

Visual Computing

Prof. Marc Pollefeys

Prof. Stelian Coros

Two parts

- Part I - Image processing

Prof. Marc Pollefeys

Main assistant: Remi Pautrat



- Part II - Computer graphics

Prof. Stelian Coros

Main assistant: James Bern



Topics – Image Processing

- Digital images and sensors
- Image segmentation and morphology
- Convolution and image features
- Fourier transform and filtering
- Unitary transformations and image compression
- Warping, Optical flow and video compression
- Texture analysis and Radon transform

Topics – Computer Graphics

- Drawing triangles, rasterizing
- Transformations, Geometry and textures
- Rendering pipeline
- Lighting, shading, visibility and shadows
- Animation, rigging
- Physically-based simulation, PDEs

Course Logistics

<https://graphics.ethz.ch/teaching/viscomp18/>

- Lectures:
 - Tue: 10-12, HG G-3
 - Thu: 13-15 HG G-3
- Exercises (from next week):
 - Tue: 13-16, CHN G 42
 - Thu: 09-12, IFW A36

Exercises

- Grade determined by final exam
 - Attend one of the two sessions each week
 - Registration for the exercise groups
-
- Exercises complement lectures to provide insight and hands-on experience
 - Goals is to finish most exercises during session with assistants (no homework)

Visual Computing @ ETHZ

- Institute of Visual Computing



Computer Vision and Geometry Lab – Prof. Marc Pollefeys



Computer Graphics Lab – Prof. Markus Gross



Interactive Geometry Lab – Prof. Olga Sorkine

Prof. Siyu Tang (Spring 2020)

- Advanced Interactive Technologies – Prof. Otmar Hilliges

- **CRL** Computational Robotics Lab – Stelian Coros

- Computer Vision Laboratory



Prof. Luc Van Gool, Prof. Ender Konukoglu, Fisher Yu (Fall 2020)

- Institute for Machine Learning – Prof. Buhmann, Prof. Hoffman, Prof. Krause, ...

- Photogrammetry and remote sensing – Prof. Konrad Schindler

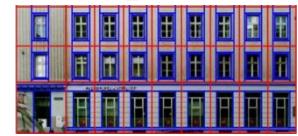
- Autonomous system laboratory – Prof. Roland Siegwart, Prof. Margarita Chli



Institute of Neuro-Informatics – Prof. Davide Scaramuzza, Prof. Tobi Delbrueck, ...

Computer Vision in Zurich

... and other labs and companies based in Zurich



super computing systems



Computer Vision and Image Analysis Examples and Applications

3D + Interactive Maps

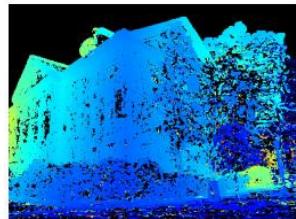


Automated 3D modeling



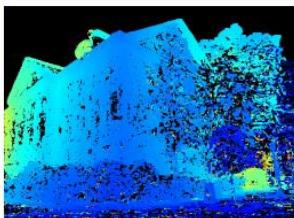
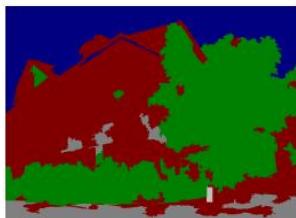
Joint 3D reconstruction and class segmentation

(Haene et al CVPR13)



reconstruction only
(uniform smoothness prior)

joint reconstruction
and segmentation
(ground, building, vegetation, stuff)

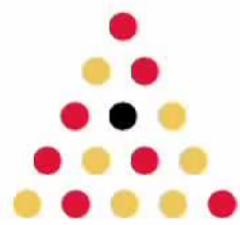


Robots Learning from Observation



D. Bentivegna & C. [Atkeson](#)

Willow Garage's PR2 plays pool



poolshark

Driver Assistance



[mobileye](#)

