

Computational Photography

Kyros Kutulakos
CSC 2530

Today's topics

what is this course about?

guided tour of the reading list

administrivia

first topic: plenoptic representations

Photography in 2011

flickr uploads: 4.5 million / day
photos on flickr: 6 billion

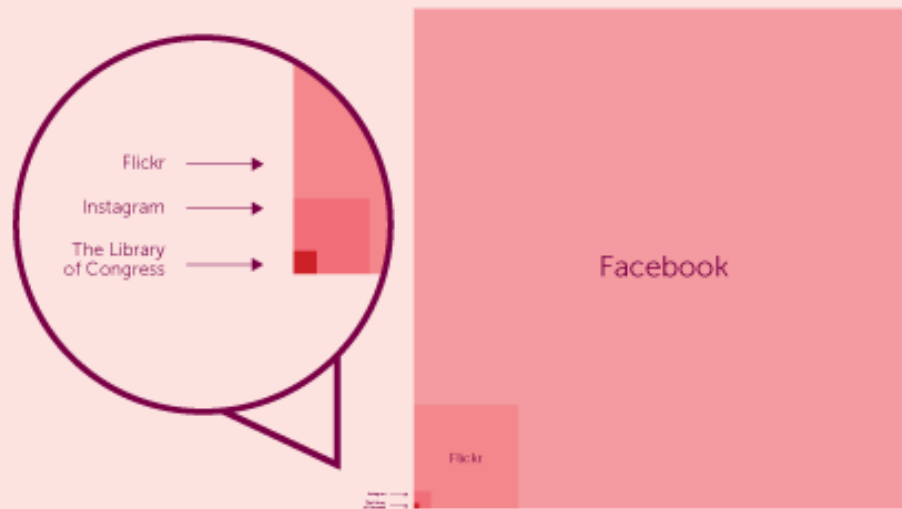
source: <http://royal.pingdom.com/2012/01/17/internet-2011-in-numbers/>

facebook uploads: 6 billion / month
250 million / day
photos on facebook: 90 billion

source: <http://blog.1000memories.com/94-number-of-photos-ever-taken-digital-and-analog-in-shoebox>

Photography in 2011

THE WORLD'S LARGEST PHOTO LIBRARIES



source: <http://blog.1000memories.com/94-number-of-photos-ever-taken-digital-and-analog-in-shoebox>

Photography in 2011

instagram

free photo-sharing / manipulation app for iphone

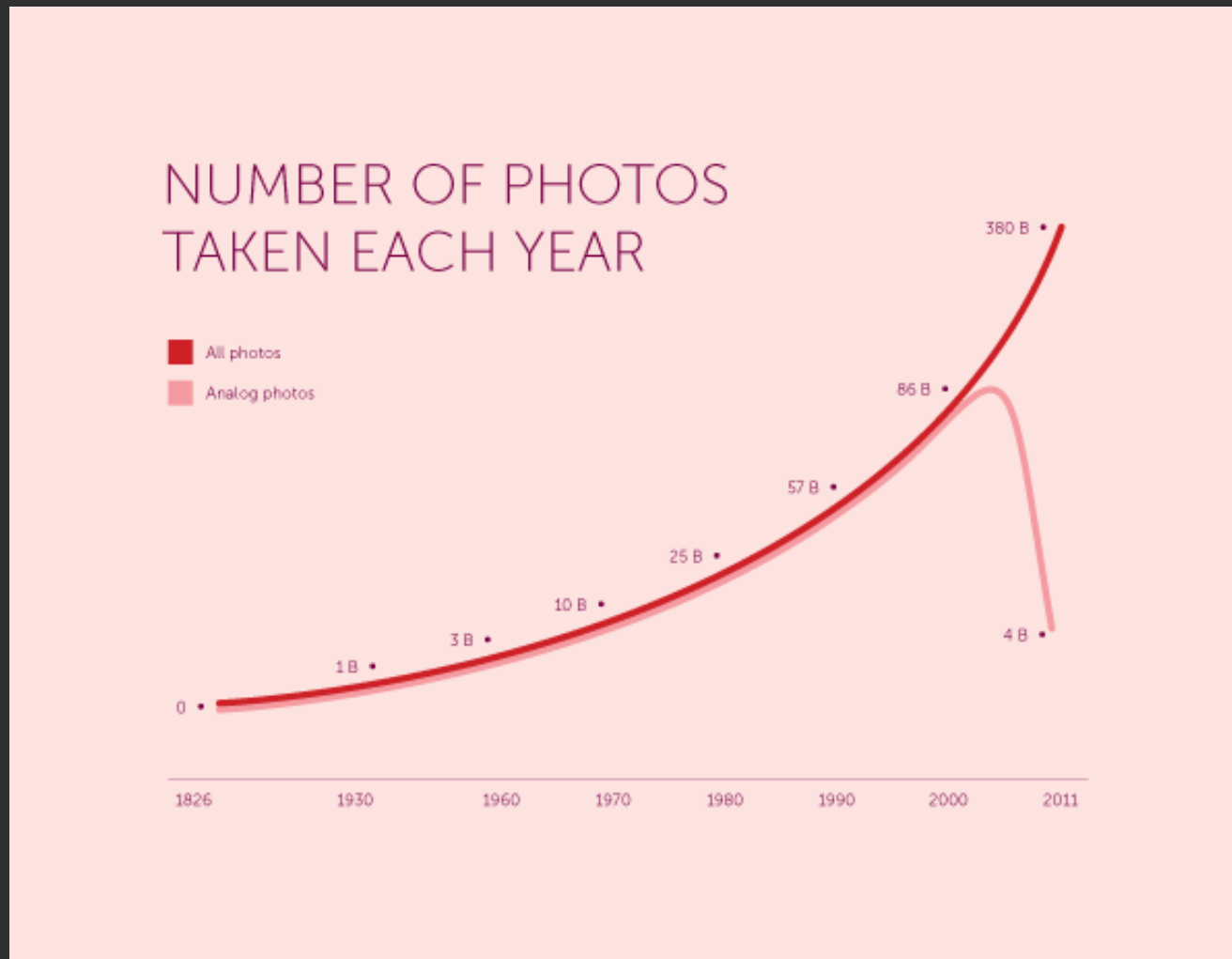
2010: founded

2011: 14 million accounts created, 150 million photos

2012: 13 employees, 58 uploads / second, 1 new user / second
1 billion photos uploaded
sold for \$1 billion to Facebook in April

sources: <http://en.wikipedia.org/wiki/Instagram>
<http://royal.pingdom.com/2012/01/17/internet-2011-in-numbers/>

