

# CS4670/5670: Computer Vision

Kavita Bala

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Lecture 42: Conclusions

# Announcements

- Exam review: Sunday 1-3pm, location: TBA
- Exam topics
  - Lec 18 (Cameras, Mar 9)-lec 39 (ConvNets, May 4)
- Grading: any unresolved issues drop me a note
- **Final: Sunday 2pm, May 22**
  - **BTN100WEST**, Barton Hall 100 West-Main Floor
- **Course evaluation**
  - **Replace your lowest quiz grade with your highest one**

# Grading

- Rough grade breakdown:
  - Quizzes + class evaluation: 5%
  - Midterm, final exam: 15% each
  - Homeworks: 10% each
  - Programming projects: 45%

# ConvNets



## Applications

### Google Image Search

The screenshot shows the Google Image Search interface. The search bar contains the word "cats". Below the search bar, there are tabs for "Web", "Images", "Videos", "News", "Shopping", and "More". The "Images" tab is selected. The search results are displayed in a grid of images. The first row shows three categories: "Cute", "Lots Of", and "Kittens". The second row shows four images: a ginger kitten lying on its back, a grey tabby kitten looking forward, a group of four kittens sitting together, and a ginger kitten looking up. The third row shows three images: a grey and white kitten, a grey tabby kitten with a speech bubble that says "A New York strip, it had a cherry band of fat at its edge, as if the meat were wearing a protective latex sheath, and the meat was shot through with gristle.", and a ginger and white kitten with its mouth open.

## Search by Image



Image size:  
450 × 338

Find other sizes of this image:  
[All sizes](#) - [Medium](#)

Best guess for this image: ***cats and kittens***

### Funny Cats and Kittens Meowing Compilation 2013 - YouTube

[www.youtube.com/watch?v=DXUAYRRkI6k](http://www.youtube.com/watch?v=DXUAYRRkI6k)

Nov 9, 2013 - [Cats Meowing](#) | [Cat Meowing](#) | [Kittens Meowing](#) | [Kitten Meowing](#) | [Meowing Cat](#) | [Funny Cats](#) | [Meowing Kittens](#) | [Cat Meowing Non Stop](#) | [Cats ...](#)

### mama cat comes to rescue her little kitten - YouTube

[www.youtube.com/watch?v=S5-D0f6nHSQ](http://www.youtube.com/watch?v=S5-D0f6nHSQ)

Jul 7, 2007 - Pets animals [cats kittens](#) fun. Subscribe! <http://www.youtube.com/user/Epikneverdies>.

### Visually similar images

[Report images](#)



# ConvNets



## Applications - Photo Search

my photos of coffee

Web Images News Shopping Videos More Search tools

About 386,000,000 results (0.37 seconds)

Your photos  
Only you can see these results



[View all Google+ results](#)

[Learn more - Give feedback](#)

my photos of cake

Web Images Shopping Videos News More Search tools

About 204,000,000 results (0.42 seconds)

Your photos  
Only you can see these results



[View all Google+ results](#)

[Learn more - Give feedback](#)

my photos of waterfalls

Web Images Shopping Videos News More Search tools

About 27,000,000 results (0.39 seconds)

Your photos  
Only you can see these results



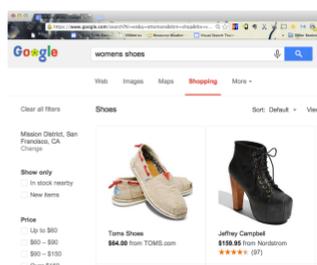
[View all Google+ results](#)

[Learn more - Give feedback](#)

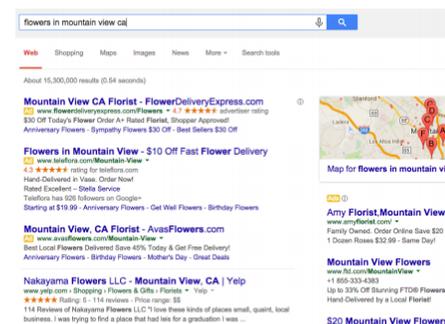
# ConvNets



YouTube



Google Shopping



Advertising

Much more...