ETH



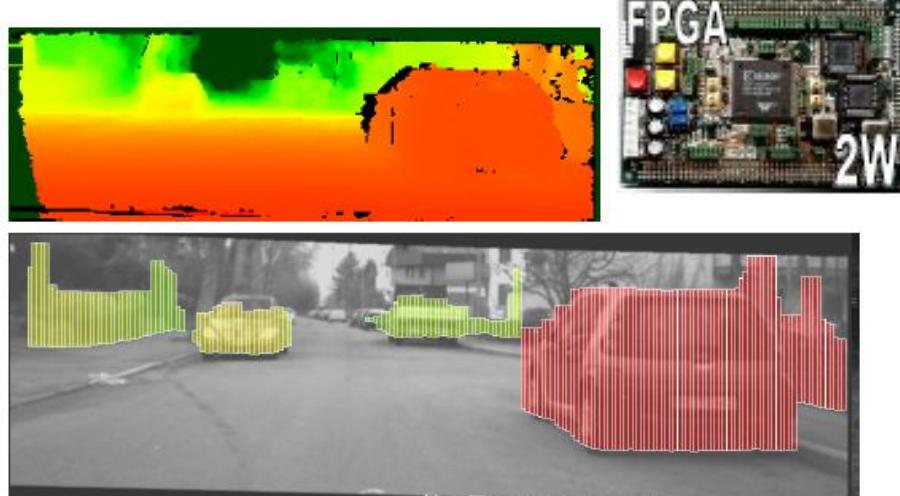
Mobileye PCW

Pedestrian Collision Warning

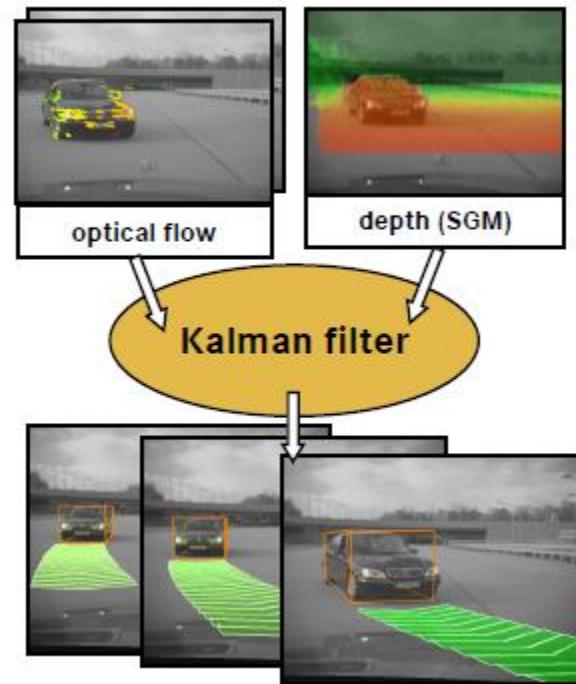


Driver Assistance

Daimler stereo system



[6D vision](#)