Cameras in 2011



source: <http://blog.1000memories.com/94-number-of-photos-ever-taken-digital-and-analog-in-shoebox>

Early digital cameras (pre-2000)

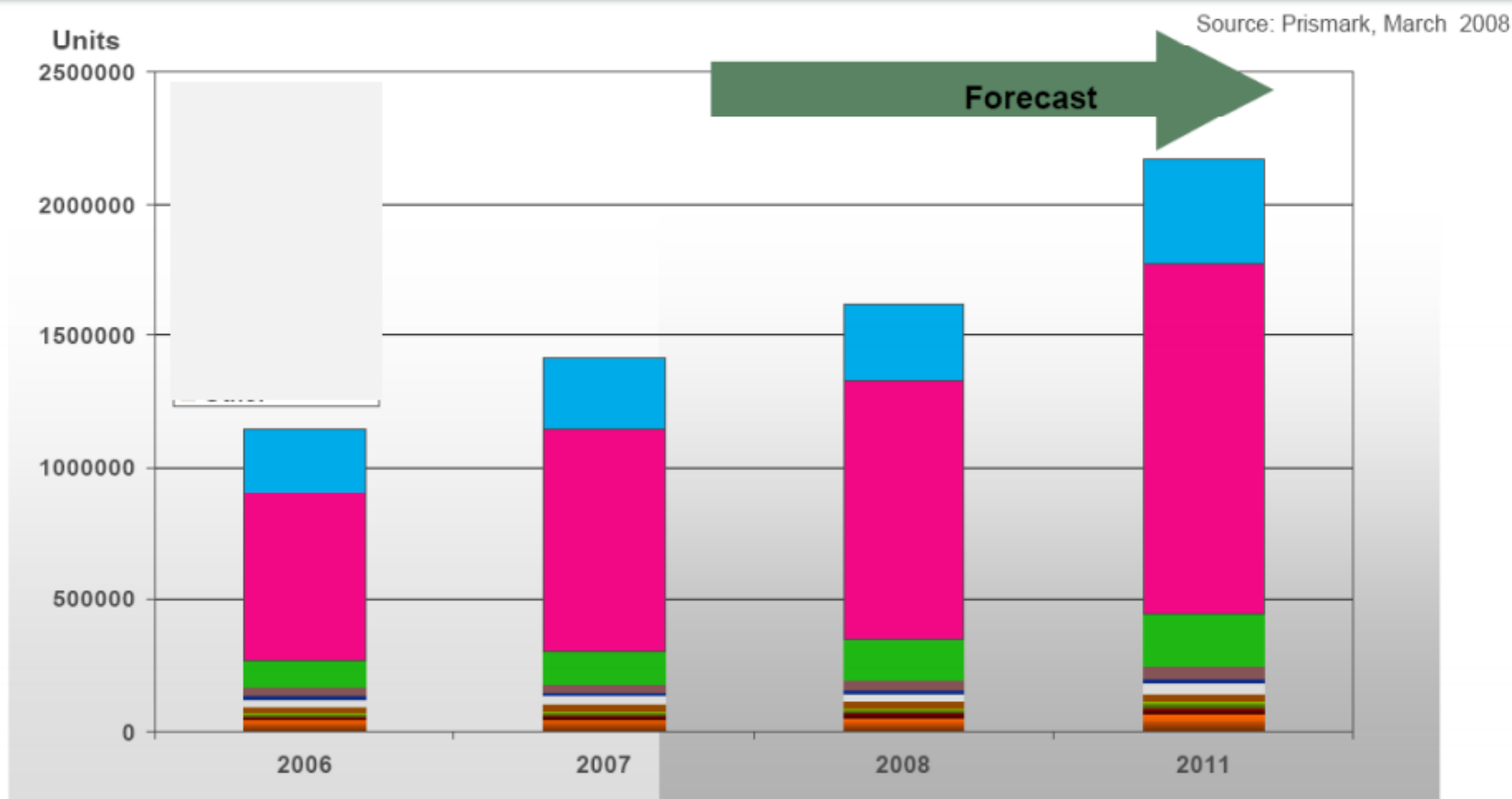


used as film
replacements

source: <http://www.luminous-landscape.com/reviews/cameras/kodak-dcs.shtml>

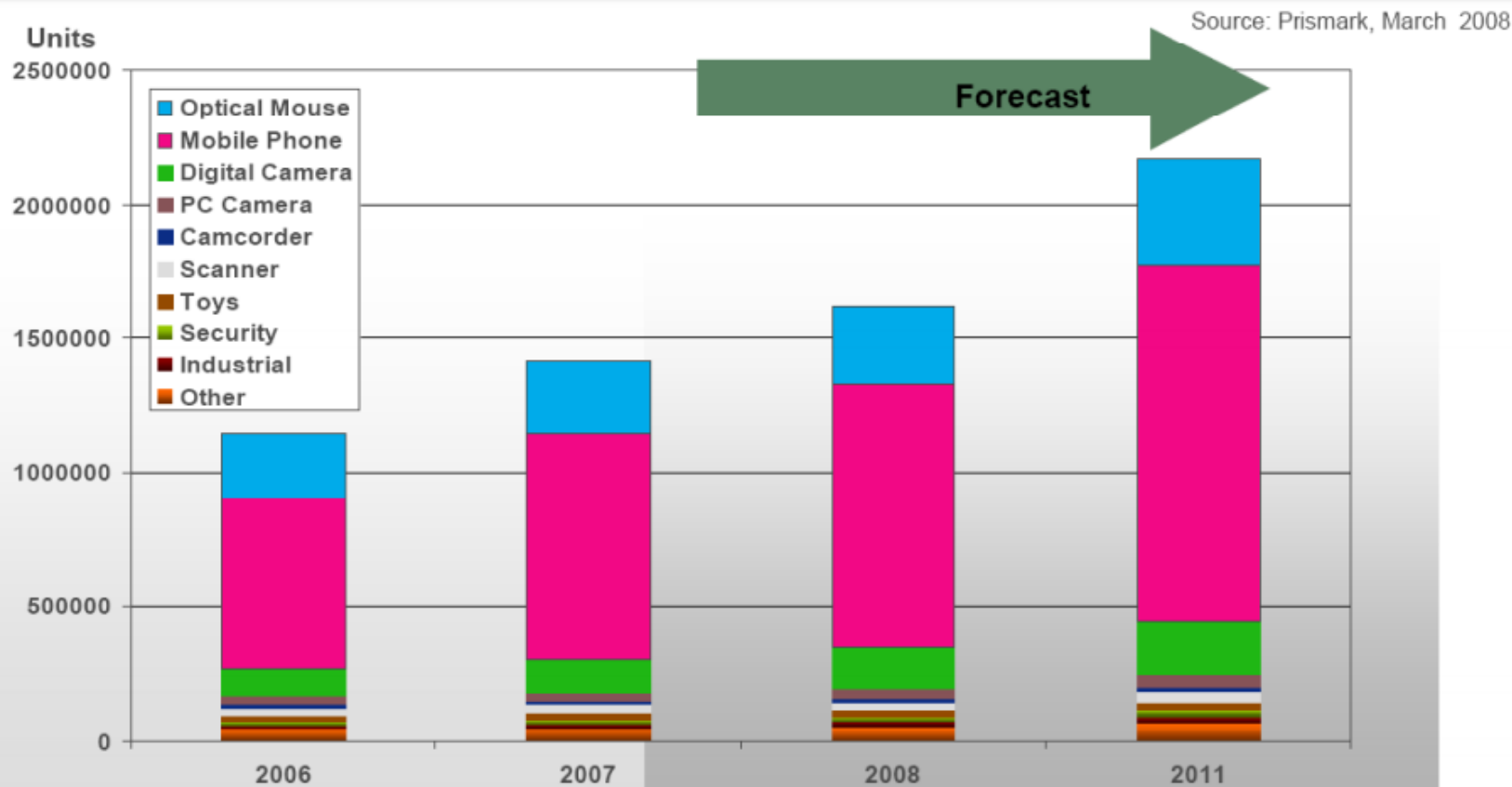
Where are the 'camera's?