StreetView / Maps

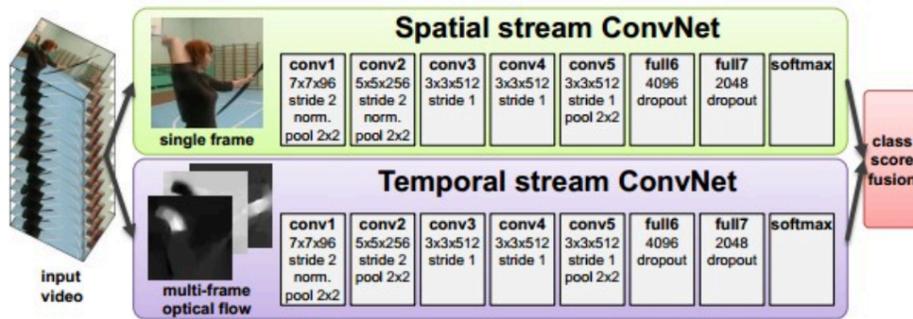


Self-Driving Cars

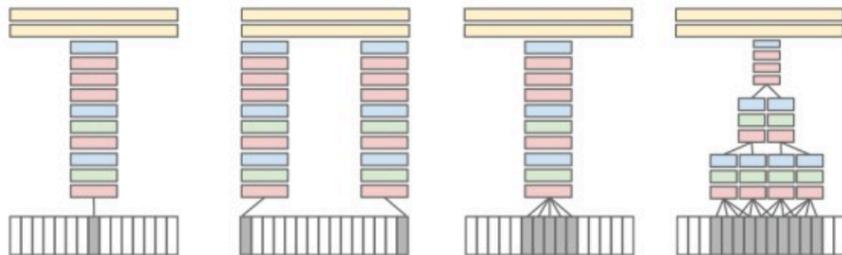


Robotics

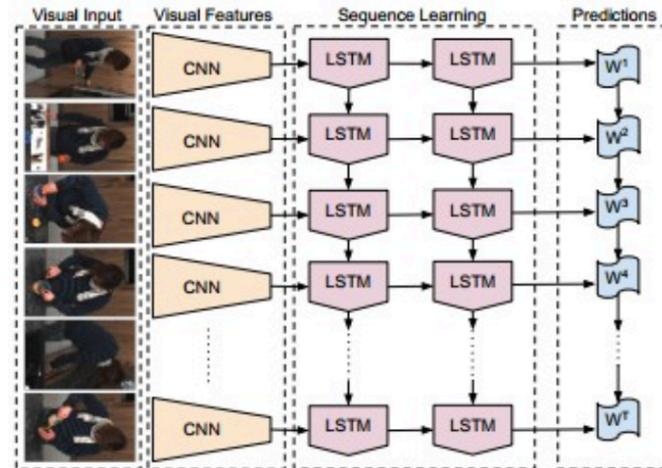
# Video Classification



**Two-Stream Convolutional Networks for Action Recognition in Videos** [Simonyan et al.], 2014



**Large-scale Video Classification with Convolutional Neural Networks** [Karpathy et al.], 2014



**Long-term Recurrent Convolutional Networks for Visual Recognition and Description** [Donahue et al.], 2014

# Image Captioning



"man in black shirt is playing guitar."



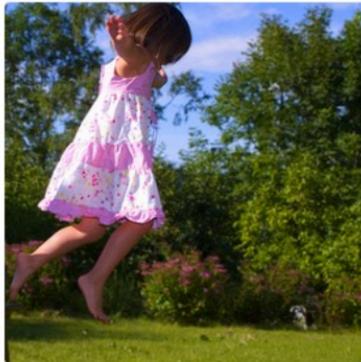
"construction worker in orange safety vest is working on road."



"two young girls are playing with lego toy."



"boy is doing backflip on wakeboard."



"girl in pink dress is jumping in air."



"black and white dog jumps over bar."



"young girl in pink shirt is climbing on swina."

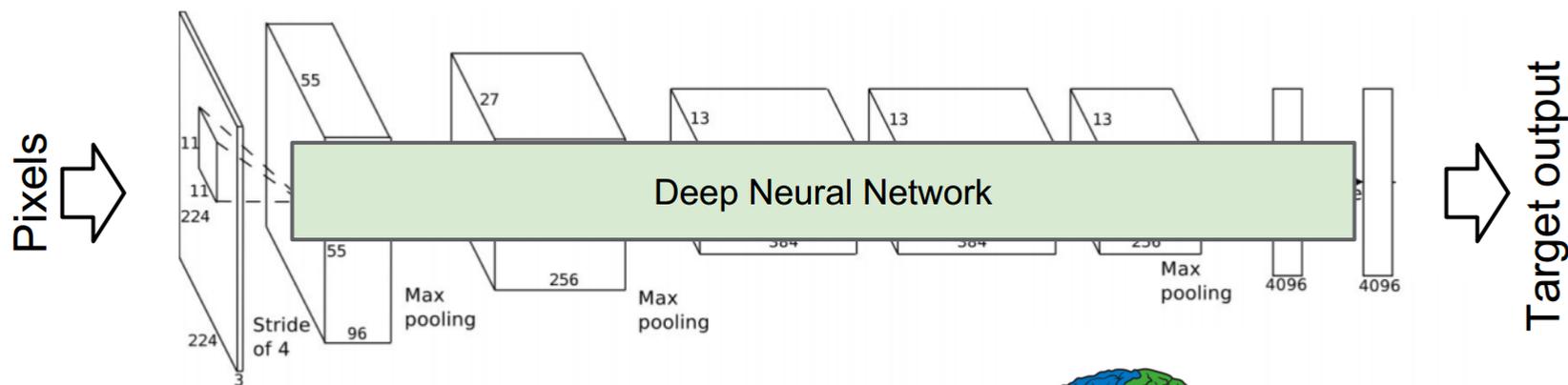


"man in blue wetsuit is surfing on wave."

# CNNs



## The Deep and now Deeper Hammer



Deep learning infrastructure by the  
Google Brain team



“ImageNet Classification with Deep Convolutional Neural Networks”,  
Krizhevsky, Sutskever, Hinton, NIPS 2012