Daimler 6D vision

Dense6D



www.6D-Vision.de

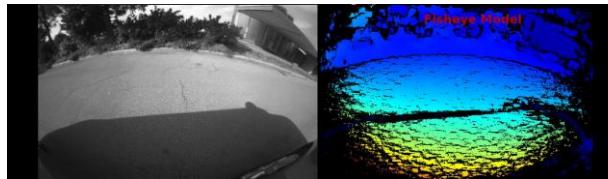


ETH

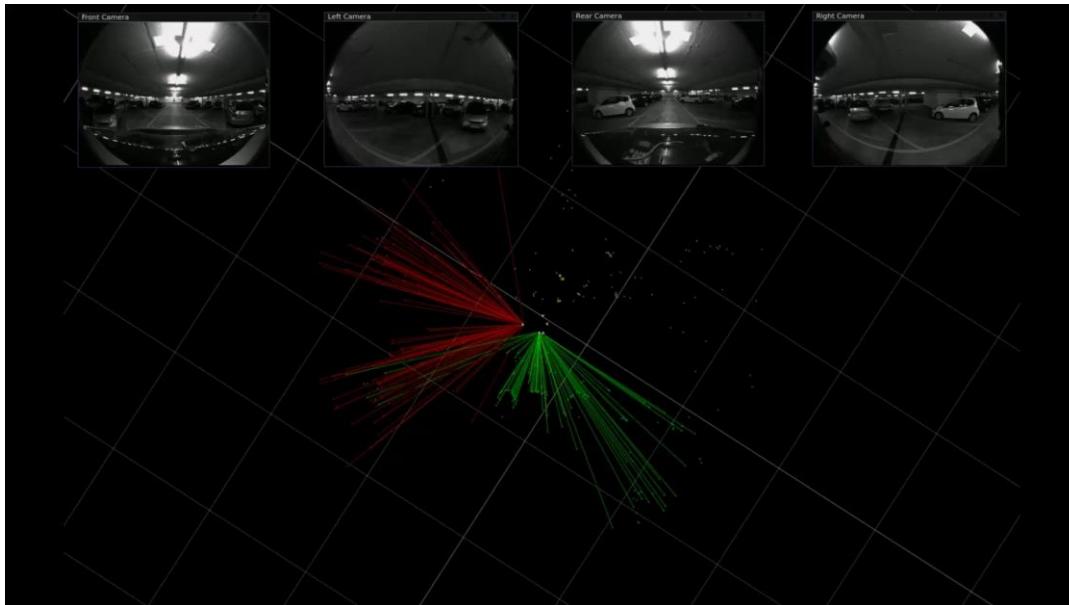
3D mapping for autonomous driving



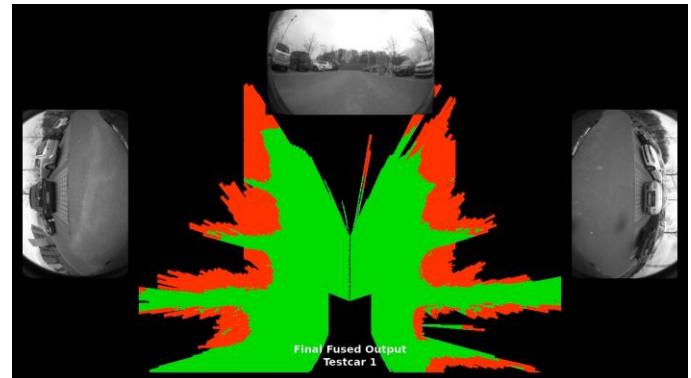
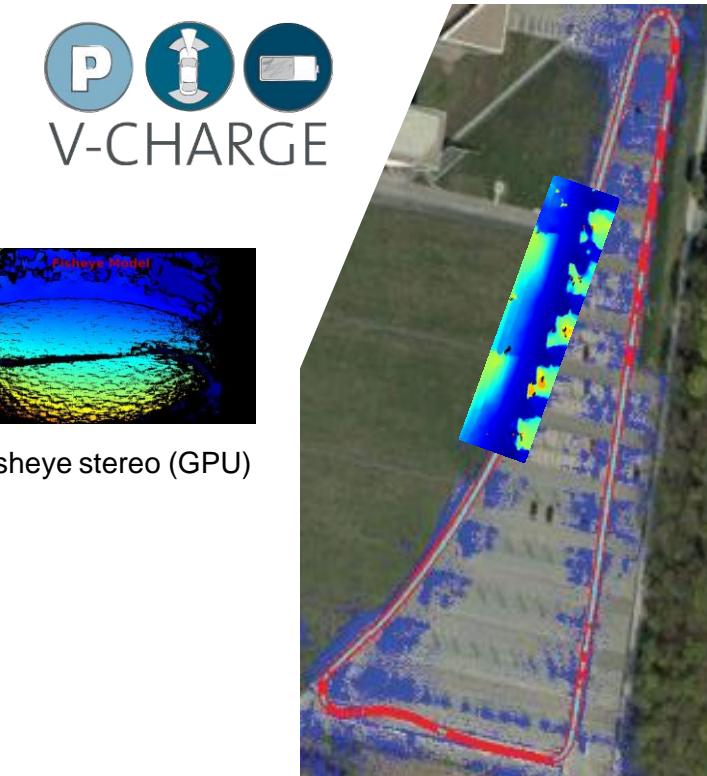
(Lee et al CVPR13;
Heng et al. ICRA14;
Haene et al...)



Dense real-time temporal fisheye stereo (GPU)