Image Sensors Markets



Where are the 'camera's?

Image Sensors Markets



Cameras today

significant on-board computation

- advanced image processing algorithms

- automatic camera controls, scene analysis algorithms

- new capabilities (beyond traditional camera)

new combinations of sensing + optics

- SWaP considerations (Size, Weight and Power)

- integration of non-picture-forming sensors (gyro, GPS, autofocus)

- new capabilities (beyond traditional camera)

internet connectivity

Example: Casio EX-F1 (2008)



specs

no physical shutter

60fps at 6 Mpixel resolution

1200fps video (low definition)

source: <http://www.dpreview.com/news/2008/1/6/casiof1#press>

“time machine” function

continuous 60fps recording in 1-second circular buffer

buffer saved when shutter pressed

can capture moments that happened “before” shutter was pressed

Example: Sony DSC (2009+)



panoramic imaging
function

capture many photos, merge into
panorama

Capture movement with Intelligent Sweep Panorama



Whether you're shooting expansive landscapes, tall buildings or big groups of friends, it can be difficult packing everything into a single shot. Intelligent Sweep Panorama captures amazing wide angle images even when people or subjects are moving. Just press the shutter button and sweep the camera over the scene... left to right or up and down. Cyber-shot stitches together a high-speed burst of frames, creating one breathtaking panoramic photo with an extra wide field of view. Capture all your friends in a crowded restaurant and let Cyber-shot stitch the scene together with beautifully natural results.

<http://www.sony.co.uk/hub/cyber-shot-digital-cameras/technology/travel-camera/article/sweep-panorama>

Example: Sony DSC (2009+)

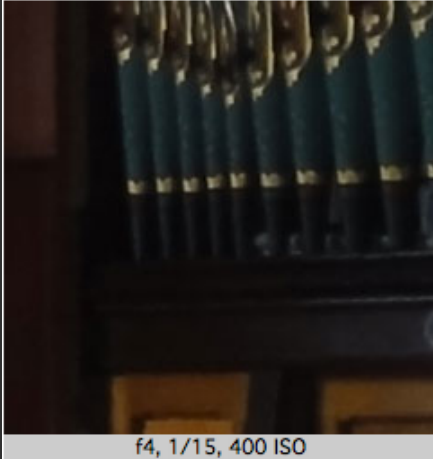


anti-motion-blur

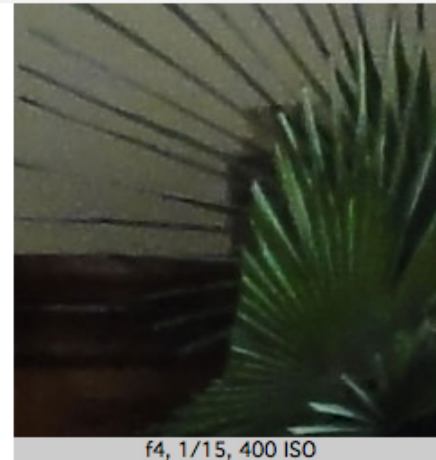
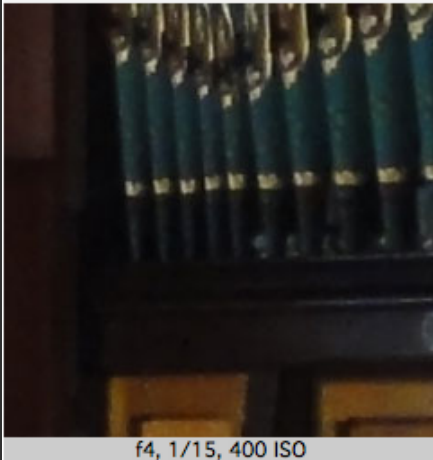
capture 6 photos at high speed,
merge into one low-noise photo

Example: Sony DSC (2009+)

Sony Cyber-shot DSC-HX5: Handheld Twilight mode at 400 ISO



Sony Cyber-shot DSC-HX5: Program mode at 400 ISO



Example: Microsoft Kinect (2010)



<http://www.microsoft.com/spain/prensa/Resources/ContentImages/Contents/2011/06/Kinect-Sensor.jpg>

uses coded illumination to recover depth

Example: Microsoft Kinect (2010)



http://futuretheater.net/wiki/Kinect_Workshop

uses coded illumination to recover depth

Example: iPhone photography

SynthCam

[View More By This Developer](#)

By Marc Levoy

Open iTunes to buy and download apps.



[View In iTunes](#)

Description

Have you ever wished you could take an iPhone picture that had a shallow depth of field like an SLR? Or a picture in a dark room that didn't come out noisy? Or a tilt-shift shot that makes the world look like a miniature model? This app lets you do all these things.