- Lightstage

# Science in Art

- Joe and Pauline Degenfelder '60
  - Degenfelder jade collection



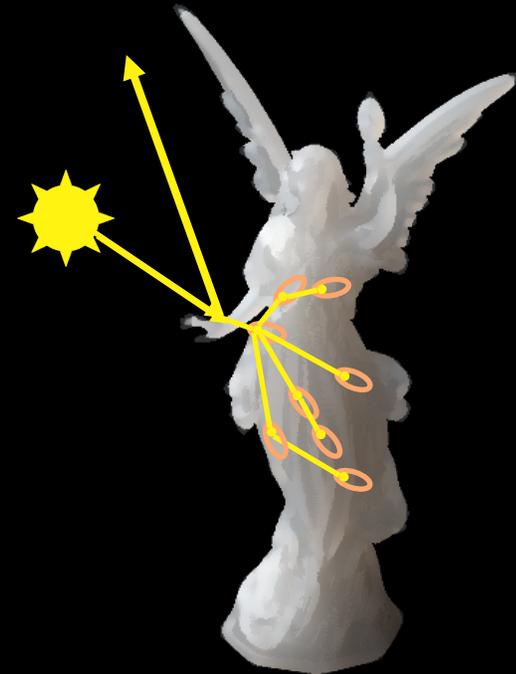
“Mutton” jade



White jade inkwell

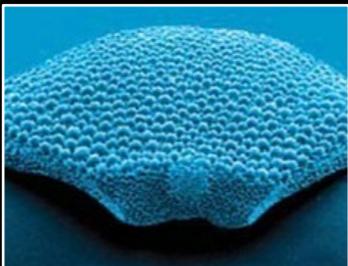
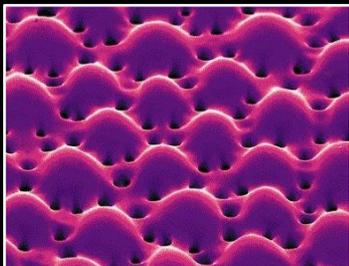
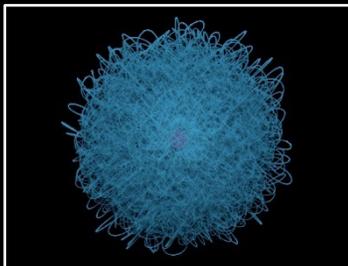
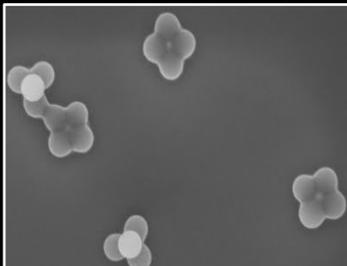
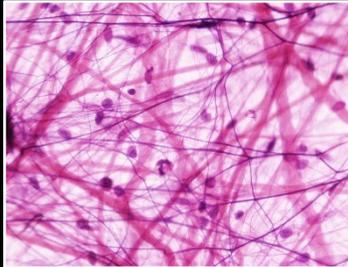
What makes  
jade look like jade?

