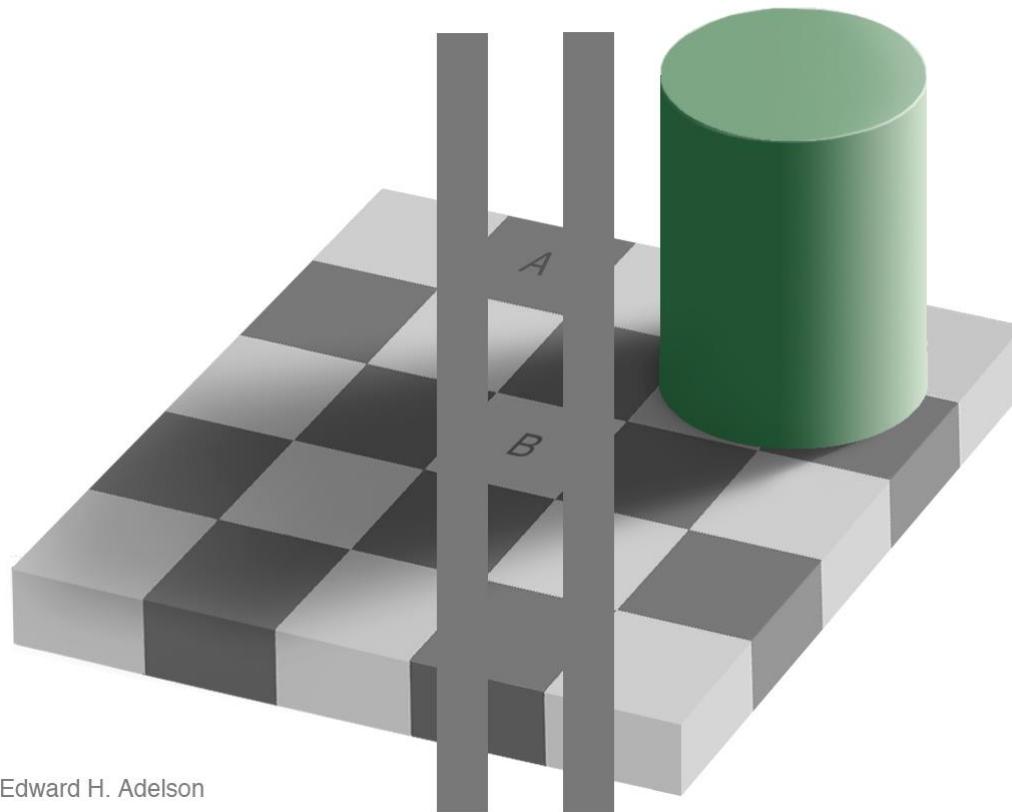
4. You'll better appreciate human visual perception



Edward H. Adelson

Course objectives

4. You'll better appreciate human visual perception



Different people see different things



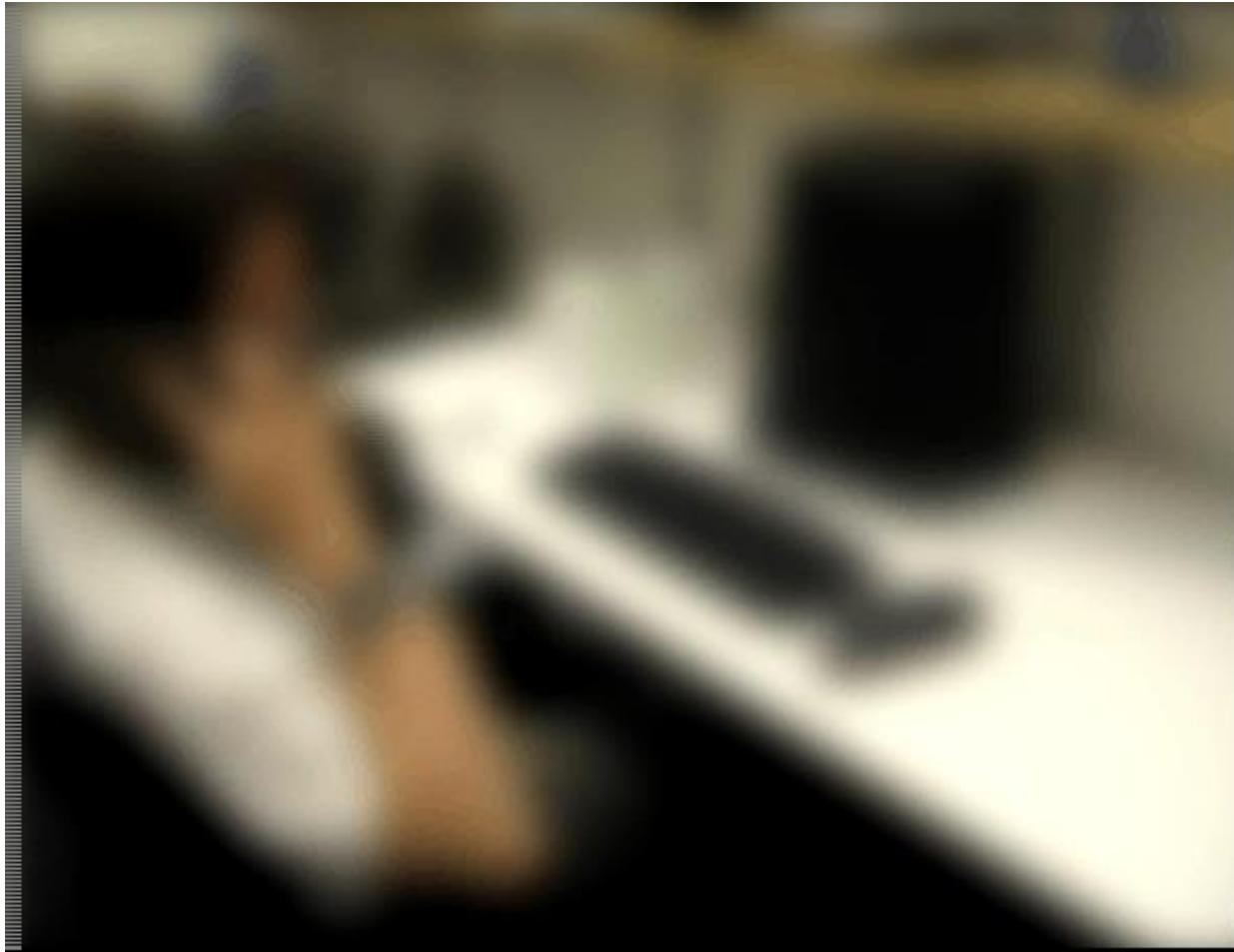
https://en.wikipedia.org/wiki/The_dress

Seeing vs. experience



Seeing less than you think...





Video by Antonio Torralba (starring Rob Fergus)

But actually...