[SynthCam Support](#) ▶

[...More](#)

What's New in Version 2.0

– SynthCam now offers multi-point focusing and tilted focal planes. The number icon on the toolbar cycles through 1, 2, 3, and 4-point modes. In each mode the solid square shows where the camera itself is metering and

Photosynth

[View More By This Developer](#)

By Microsoft Corporation

Open iTunes to buy and download apps.



[View In iTunes](#)

Free

Description

Interactive Panorama Capture and Sharing – Now in Version 1.1.4

#2 iPhone App of 2011 – Brad Spirrison, TechCrunch

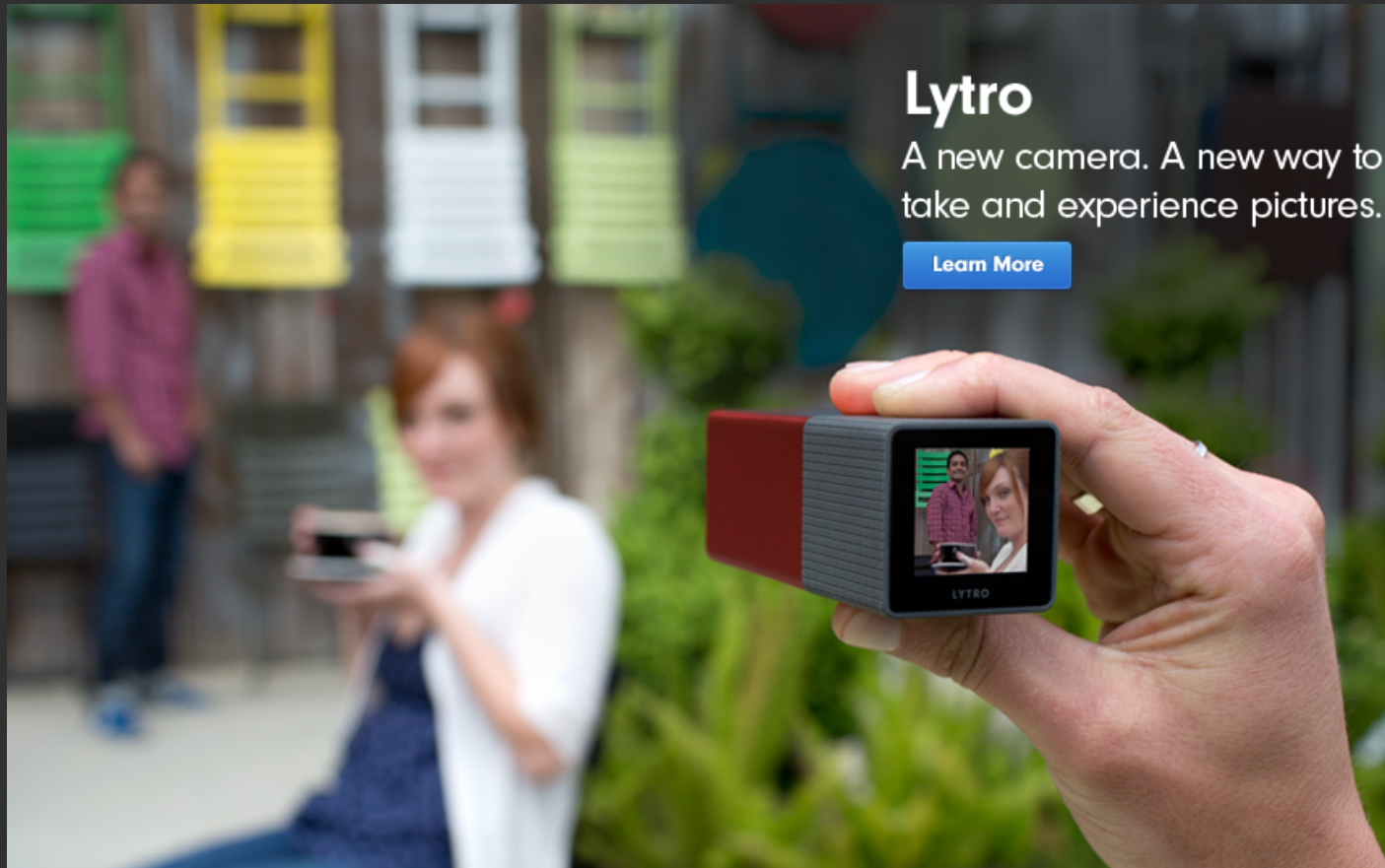
[Microsoft Corporation Web Site](#) ▶ [Photosynth Support](#) ▶ [Application License Agreement](#) ▶

[...More](#)

What's New in Version 1.1.4

- Improvements to Windows Live ID login
- Improvements to Facebook login
- Bug fixes

Example: Lytro camera (2012)



Lytro

A new camera. A new way to take and experience pictures.

[Learn More](#)

<https://www.lytro.com>

captures light fields, not simple photos

Example: Lytro camera (2012)

Make it magic.

Lytro lets you take pictures like never before. Unlike a conventional camera that captures a single plane of light, the Lytro camera captures the entire light field, which is all the light traveling in every direction in every point in space.

Capture everything - instantly.

Capture living pictures with the press of a single button. By instantly capturing complete light field data, the Lytro camera gives you capabilities you've never had in a regular camera.



Focus after the fact.

Since you'll capture the color, intensity, and direction of all the light, you can experience the first major light field capability - focusing after the fact. Focus and re-focus, anywhere in the picture. You can refocus your pictures at anytime.

Focusing after the fact means no more auto-focus motor. No auto-focus motor means no more waiting on shutter delay. Now you can capture the moment as you experienced it, not the moment after.

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

captures light fields, not simple photos

Things to keep you awake at night...

the next billion cameras?

credits: <http://dl.acm.org/citation.cfm?id=1667256&bnc=1>

the first trillion photos?