# Why are translucent materials so beautiful?

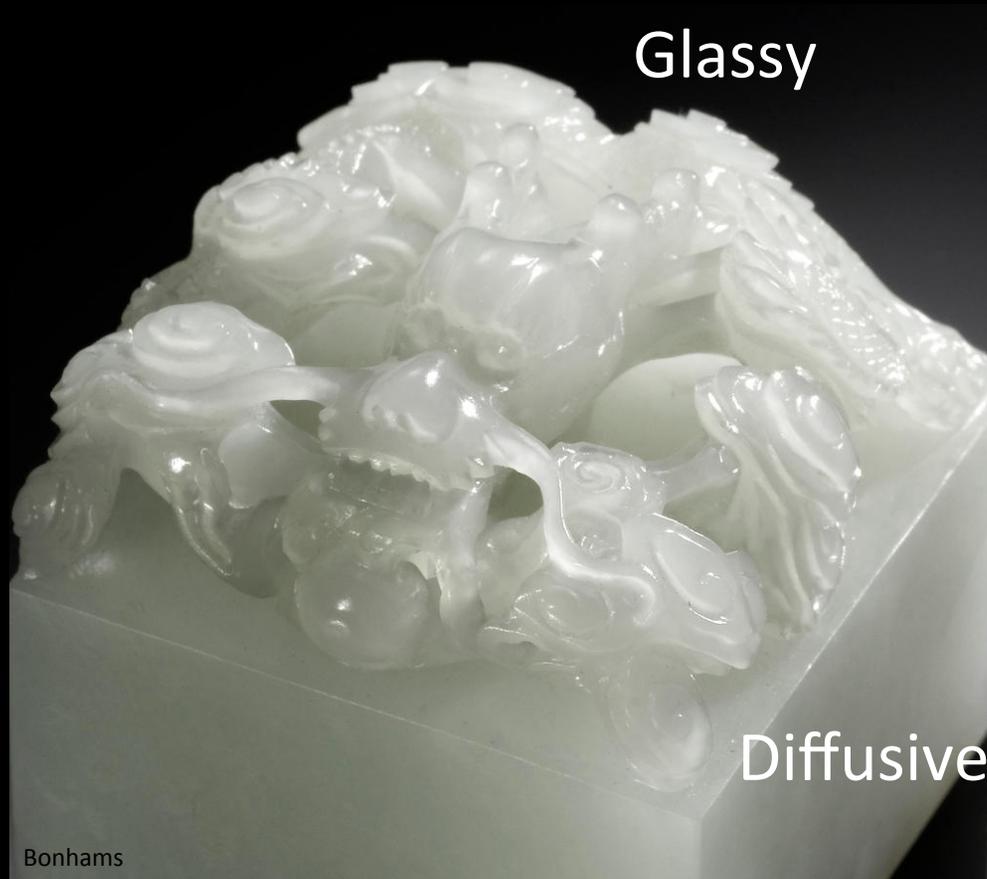


shiny materials : light bounces off the surface

translucent materials : light goes into the surface



# What makes white jade look like white jade?

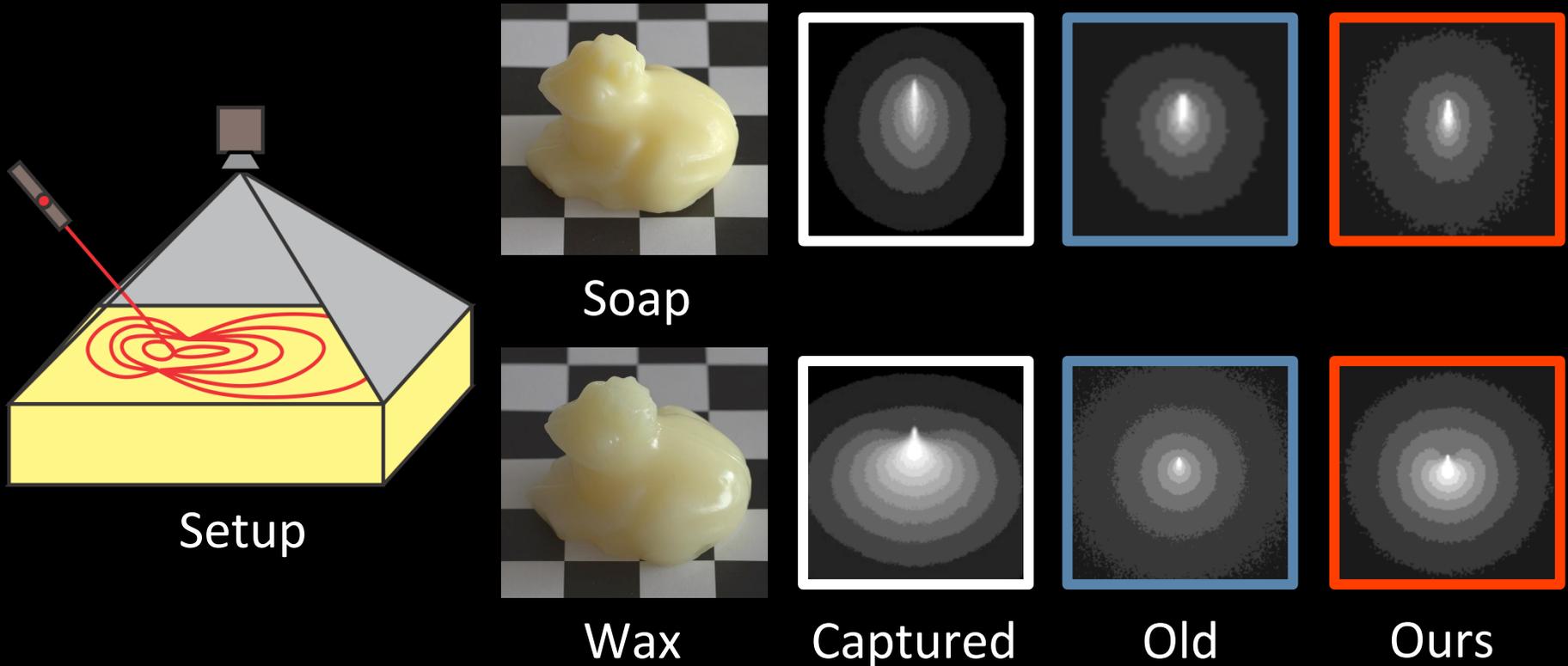


Current graphics models  
+ Diffusive  
- Glassy

Answer

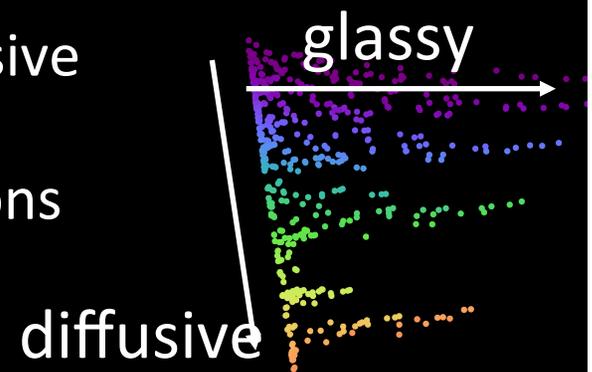
Phase function

# Phase function: direction of light scatter

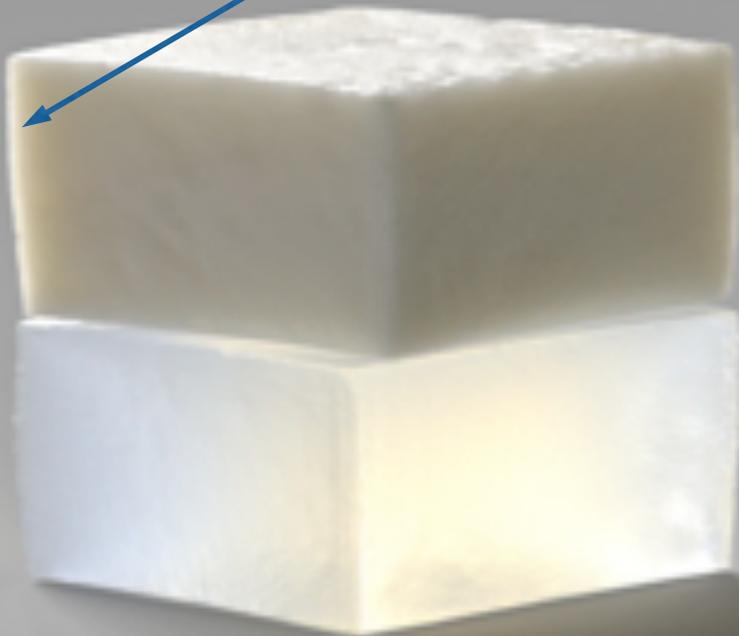