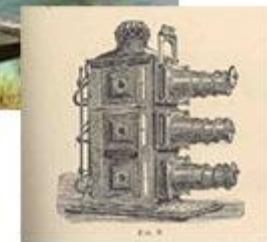
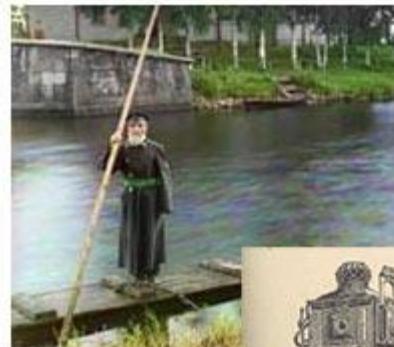
Video by Antonio Torralba (starring Rob Fergus)

Course objectives

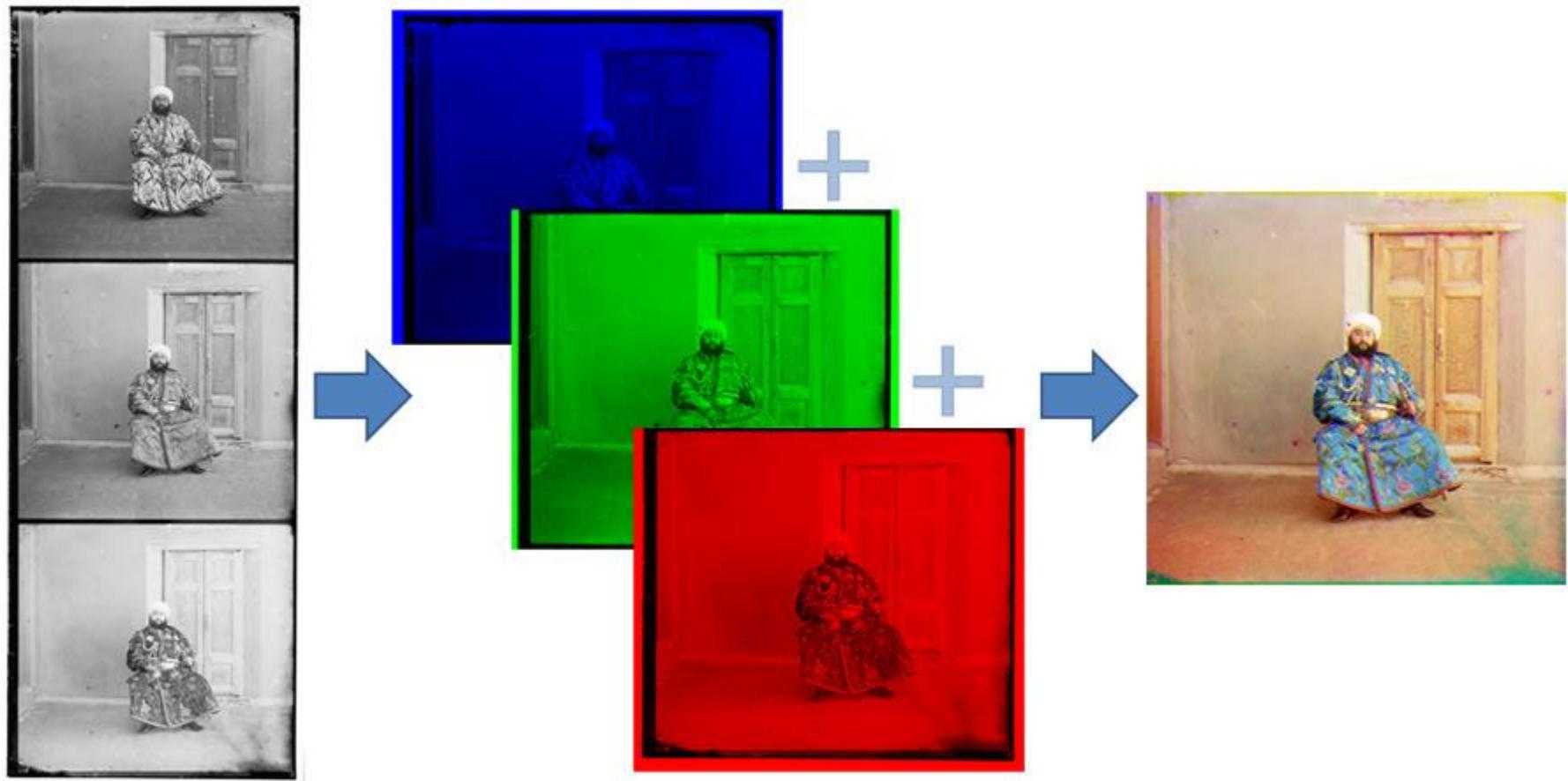
5. You'll have fun doing cool stuff, coding up a storm, while you befriend the pixels

Programming Project #1

Prokudin-Gorskii's Color Photography (1907)