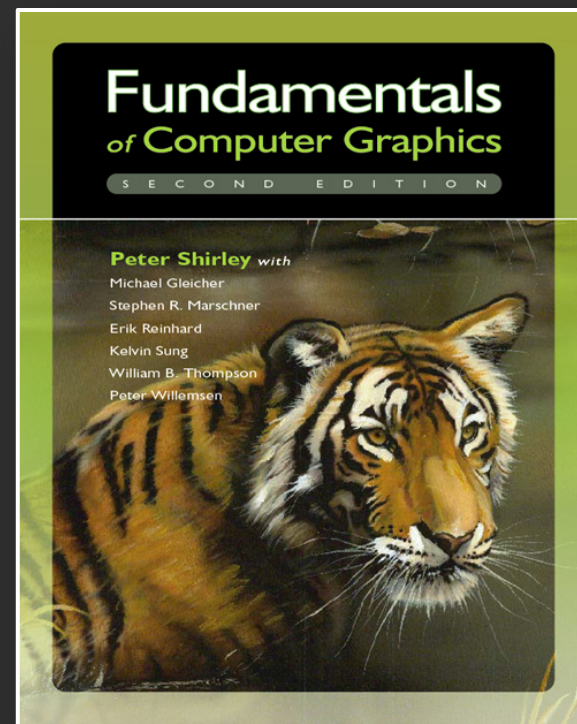
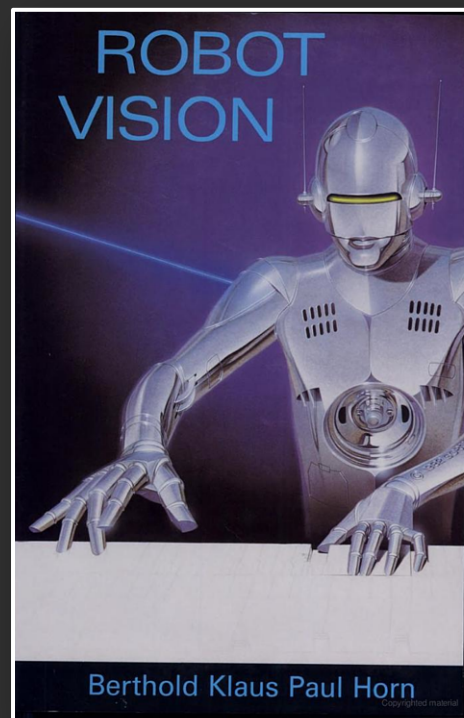
the photography experience

what is a photo?



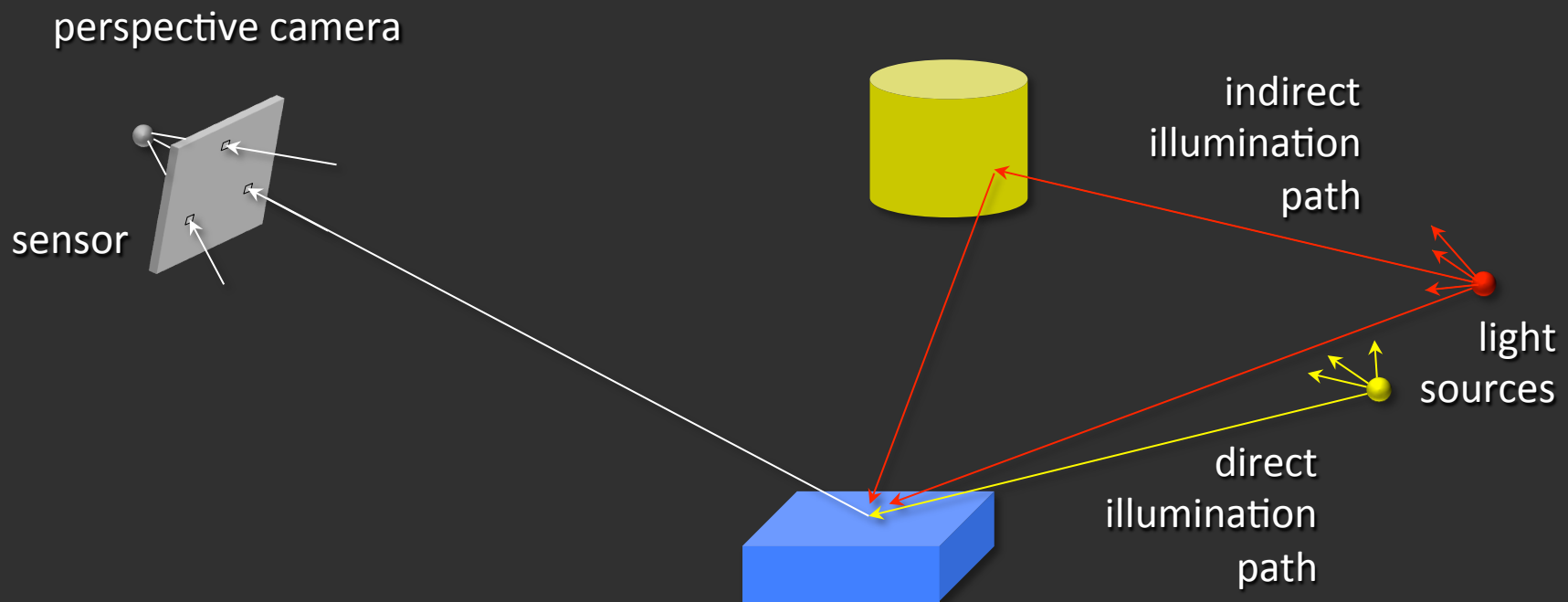
Radiometric point of view

answer 1: the result of light transport from light sources to pixels



Radiometric point of view

perspective 2D image due to light transport from light sources to pixels



Sensor point of view

2D array of photon counts recorded by camera sensor



Computational point of view

neither answer is entirely accurate

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Computational point of view

neither answer is entirely accurate



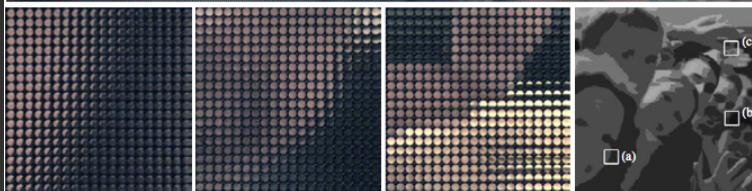
credits: S. Seitz & J. Kim

Computational point of view

neither answer is entirely accurate



what a light-field camera records ...