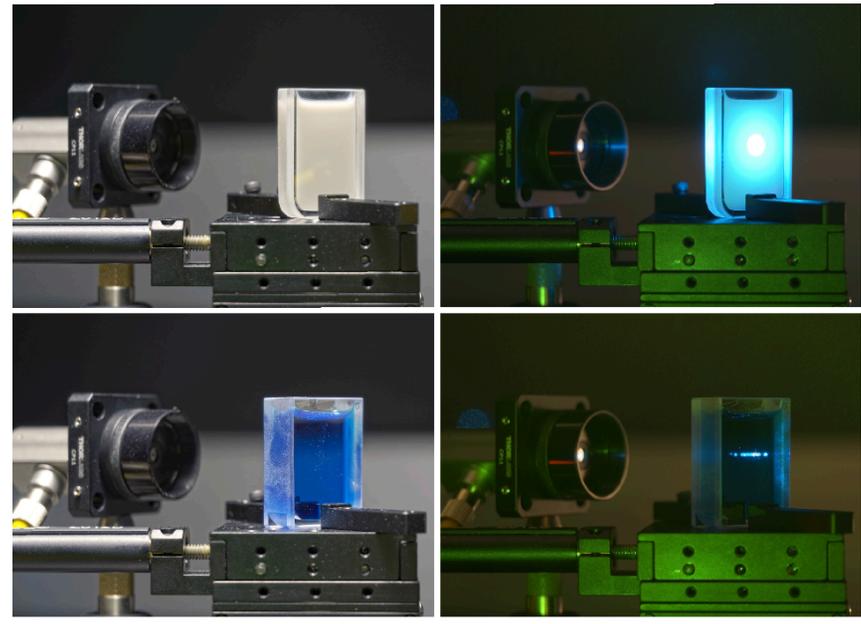
Simple models cannot produce glassy, only diffusive

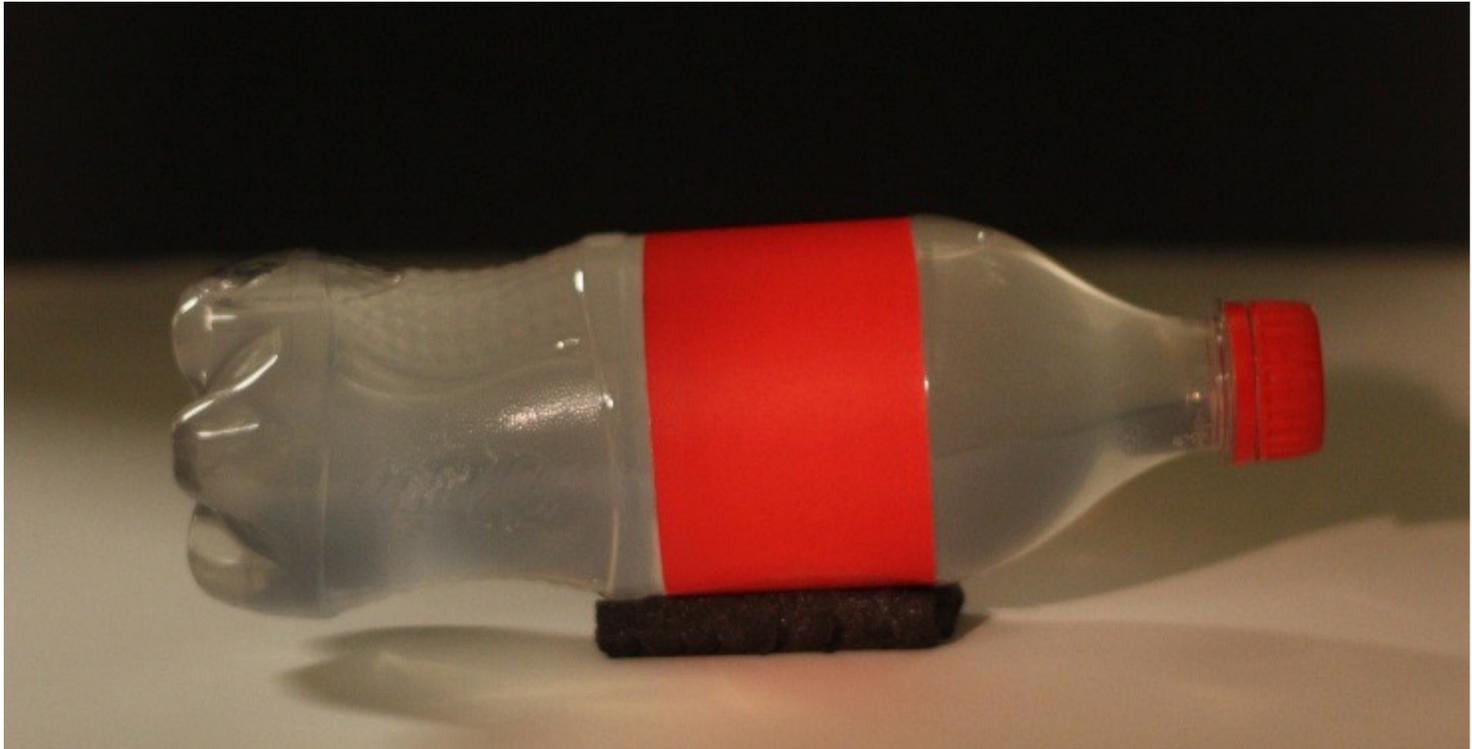
Ours: expand phase fns to 2 perceptual dimensions



V

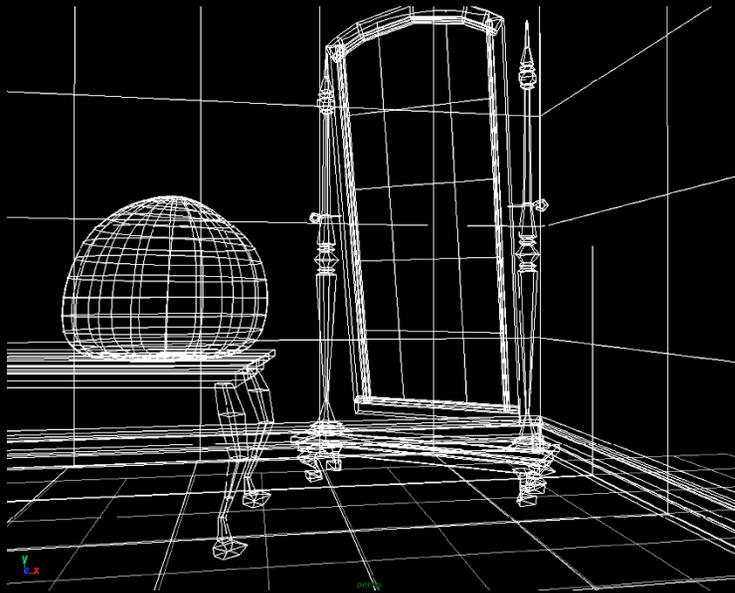






Femto photography  
Project

# Vision and Graphics



3D Model



2D image

- **Computer Graphics:** Models to Images
- **Computer Vision:** Images to Models
- **Comp. Photography:** Images to Images