omnidirectional visual simultaneous localization and mapping



Robot navigation

Online Environment Mapping
Supplementary Video

Paper ID: #828



Micro Aerial Vehicles

pixhawk



<http://pixhawk.ethz.ch/>

ETH



auterion

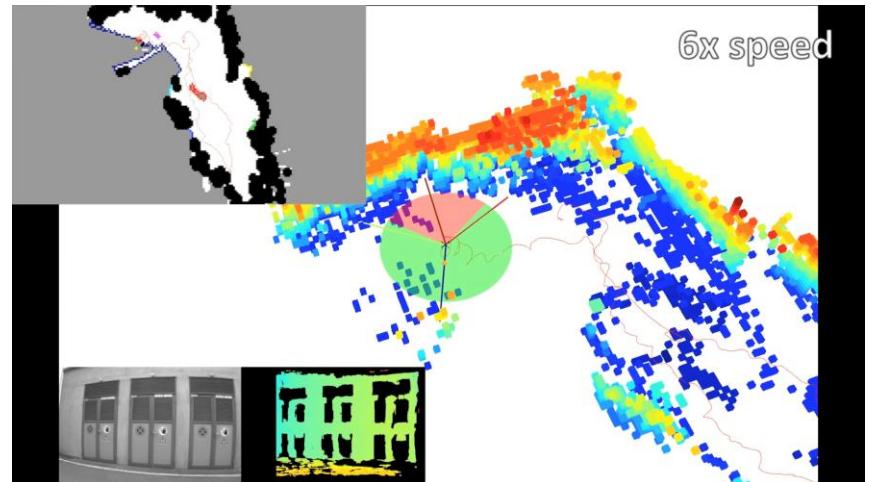
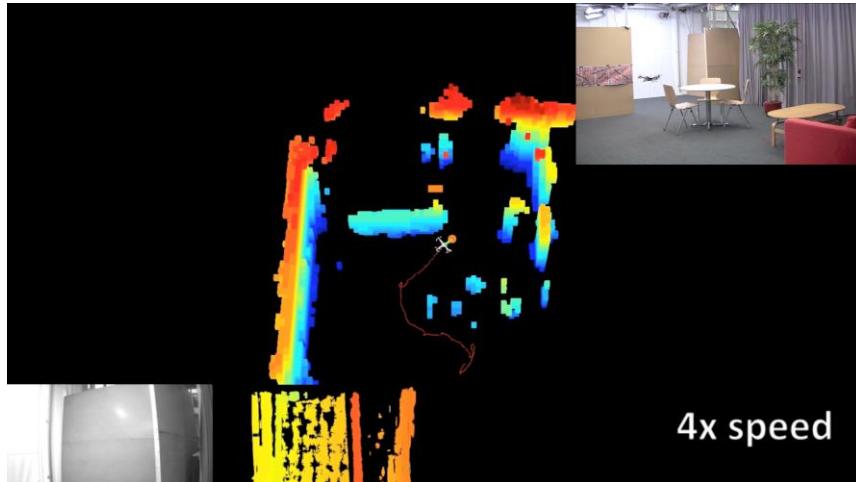
Full autonomous vision-based navigation and mapping

(Fraundorfer et al. IROS12 best paper finalist)

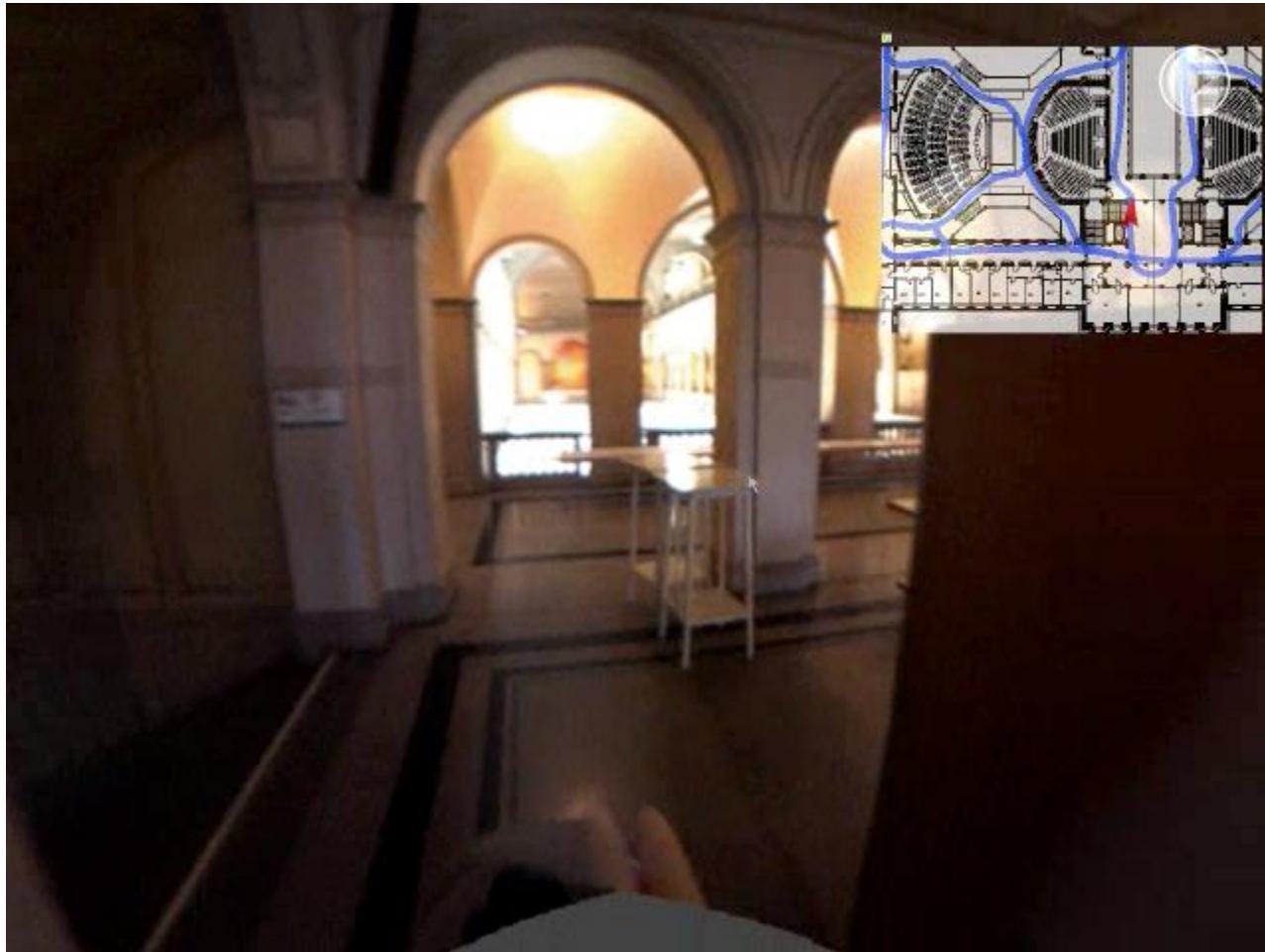
full on-board processing
2+1 cameras + IMU