credits: R. Ng

Computational point of view

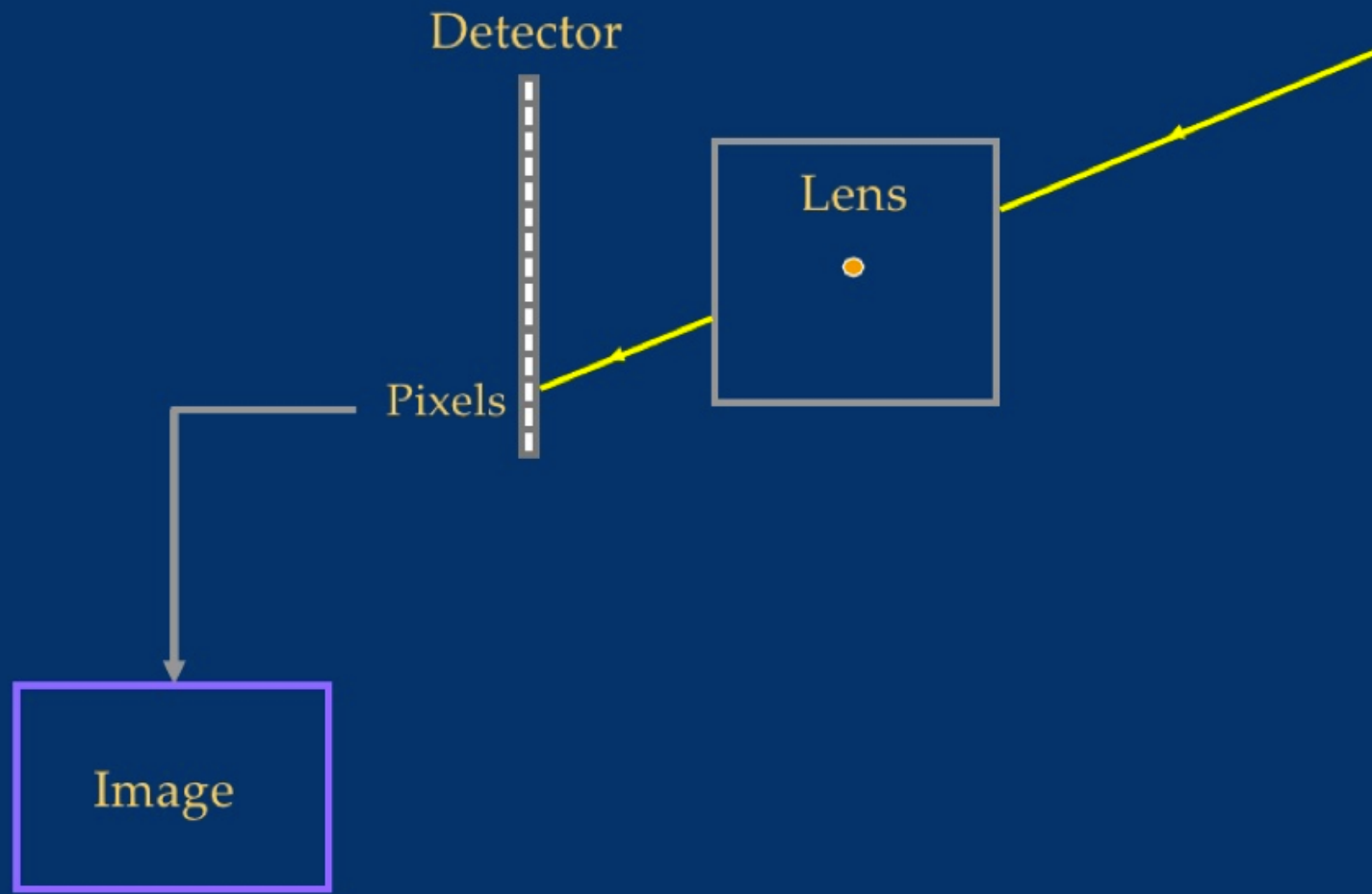
neither answer is entirely accurate



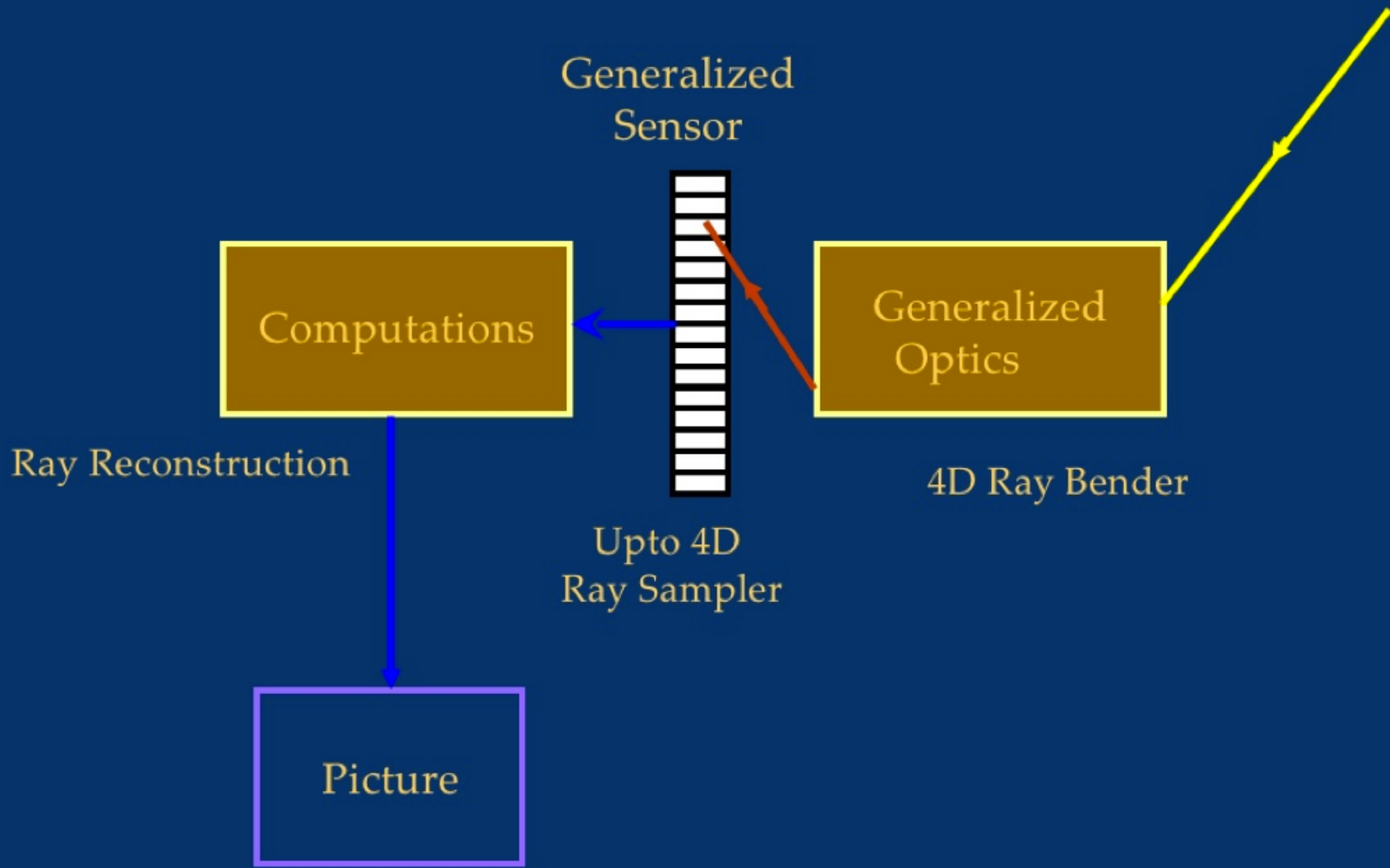
... is not what the
photographer sees

what is a camera?