# 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

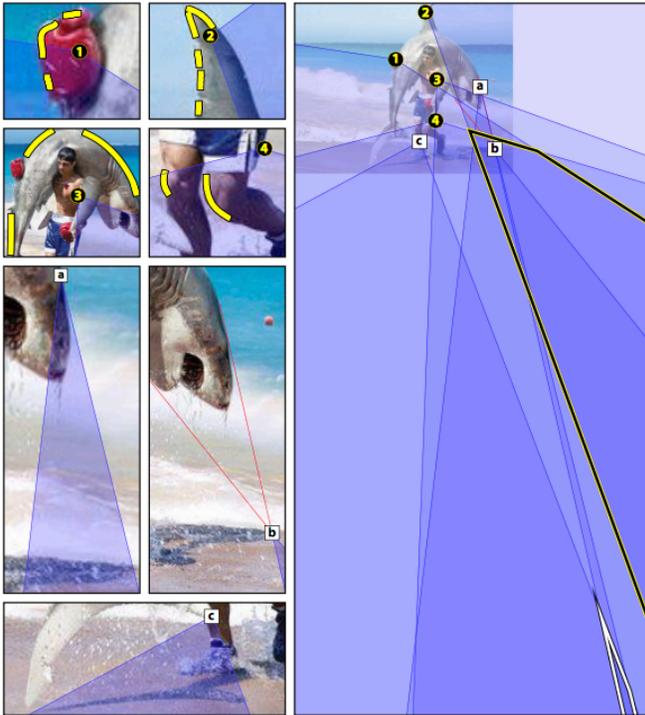
# Aside: Image Manipulation



**Figure 3:** The 1860 portrait of President Abraham Lincoln and Southern politician John Calhoun.

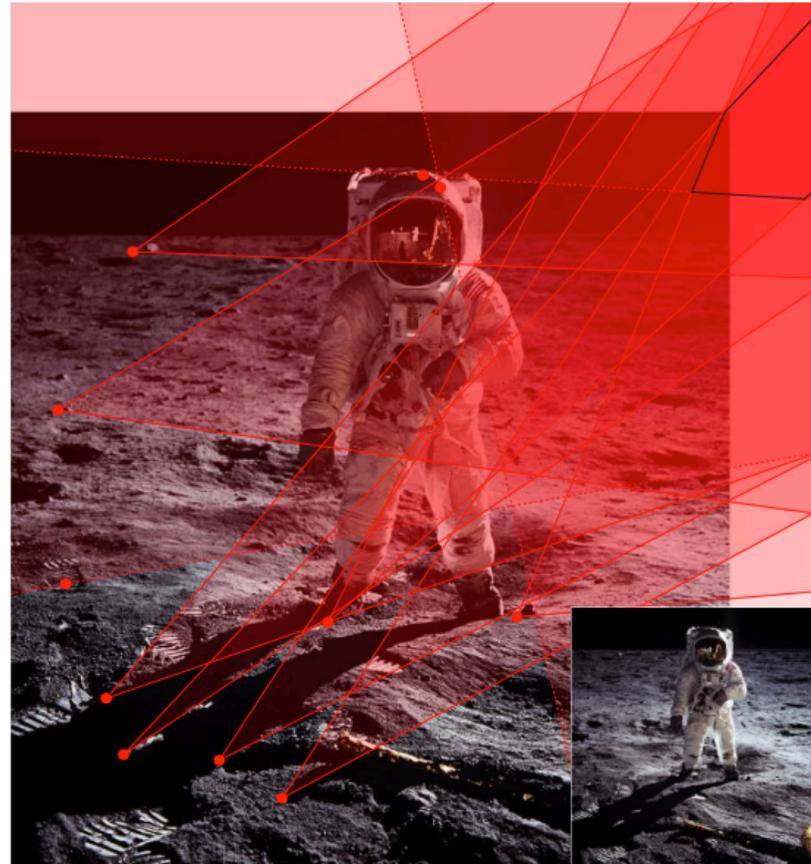


# Image Forensics



Original image copyright Eric Sahrman, <http://ericsahrman.com/shark-fighter/>

Fig. 1. The projected location of the light source is constrained by shading along occluding contours ① – ④ and by cast shadows a) – c). The intersection of the shading constraints (outlined in black) is inconsistent with the intersection of the shadow constraints (outlined in white), revealing this image to be a fake (not surprisingly).



Original image copyright 1969, NASA

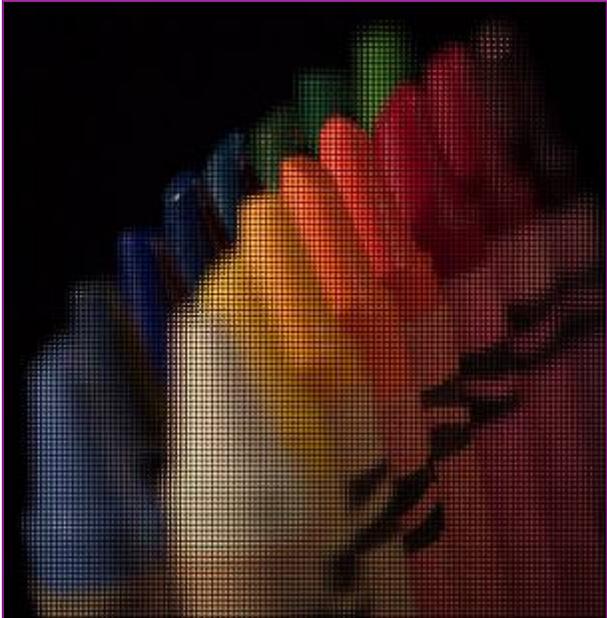
Fig. 1. Our algorithm finds that the shadows in this 1969 moon landing photo are physically consistent with a single light source. The solid lines correspond to constraints from cast shadows and dashed lines correspond to constraints from attached shadows. The region outlined in black, which extends beyond the figure boundary, contains the projected light locations that satisfy all of these constraints.