indoor and outdoor operation
obstacle avoidance, mapping
and exploration

no laser, no GPS, no network



Mapping and localization



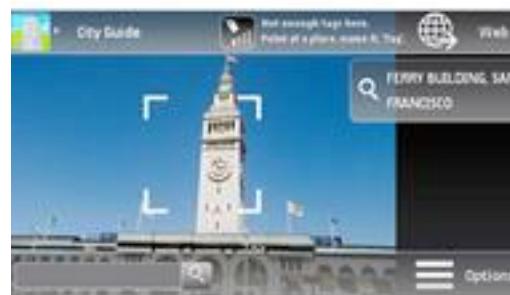
MobileTour



Uses accelerometers (as pedometer) and gyroscope to track user location

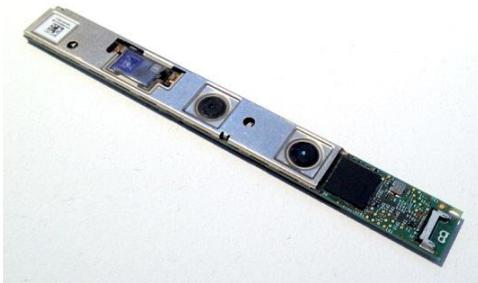
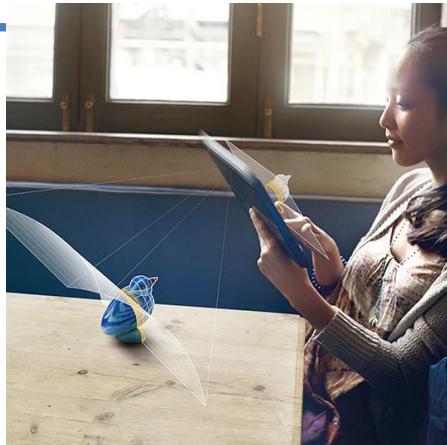
Image-based retrieval

- Google Image Search
- Kooaba (now PTC) (<http://www.kooaba.com/>)
- Nokia Point & Click
- Seeing AI  Microsoft