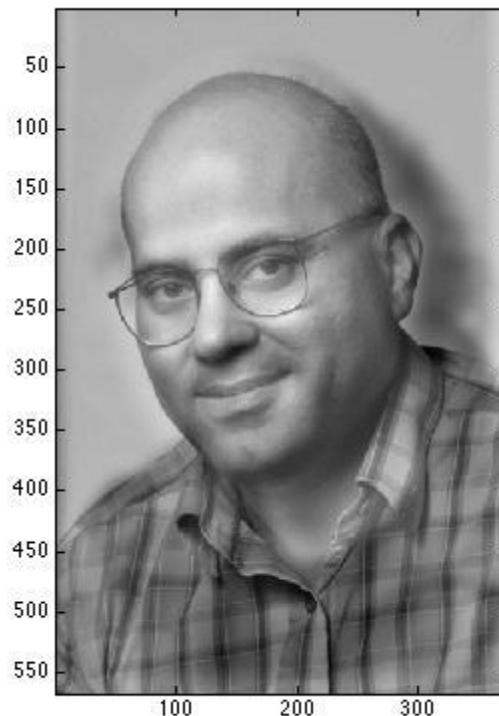
Programming Project #1



Project 2: Fun with frequencies



Project 2: Fun with frequencies



Prof. Christos Papadimalik

Project 2: Fun with Frequencies



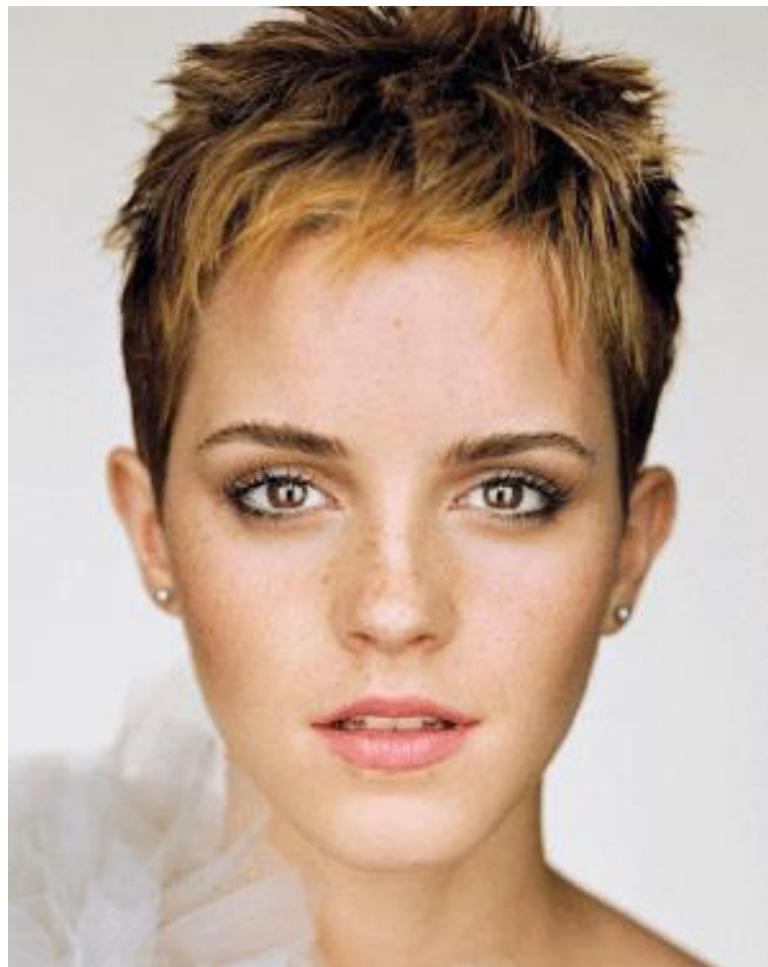
cloning



seamless cloning

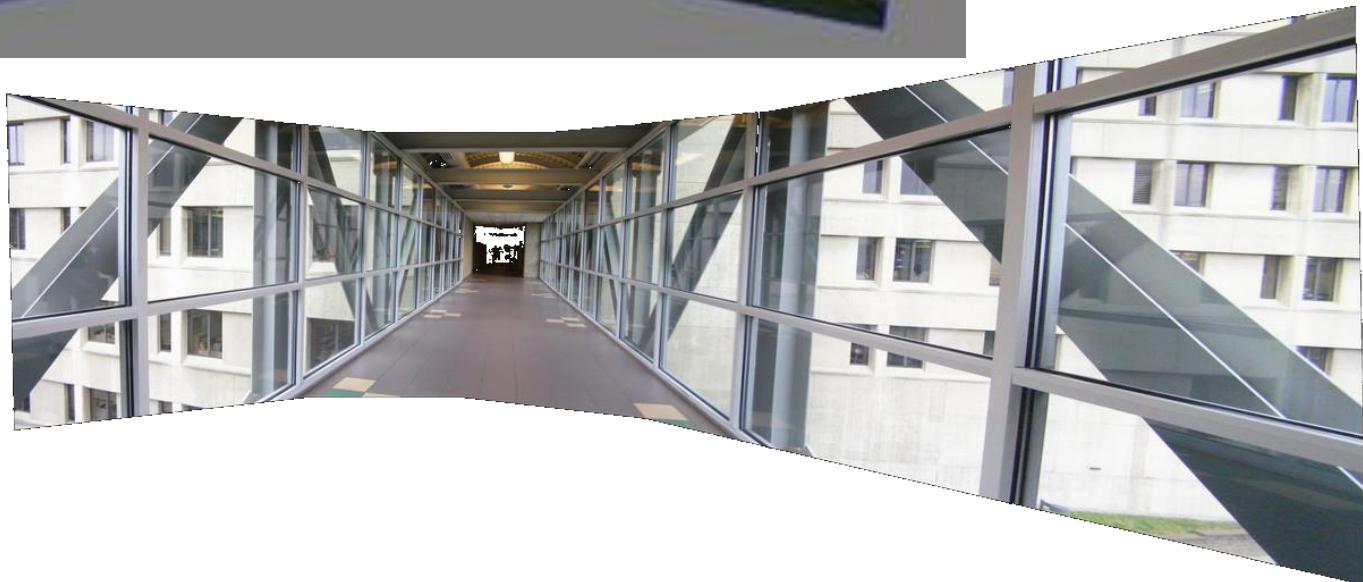
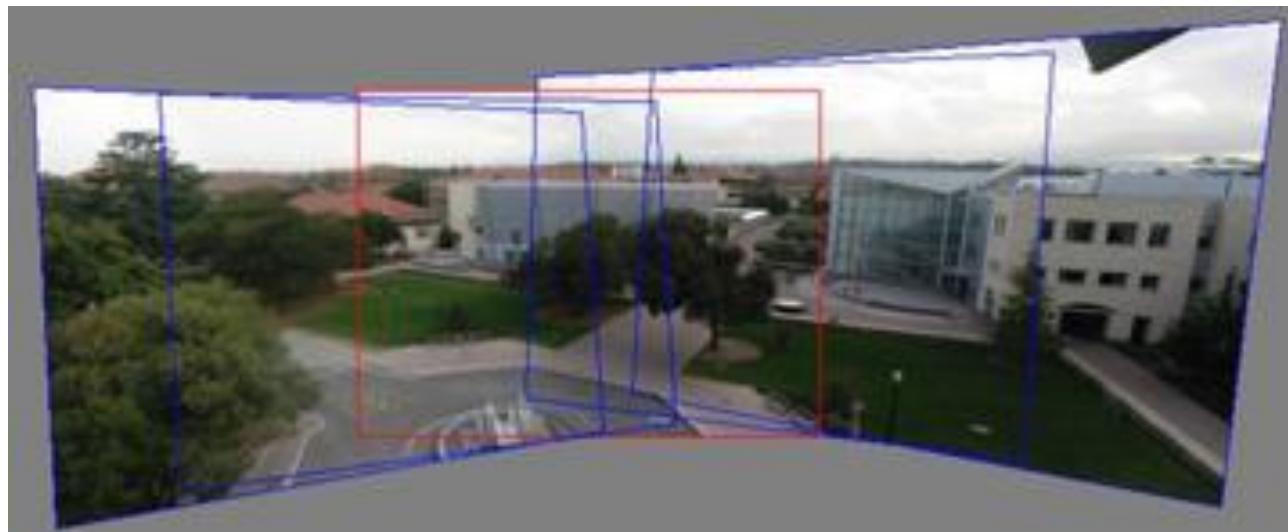
sources/destinations

Project 3: Face modeling and morphing



Project 4: Panorama Stitching

Photo Mosaics



Project 5: Deep Facial Keypoint Detection



Overview Data Code Discussion **Leaderboard** Rules [Join Competition](#) ...

#	Team Name	Notebook	Team Members	Score	Entries	Last
1	Anant Sahai			4.86452	22	15d
2	Ryan Mei			5.34105	4	16d
3	Norman Karr			5.82764	9	17d
4	Please-make-the-midterm-easy			5.88478	6	18d
5	Adam Chang			6.01715	2	13d
6	howdidanantget4.8			6.02591	12	16d
7	Shaina Chen			6.62266	5	17d
8	Kevin Chen			6.63344	13	16d
9	Elden Ring			6.93257	3	22d
10	Jingyi Annie Zhou			7.14999	1	15d
11	Zhibo Fan			7.16965	3	20d
12	Jason Ding			7.24119	12	11d
13	Tai... Th...			7.34850	0	10d

Final Project

Something cool!!!

- We will have some pre-canned projects
- Will also have some suggestions, cool datasets, etc
- Or you can do whatever you want!

(can be done in groups of 2 or 3)

Example Pre-canned Project

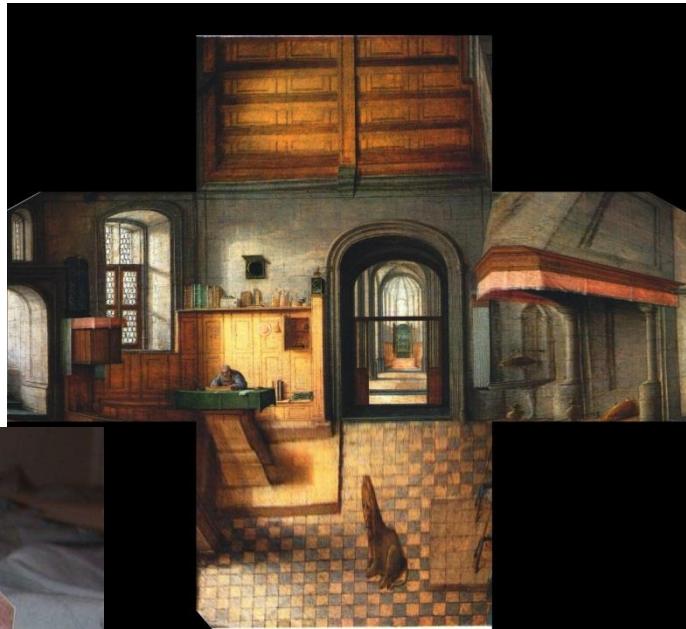
Tour Into the Picture



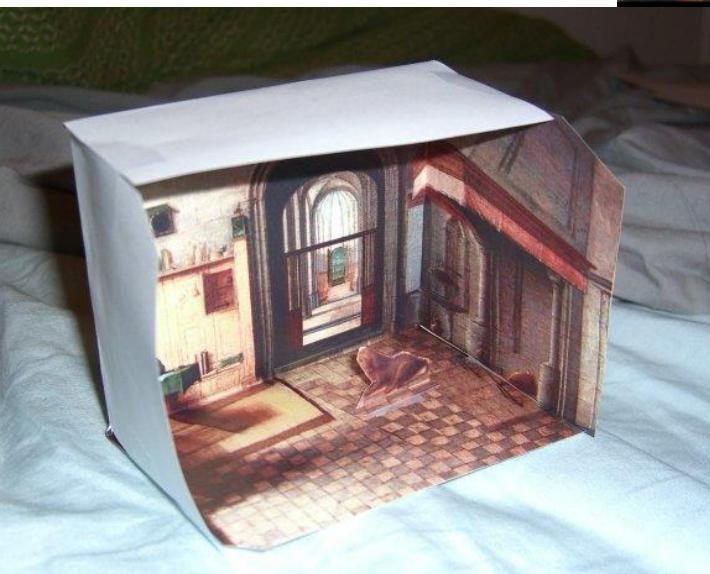
Paper Pop-up



Step 1: define planes



p 2: rectify each plane



Step 3: compute 3D box coords

Sample final project in my class



Everybody Dance Now



Source Subject

*Challenging due to missed detections

<https://www.youtube.com/watch?v=PCBTZh41Ris&feature=youtu.be>

For each project:

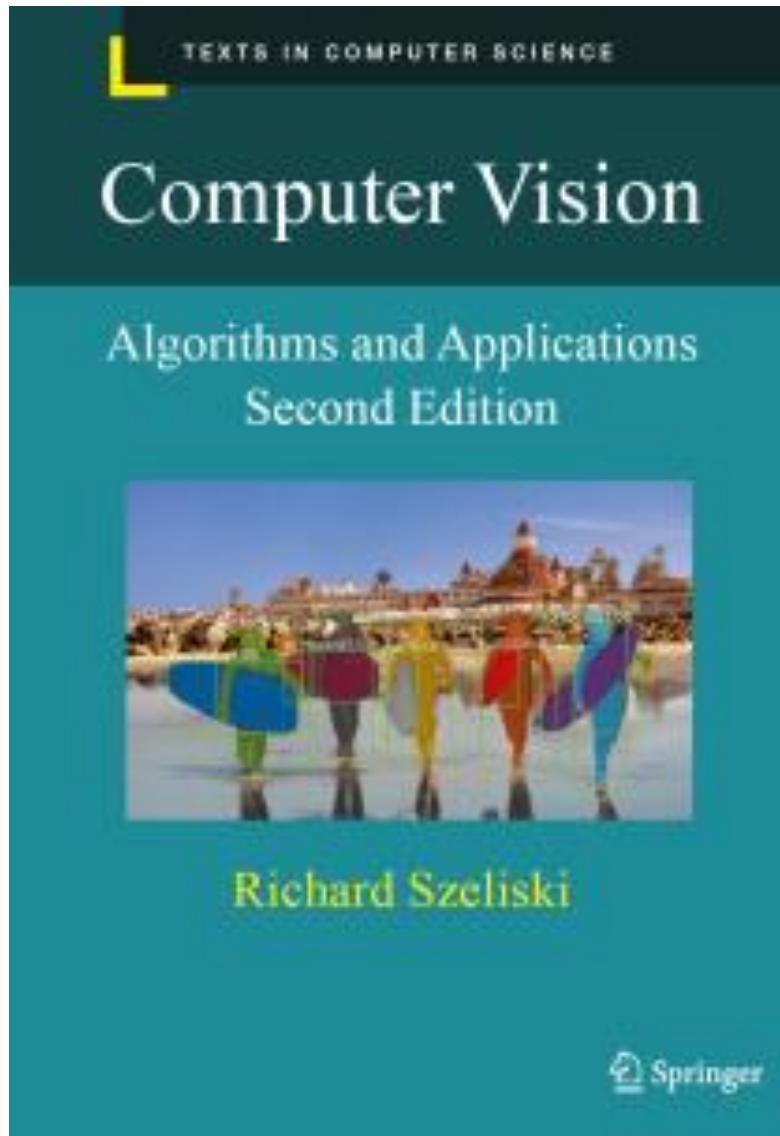
Derive the **math**, implement stuff **from scratch**,
and apply it to your **own** photos

Every person does their own project (except final
projects)

Reporting via web page (plus submit code)

Afterwards, vote for class favorite(s)!

Textbook



<http://szeliski.org/Book/>

Class Organization / Administrivia

General

Prerequisites

- Linear algebra!!! (EE16A, Math 54, or Math 110)
- Good programming skills (at least CS61B)
- Deep Learning experience strongly recommended!

Emphasis on programming projects!

- Building something from scratch

Graduate Version:

- Final project required (not pre-canned), including conference-style report paper

This will be a “live” class:

- Attendance is required

Rule # 1: No lecture recordings

This is an in-person class. You are come to the lecture and ask questions!

Only available by request for truly exceptional circumstances, e.g. severe illness

Rule # 2:

Deadline is a deadline

In real life there's no slip days

This is a FUN but INTENSE class, projects come **one after another**

Know that more slip days you use, the tougher next project gets. They are for **emergencies**.

Projects are time consuming. Part of it is to create a website, which also takes a lot of time.

Rule # 3: TA's don't read code

TA's don't debug code for you.

Part of the skill is to learn how to ask questions to debug the issue without presenting the code

Visualize the results and send those to figure out what is wrong

Use the pixels – become friends with visual debugging

Getting help outside of class

Course Web Page

- <http://inst.eecs.berkeley.edu/~cs194-26/>

Discussion board:

- piazza

Office hours

- TBA... see webpage and piazza

Administrative Stuff

Grading

- Programming Project (60%)
- Exam + possible popup quizzes (20%)
- Final Project (20%)
- Class Participation: priceless

Late Policy

- Five (5) **emergency** late days for semester. The expectation is you will never use them.
- Max 10% of full credit afterwards

Extra Points

- Most projects will have optional “bells & whistles”
- These extra points could be used to pad scores on other projects (but not exams!)

Academic Integrity

- Can discuss projects, but **never share code**
- Don't look up code or copy from a friend
- If you're not sure if it's allowed, ask
- Cite any sources and inspirations

Waitlists

- To keep this course live, we are limited by room size (217 people)
- However, we expect 50-70 people to drop after the first two projects ☺
 - So, if you are on waitlist, etc, you have good chance to get into class
 - But need to start doing projects!

Warning: historically high GPA of this course

- Survivor bias
- High class GPA != easy course
- This is a FUN but INTENSE class
- You write the code from scratch, that's the point.
- Rubrics are fuzzy, goals are ill-defined, that's the point.

Why you should NOT take this class

- Project-based class
 - No canned problem sets
 - Not theory-heavy (but will read a few research papers)
 - No clean rubrics
 - Open-ended by design
 - Will not copy advanced topics, but will try to make sure everyone understands the basics super-well
- Need time to think, not just hack
 - **Creativity** is a class requirement
 - Not a class to learn about Deep Learning!
- Lots of work...There are easier classes if
 - you just need some units
 - you care more about the grade than about learning stuff
- **Not worth it if you don't enjoy it**