# The ultimate camera

- Infinite resolution
- Infinite zoom control
- Desired object(s) are in focus
- No noise
- No motion blur
- Infinite dynamic range (can see dark and bright things)
- ...

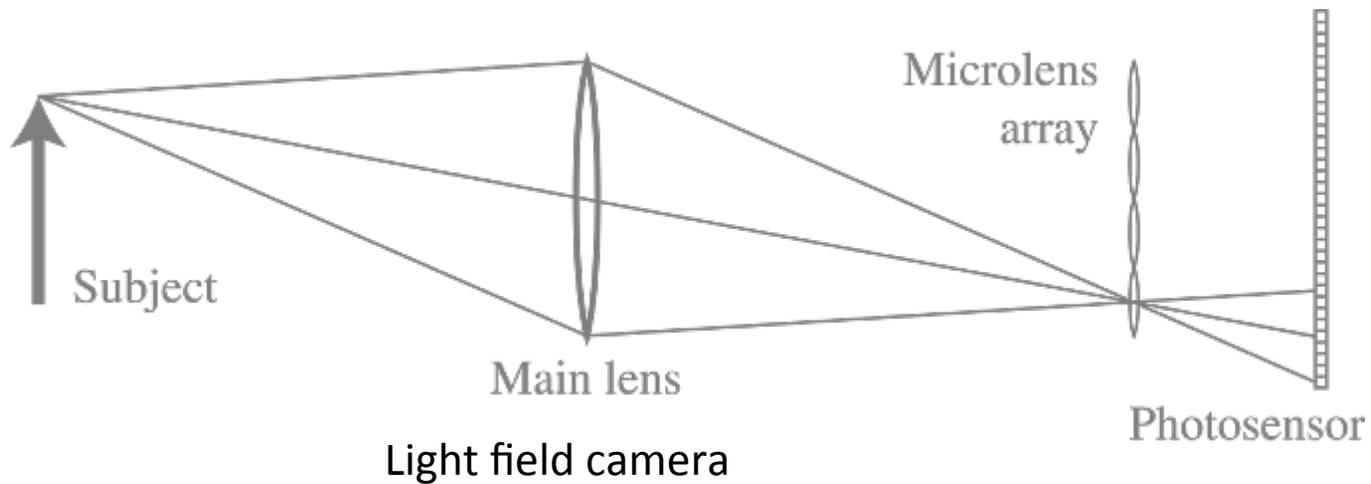
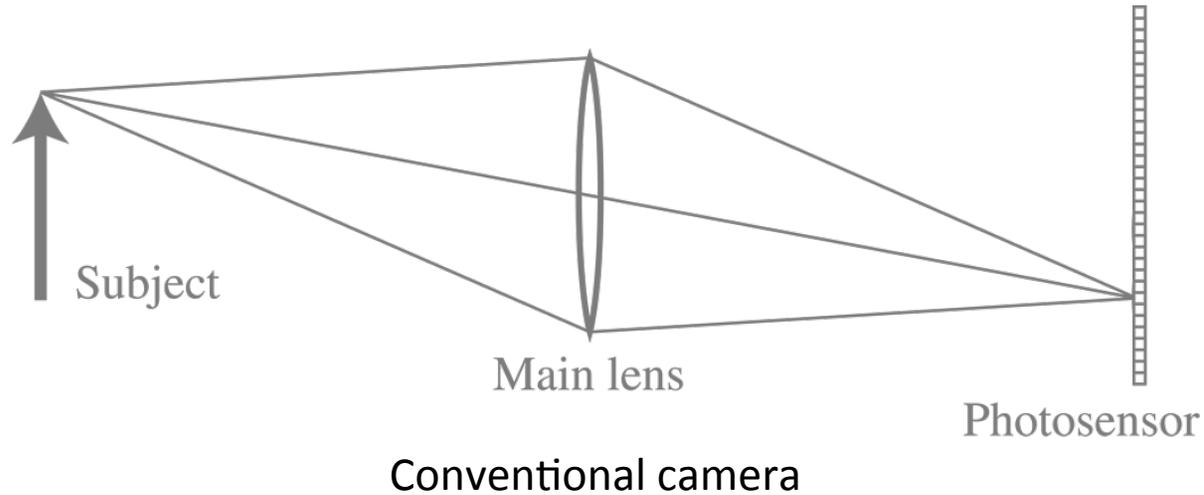
# Light field camera [Ng et al., 2005]



# Light field camera Refocusing images



# Conventional vs. light field camera



# Inside the Lytro

The Lytro camera is the first consumer "light field camera." It uses a new technology to create photos that can have their focus changed after they have been taken. Because of this, there is no need to auto-focus, resulting in virtually no shutter delay. Here's how it works.

## Camera Overview

A Lytro camera is made up of two sections. An anodized aluminum shell contains the lens assembly, while the electronics are housed within a silicone rubber grip.