Intel RealSense technology

Low power (<1W) models for tablet and for PC

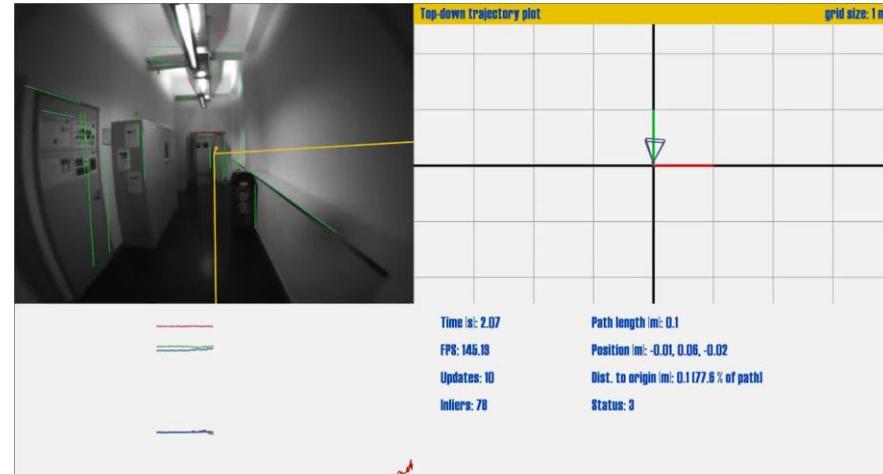


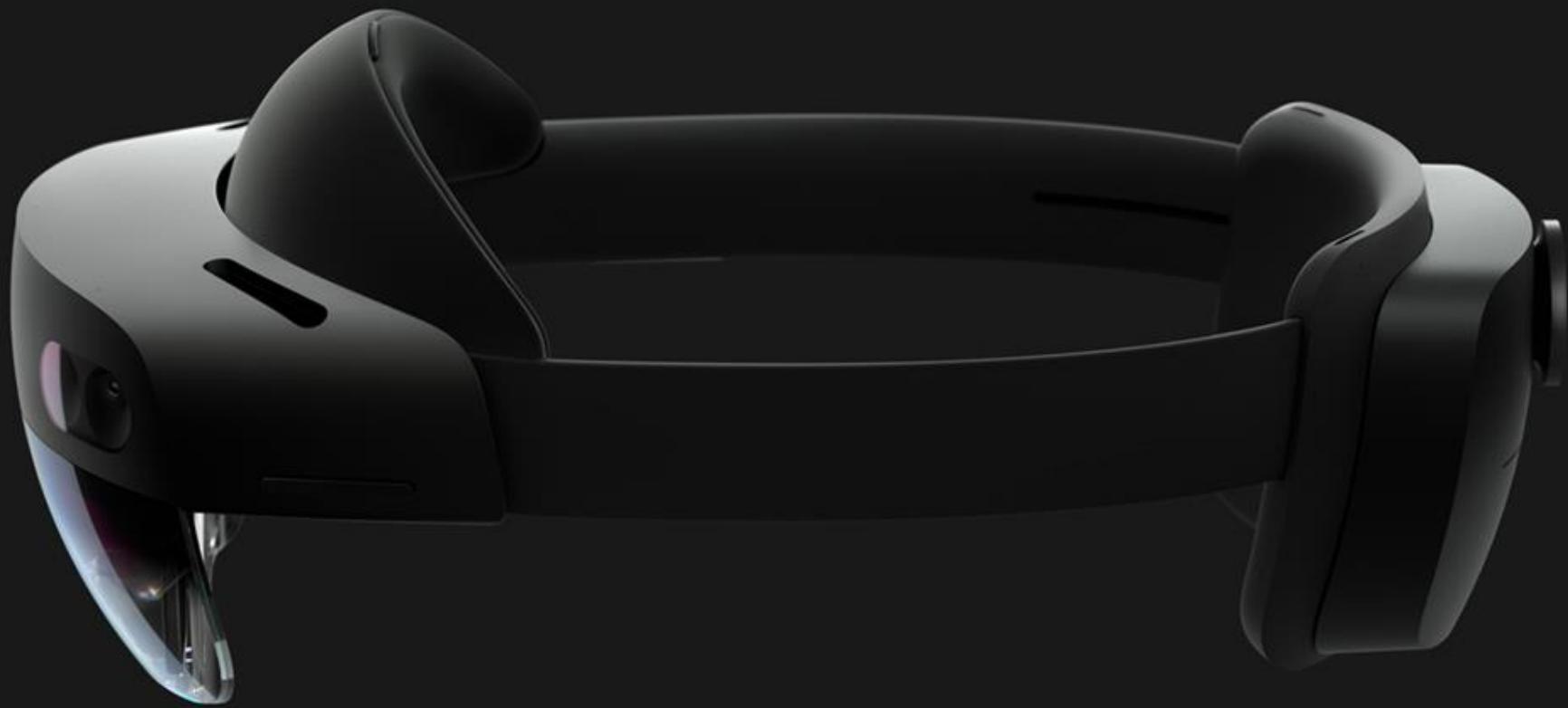
depth from 2 (or 1) cameras + (un)structured laser pattern