Now... reasons TO take this class

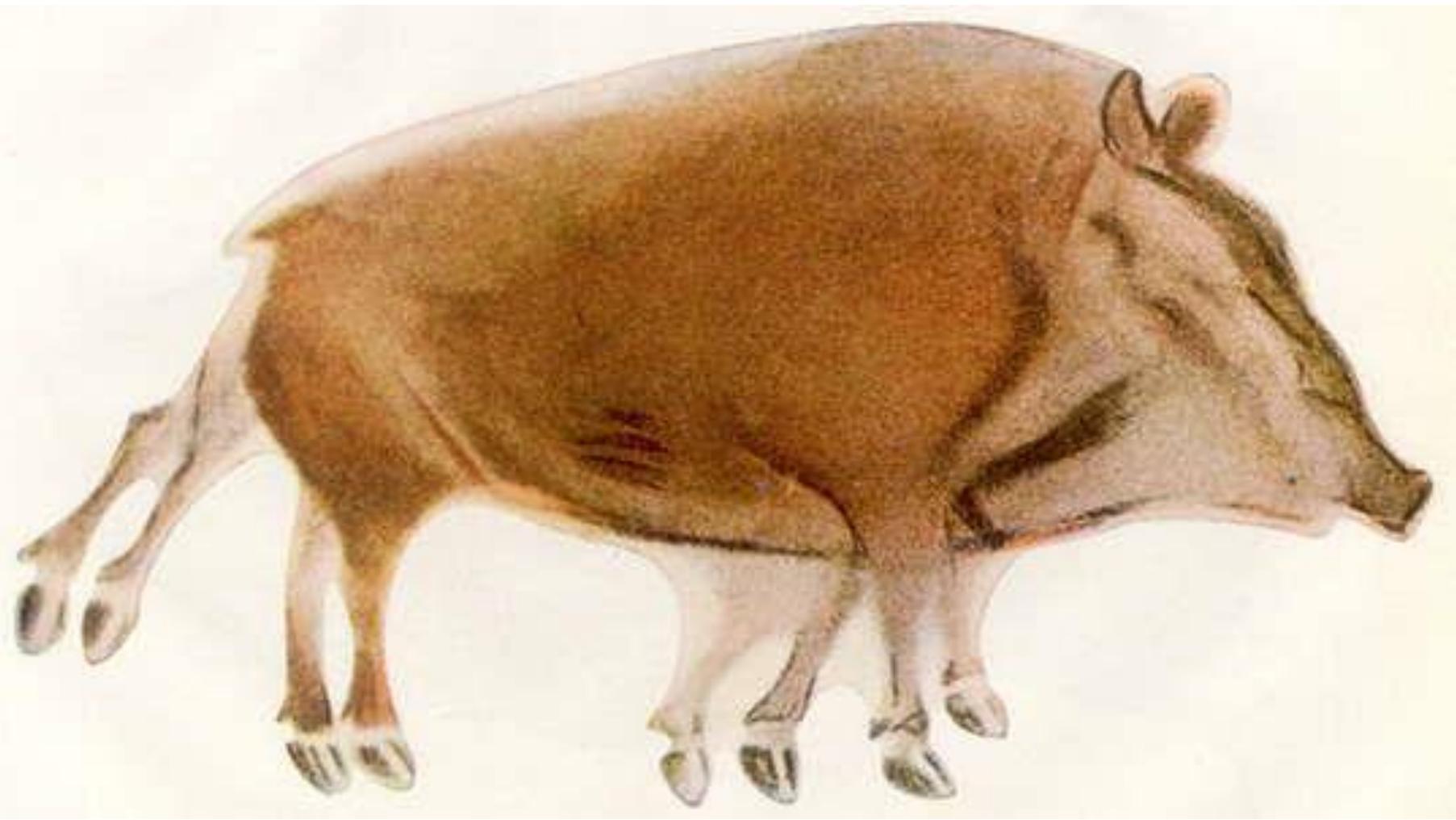
- It's your reward after 3 grueling years ☺
- You get to work with pictures, unleash your creative potential
- Interested in grad school? ☺

A Brief History of the Visual Data

Depicting Our World: The Beginning



Prehistoric Painting, Lascaux Cave, France
~ 13,000 -- 15,000 B.C.



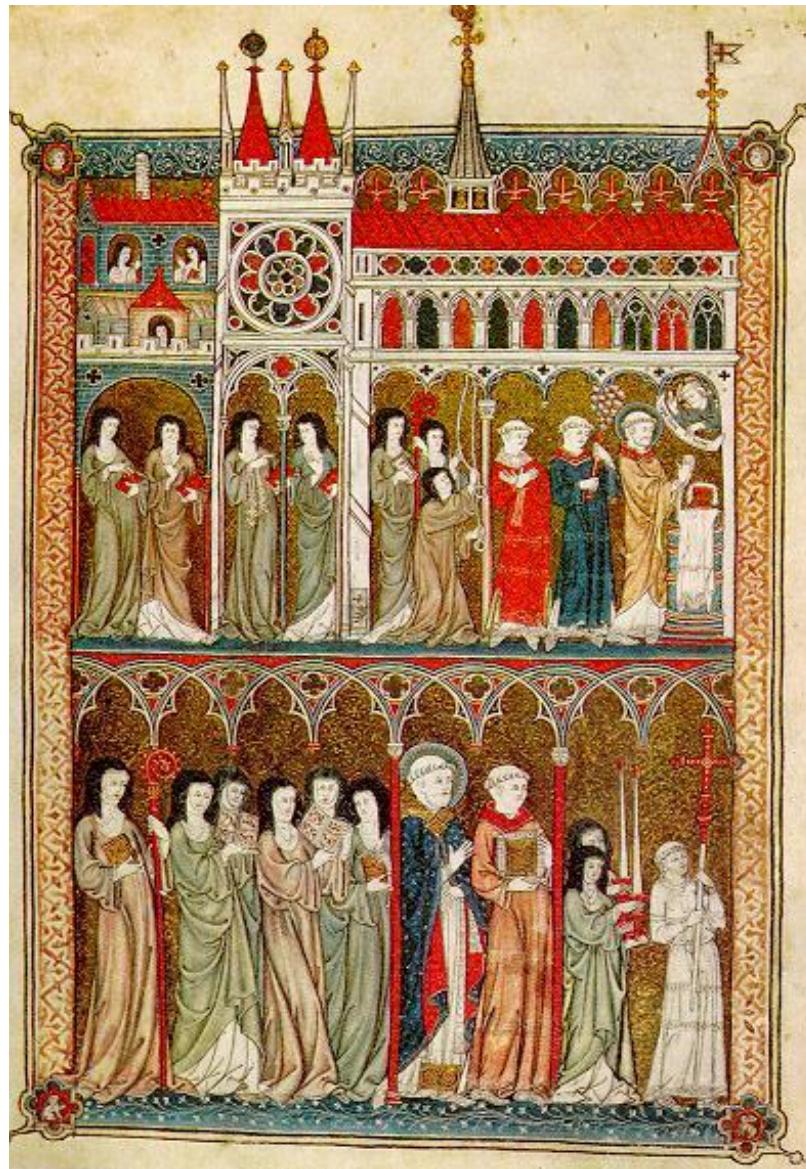
Prehistoric Cave Painting, Altamira
~ 20,000 – 15,000 B.C.

Depicting Our World: Middle Ages



The Empress Theodora with her court.
Ravenna, St. Vitale 6th c.

Depicting Our World: Middle Ages



Nuns in Procession. French ms. ca. 1300.

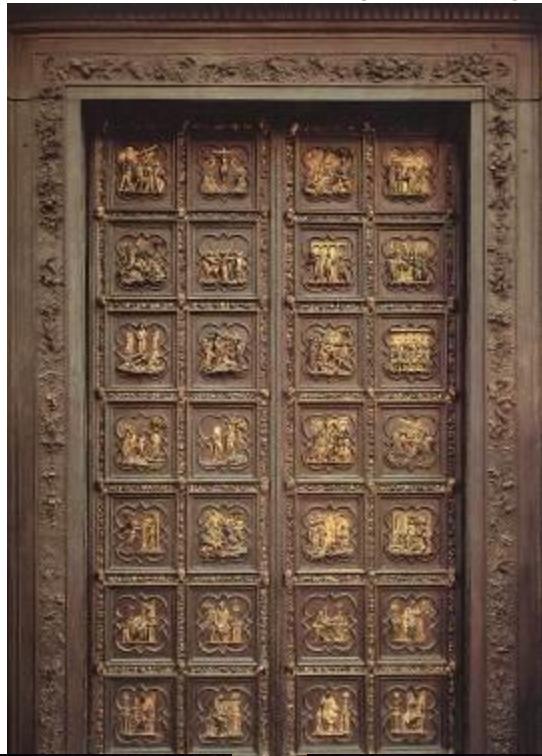
Beginnings of the Renaissance



Giotto, *The Mourning of Christ*, c.1305

Depicting Our World: Renaissance

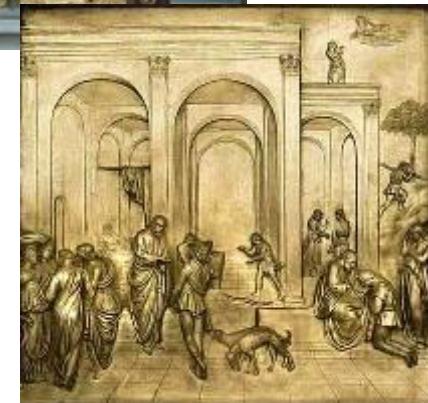
North Doors (1424)