**LENS ASSEMBLY**  
Features an 8x optical zoom and a constant f/2 lens.

**LIGHT FIELD SENSOR**  
Records the rays of light entering the camera as data.

USB POWER BOARD

LITHIUM-ION BATTERY

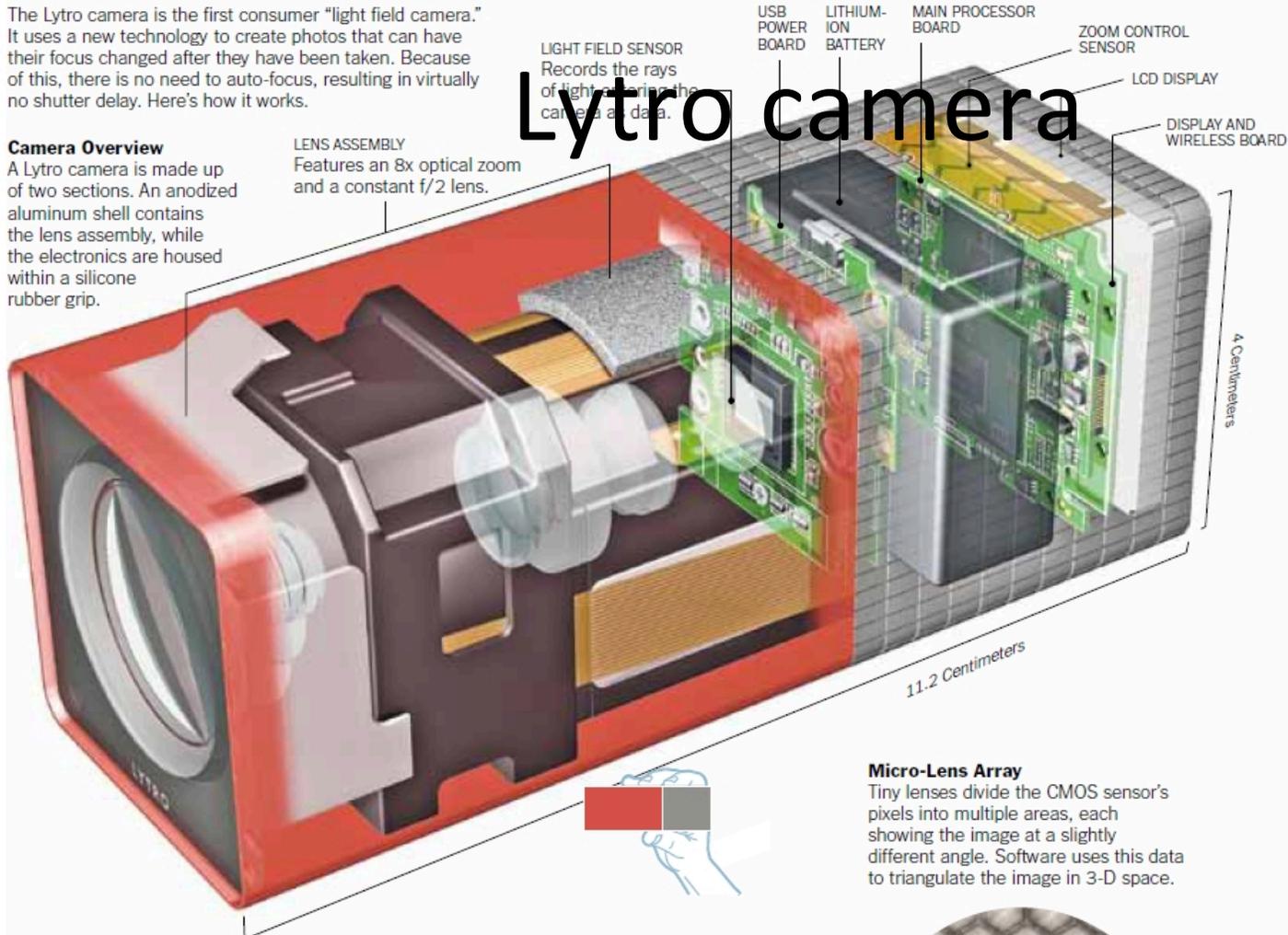
MAIN PROCESSOR BOARD

ZOOM CONTROL SENSOR

LCD DISPLAY

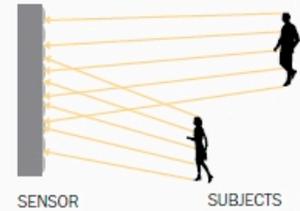
DISPLAY AND WIRELESS BOARD

# Lytro camera



## Capturing Light

Lytro's light field sensor captures not only the color, intensity and position of the light, but also its direction, which is lost in traditional cameras.



## Changing Focus

Because all the directional information of the entering light is captured, software can change the focal plane. Clicking any point on the image brings that area into focus, whether raindrops on the surface of a window or buildings beyond.



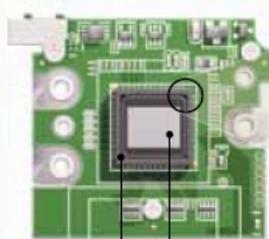
## Micro-Lens Array

Tiny lenses divide the CMOS sensor's pixels into multiple areas, each showing the image at a slightly different angle. Software uses this data to triangulate the image in 3-D space.

## Light Field Sensor

Consists of a standard digital camera CMOS sensor coupled with a micro-lens array. The array contains thousands of miniature lenses.

LIGHT FIELD SENSOR BOARD



CMOS SENSOR

MICRO-LENS ARRAY

<https://www.lytro.com/camera/>



MICRO-LENSES



FRANK O'CONNELL/THE NEW YORK TIMES

# Computational Photography

Gigapixels

Hyperlapse

Timelapse

Motion Magnification, video

Sound



# Where to?

- Lots of companies doing vision
  - Big and small
- Robotics
- Self-driving cars
- Image applications
- Languages and images
  
- Masters and PhD

# Questions?

- Good luck!