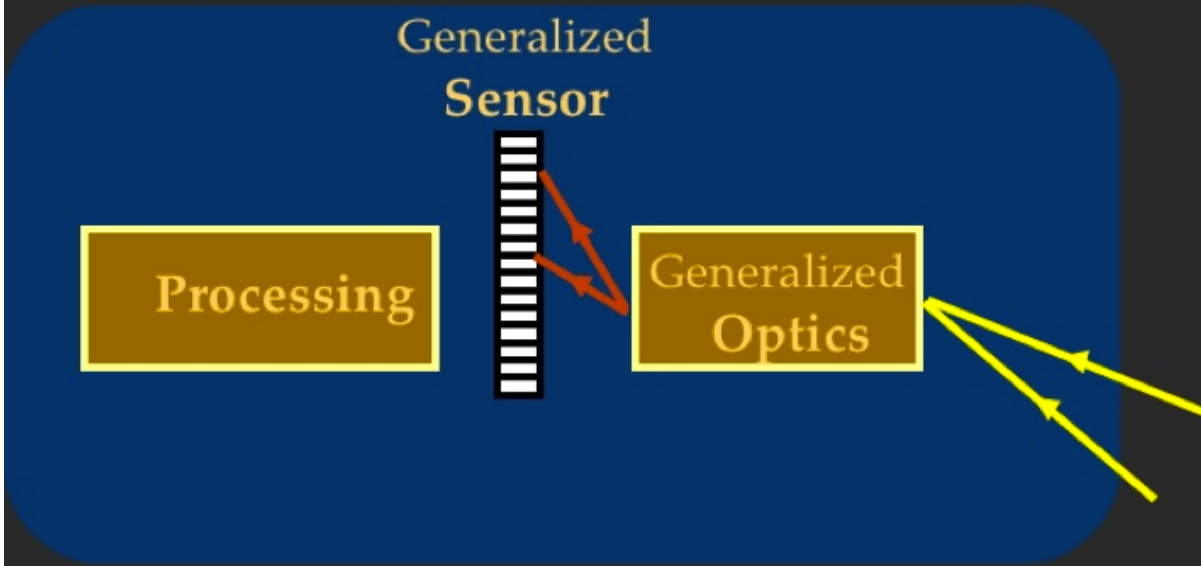
Traditional 'film-like' Photography



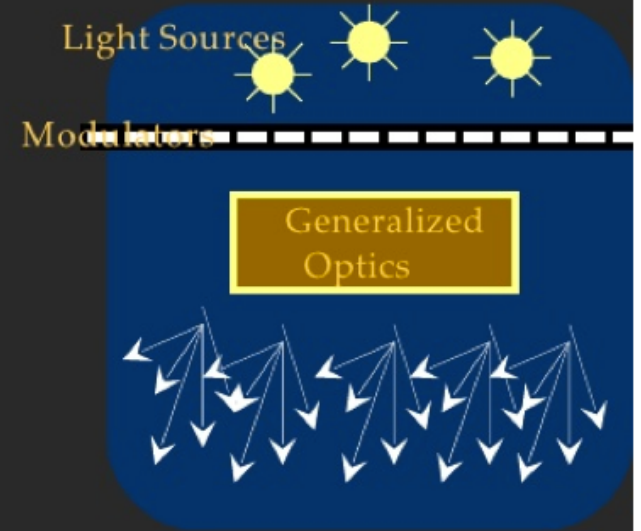
Computational Camera: Optics, Sensors and Computations



Novel Cameras



Programmable Lighting



Scene

Starting point: traditional cameras



Photographic degrees of freedom



aperture
exposure
focus
ISO setting
viewpoint
flash output



illumination
(projector, flash, etc)

Limitations



limitations of lenses

defocus
aberrations
diffraction

limitations of camera system

depth of field
motion blur



limitations of sensors

noise
saturation
dynamic range
spectral sensitivity

field of view
viewpoint

Computational photography goals

offer more degrees of freedom

break current limits

A task-based view of CP

Computational Camera

Smart Light

Digital Photography

Image processing applied to captured images to produce "better" images.

Examples:
Interpolation, Filtering, Enhancement, Dynamic Range Compression, Color Management, Morphing, Hole Filling, Artistic Image Effects, Image Compression, Watermarking.

Computational Processing

Processing of a set of captured images to create "new" images.

Examples:
Mosaicing, Matting, Super-Resolution, Multi-Exposure HDR, Light Field from Multiple View, Structure from Motion, Shape from X.

Computational Imaging/Optics

Capture of optically coded images and computational decoding to produce "new?" images.

Examples:
Coded Aperture, Optical Tomography, Diaphanography, SA Microscopy, Integral Imaging, Assorted Pixels, Catadioptric Imaging, Holographic Imaging.

Computational Sensor

Detectors that combine sensing and processing to create "smart" pixels.

Examples:
Artificial Retina, Retinex Sensors, Adaptive Dynamic Range Sensors, Edge Detect Chips, Focus of Expansion Chips, Motion Sensors.