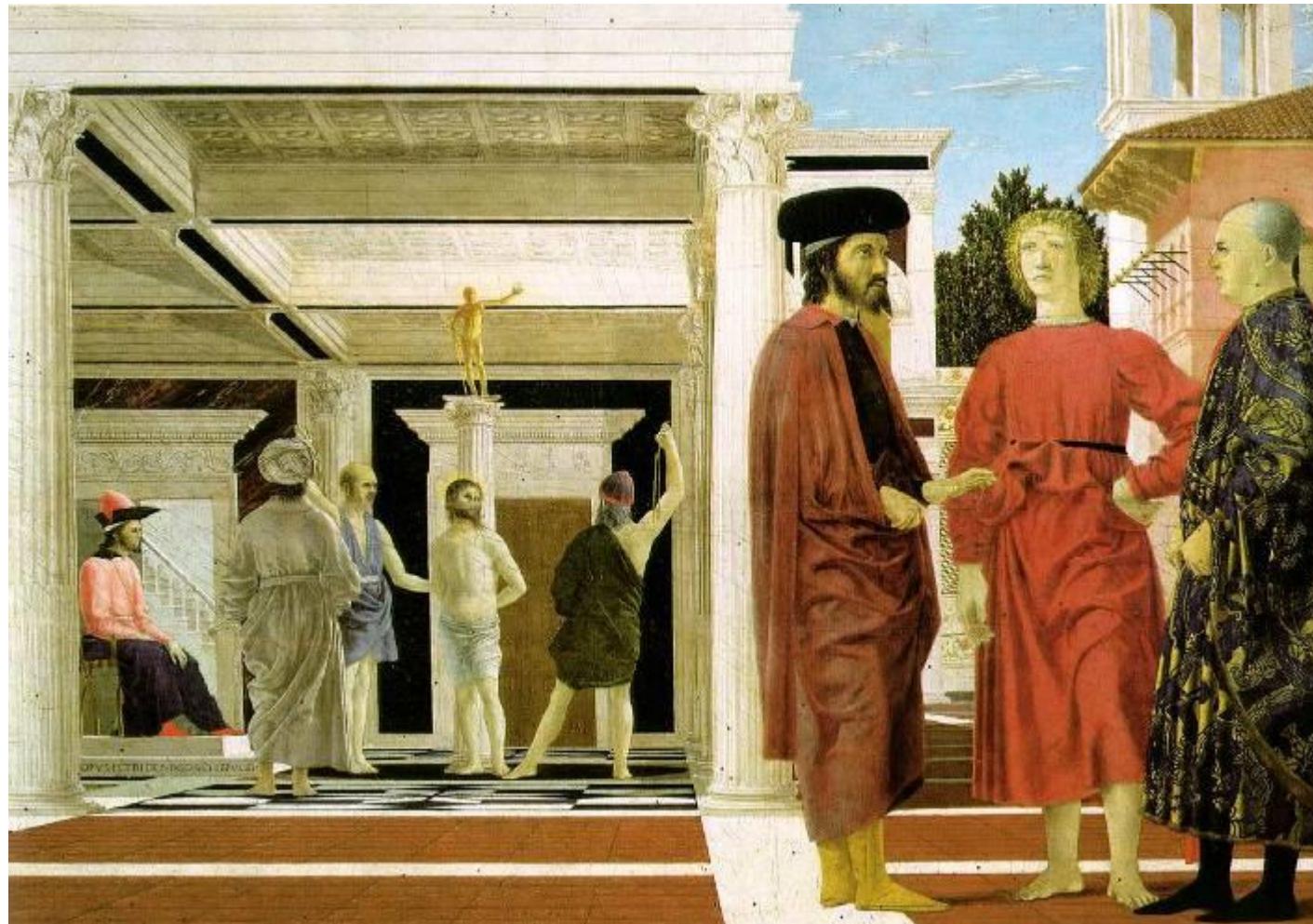
Lorenzo
Ghiberti
(1378-1455)



East Doors (1452)



Depicting Our World: Renaissance



Piero della Francesca,
The Flagellation (c.1469)

Depicting Our World: Toward Perfection



Jan van Eyck, *The Arnolfini Marriage* (c. 1434)

Depicting Our World: Toward Perfection

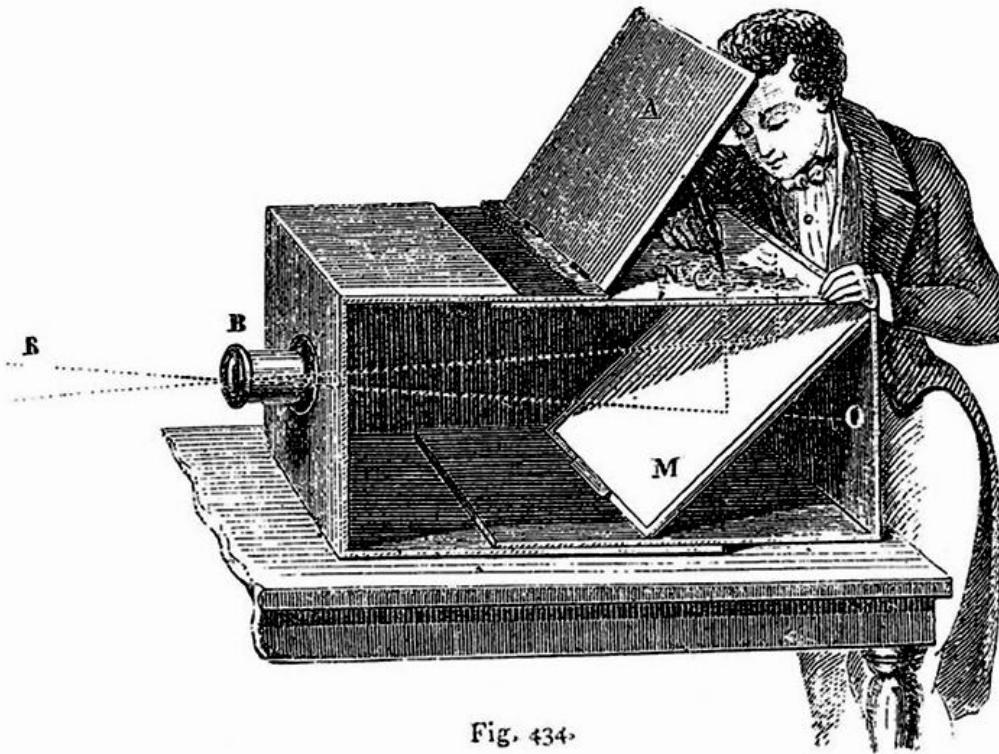


Fig. 434.

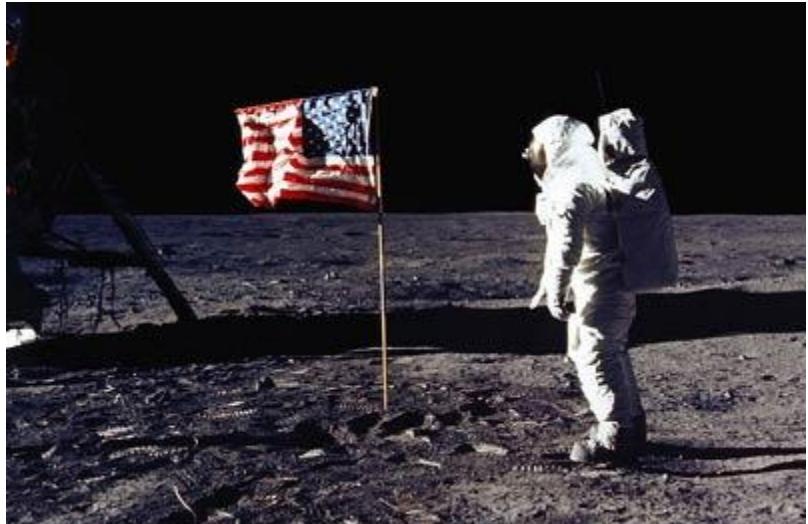
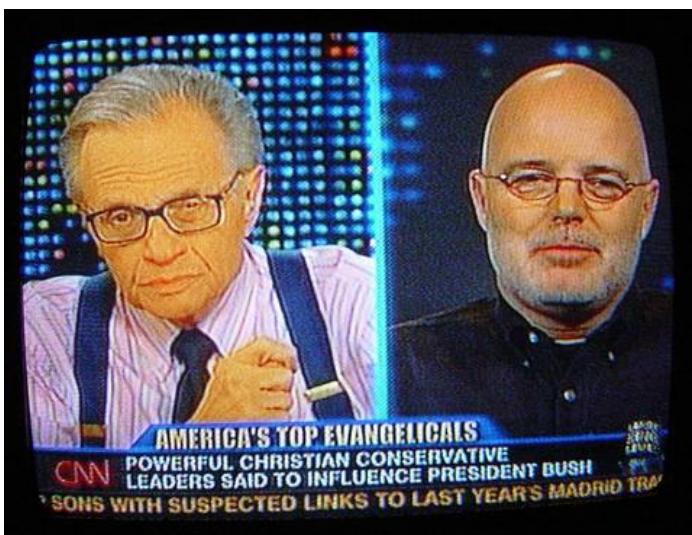
Lens Based Camera Obscura, 1568

Depicting Our World: Perfection!



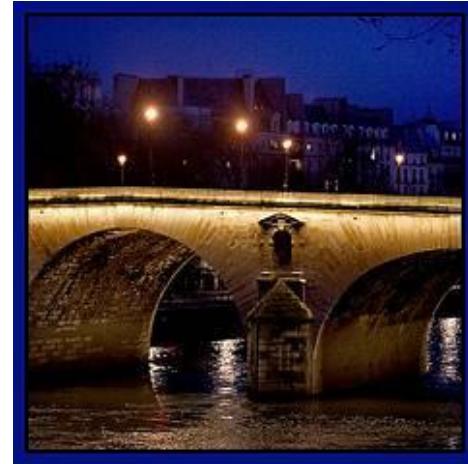
Boulevard du Temple, Louis Daguerre, 1838

Depicting Our World: Realism?

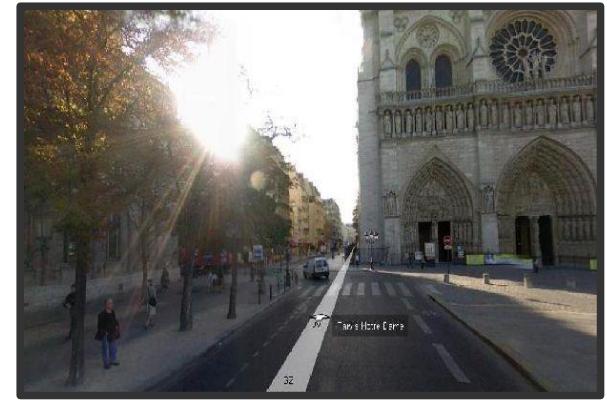




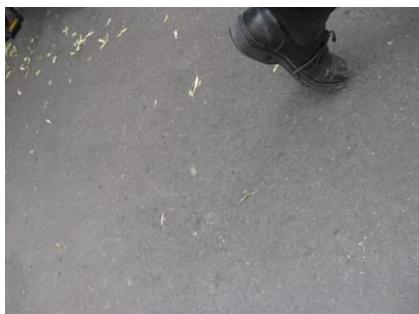
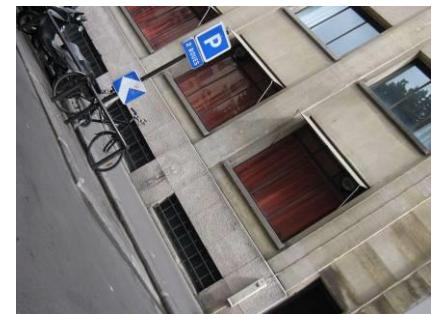
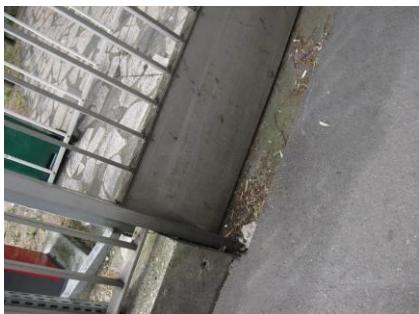
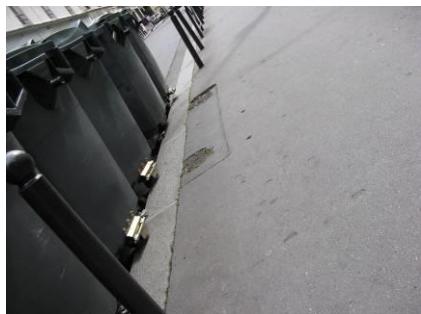
Paris, according to Flickr



Paris, according to Google StreetView



Paris, according to me



After realism...

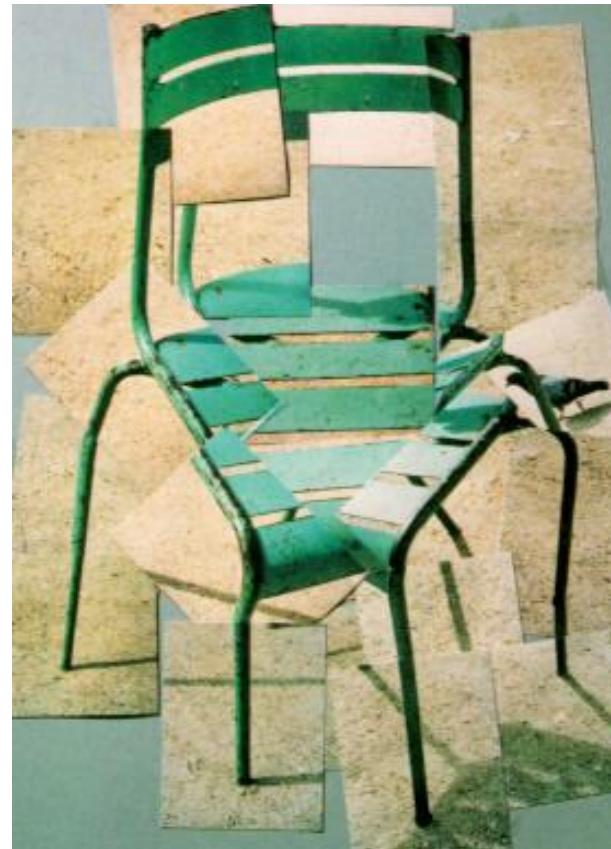


Monet,
La rue Montorgueil

Depicting Our World: Ongoing Quest



Pablo Picasso



David Hockney

Better than realism?



David Hockney, Place Furstenberg (1985)

Which one is right?