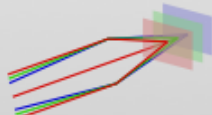
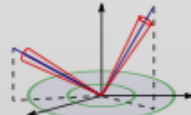
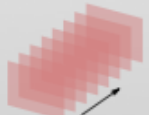



Computational Illumination

Adapting and Controlling Illumination to Create 'revealing' image

Examples:
Flash/no flash, Lighting domes, Multi-flash for depth edges, Dual Photos, Polynomial texture Maps, 4D light source

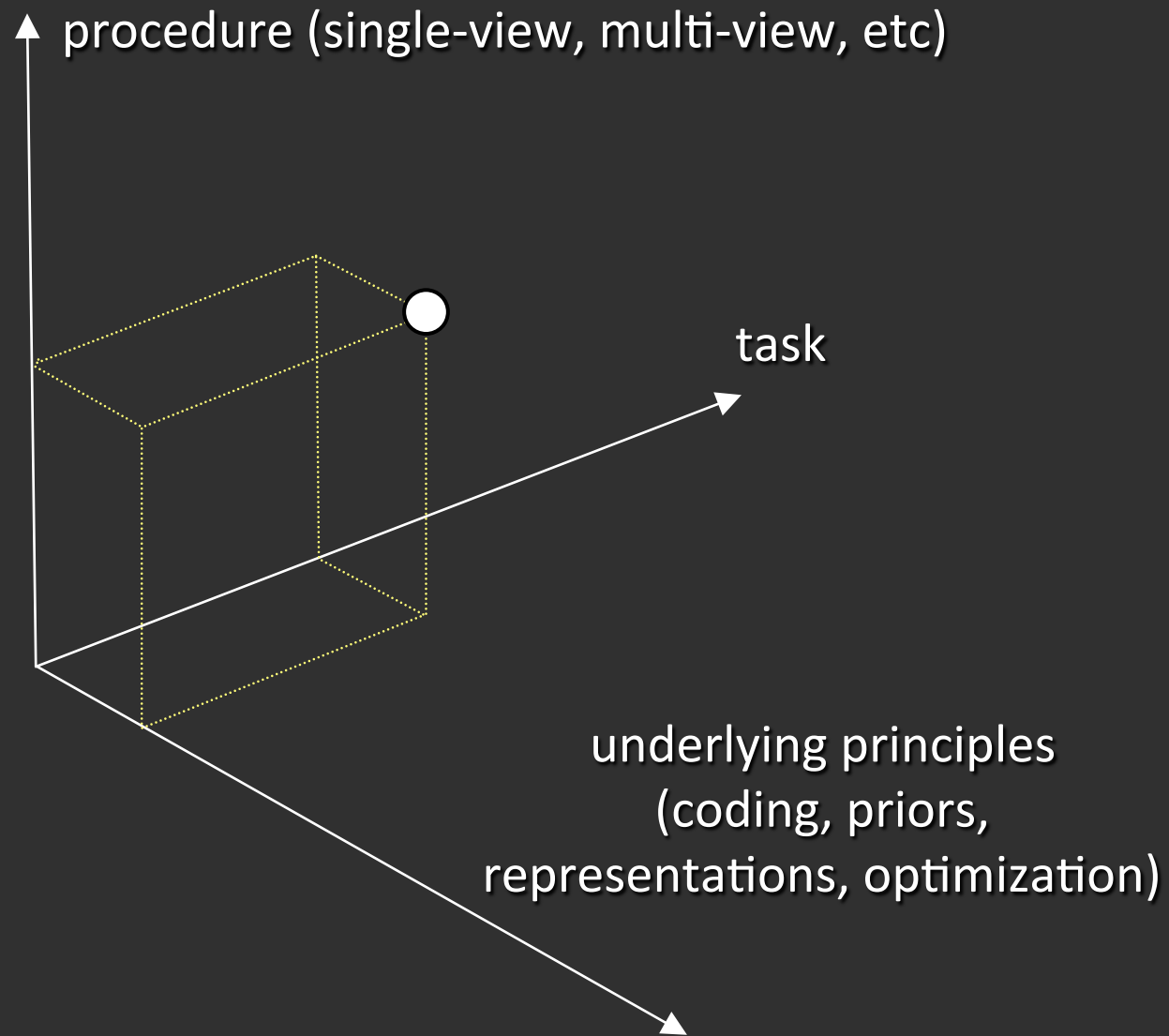
A procedure-based view of CP

← limitations →

| Plenoptic Dimension |  |  |  |  |  |
|---|---|--|---|---|---|
| Acquisition Approach | Dynamic Range | Color Spectrum | Space Focal Surfaces | Directions Light Fields | Time |
|  Single Shot Acquisition | Assorted Pixels Gradient Camera Split Aperture Imaging Adaptive DR Imaging | Color Filter Arrays Assorted Pixels Dispersive Optics | Coded Apertures Focal Sweep Field Correction | Plenoptic Cameras w/ Lenses, Masks, or Mirrors Compound Eye Cameras | Assorted Pixels Flutter Shutter Reinterpretable Imager Sensor Motion |
|  Sequential Image Capture | Exposure Brackets Generalized Mosaics HDR Video | Narrow Band Filters Generalized Mosaicing Agile Spectrum Imaging | Focal Stack Jitter Camera Super-Resolution | Programmable Aperture Camera & Gantry | High Speed Imaging Temporal Dithering |
|  Multi-Device Setup | Optical Splitting Trees | Multi-Camera Arrays Optical Splitting Trees | Multi-Camera Arrays | Multi-Camera Arrays | Multi-Camera Arrays Hybrid Cameras |

↑ procedures used to overcome them

Understanding research in CP



Our focus: principles of CP

1. Foundational concepts (3 weeks)

- The light field representation
- Modeling sensor non-idealities

Our focus: principles of CP

2. Image analysis principles (6 weeks)

- Volumetric representations of image & video data
- Edge-aware processing
- Natural image priors
- Discrete & continuous optimization
- Multi-view geometry & structure from motion

Our focus: principles of CP

3. Coding for photography (3-4 weeks)

- Occlusion-based coding
- Occlusion-free coding
- Illumination coding
- Light transport

administrivia

Course requirements

paper presentations (25%)

reaction reports each week (15%)

term project (60%)

auditing: OK, but must present a paper
& participate in discussions

Paper presentations

whiteboard presentation (no ppt)

focus on getting across the major technical points & contributions

15-20 mins per paper, 15-10 mins of discussion (may be interleaved)

Paper presentations

must do a dry run with me 1 week prior to presentation

presentations start 2 weeks from now (Monday OK for dry run)

browse list of papers & email me your preference(s)

Structure of each lecture

Kyros: intro comments (optional)

students: 2-3 papers

Kyros: paper overviews (optional)

Reaction reports

identify ONE major contribution or limitation and defend your choice
(1/2 page max)

describe an idea of yours that extends the paper and elaborate as much as possible
(1/2 page max)

your report must have depth – I want to see how you think! **good examples posted online**

Term Project

submit proposal by mid-October

projects due early Dec

conference-like paper format
(plus results/code/etc as appropriate)

Prerequisites

prior course on vision/graphics useful
but not necessary

I will assume you

- can quickly become familiar with topics covered in CSC2503
- can quickly pick up basic image processing tools (eg. filtering)
- have some ability to read research papers, fill in gaps, follow the key references in papers you read

Questions? Send me email