Multiple viewpoints



David Hockney,
Place Furstenberg,
1985

Single viewpoint



Alyosha Efros
Place Furstenberg,
2009

Depicting Our World: Ongoing Quest

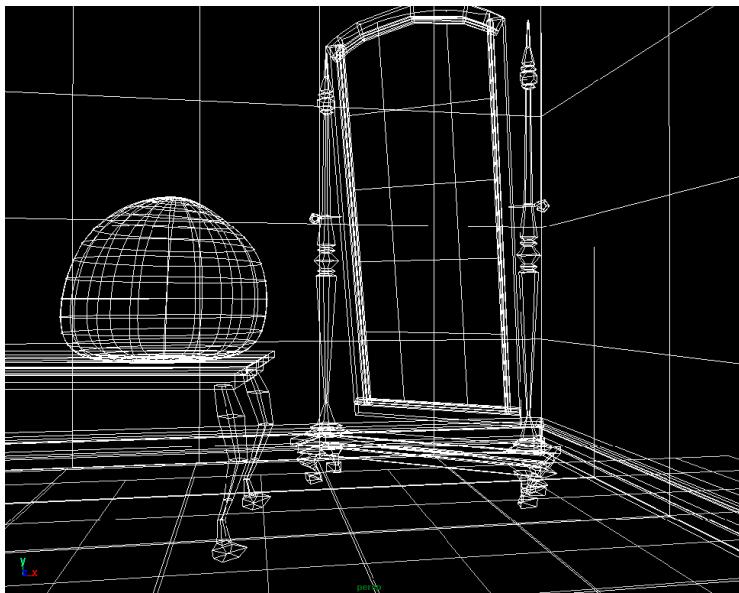


Antonio Torralba & Aude Oliva (2002)

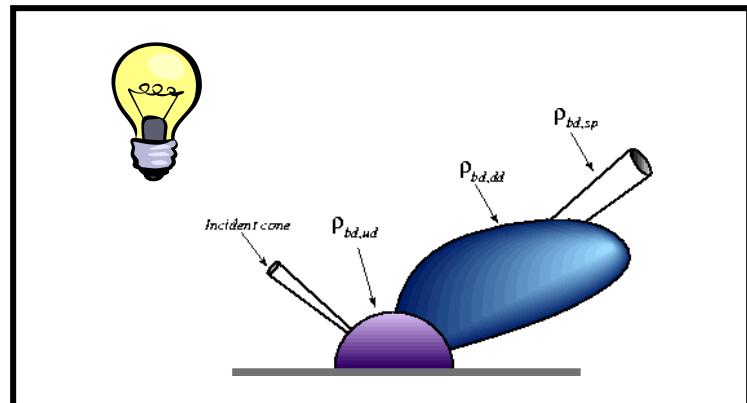


Enter Computer Graphics...

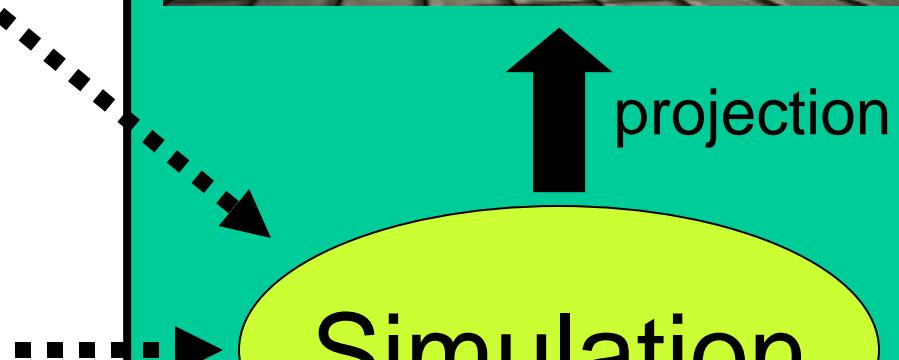
Traditional Computer Graphics



3D geometry



physics



Simulation

GRAPHICS

Modern Computer Graphics



- Amazingly real
- But so sterile, lifeless, *futuristic* (*why?*)

The richness of our everyday world



Photo by Svetlana Lazebnik

Beauty in complexity



University Parks, Oxford

Which parts are hard to model?



Photo by Svetlana Lazebnik

People



From "Final Fantasy"

On the Tube, London



Creating Realistic Imagery

Computer Graphics



- + great creative possibilities
- + easy to manipulate objects/viewpoint
- Tremendous expertise and effort to obtain realism

Computational Photography

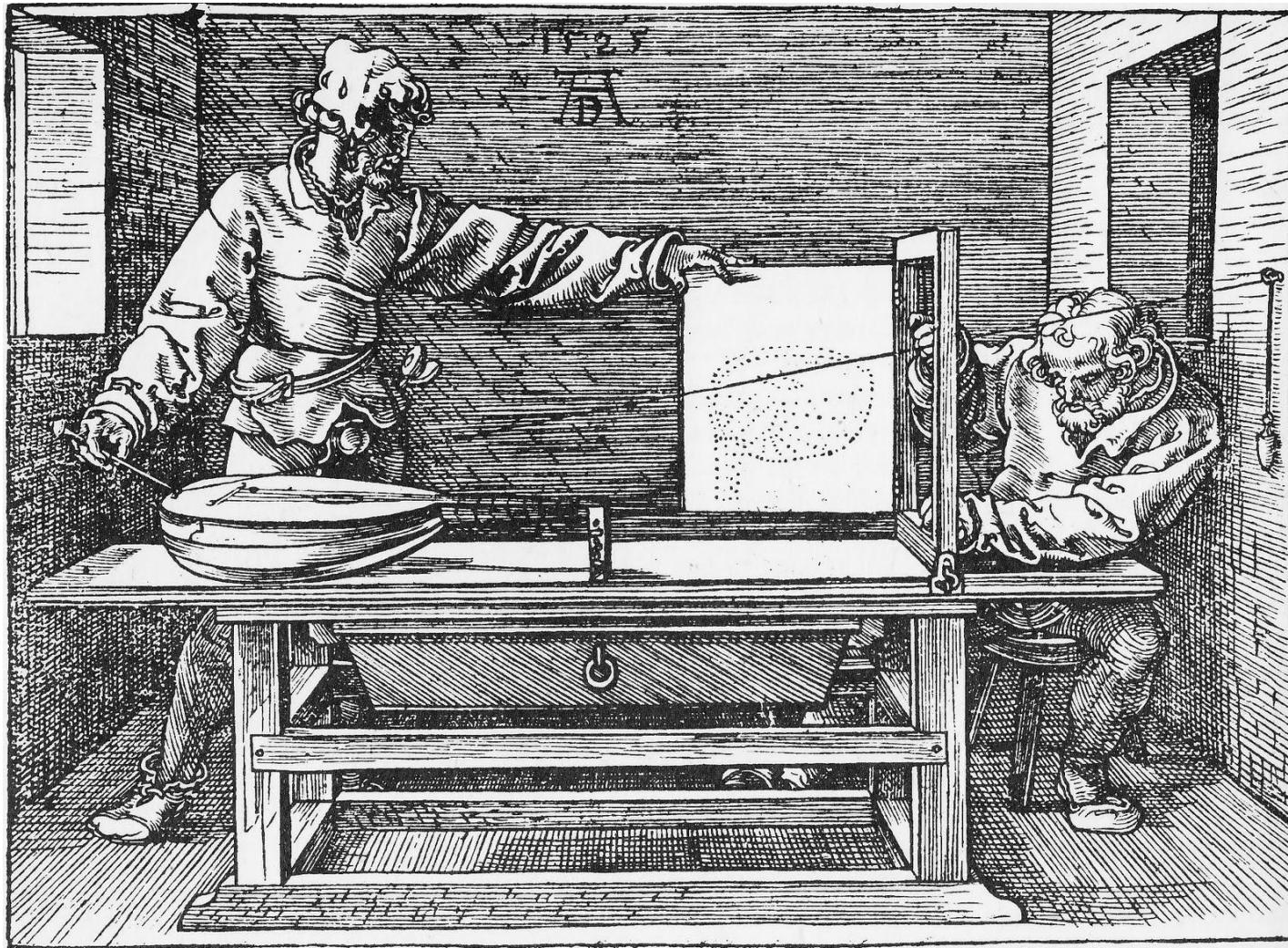
Realism
Manipulation
Ease of capture

Photography



- + instantly realistic
- + easy to acquire
- very hard to manipulate objects/viewpoint

Computer Vision



Mechanical creation of a perspective image,
Albrecht Dürer, 1525

Happy Independence Day, Ukraine!