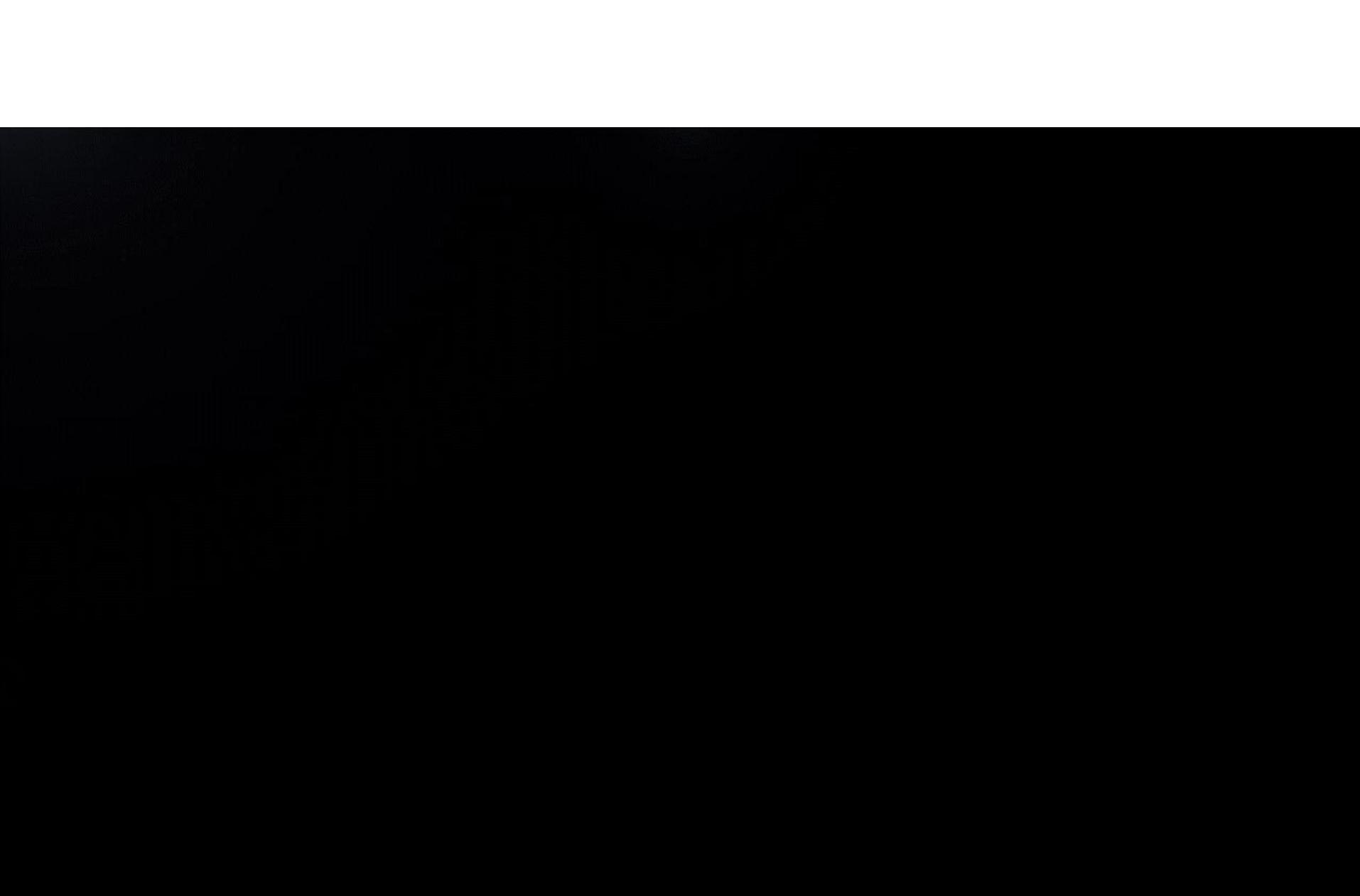


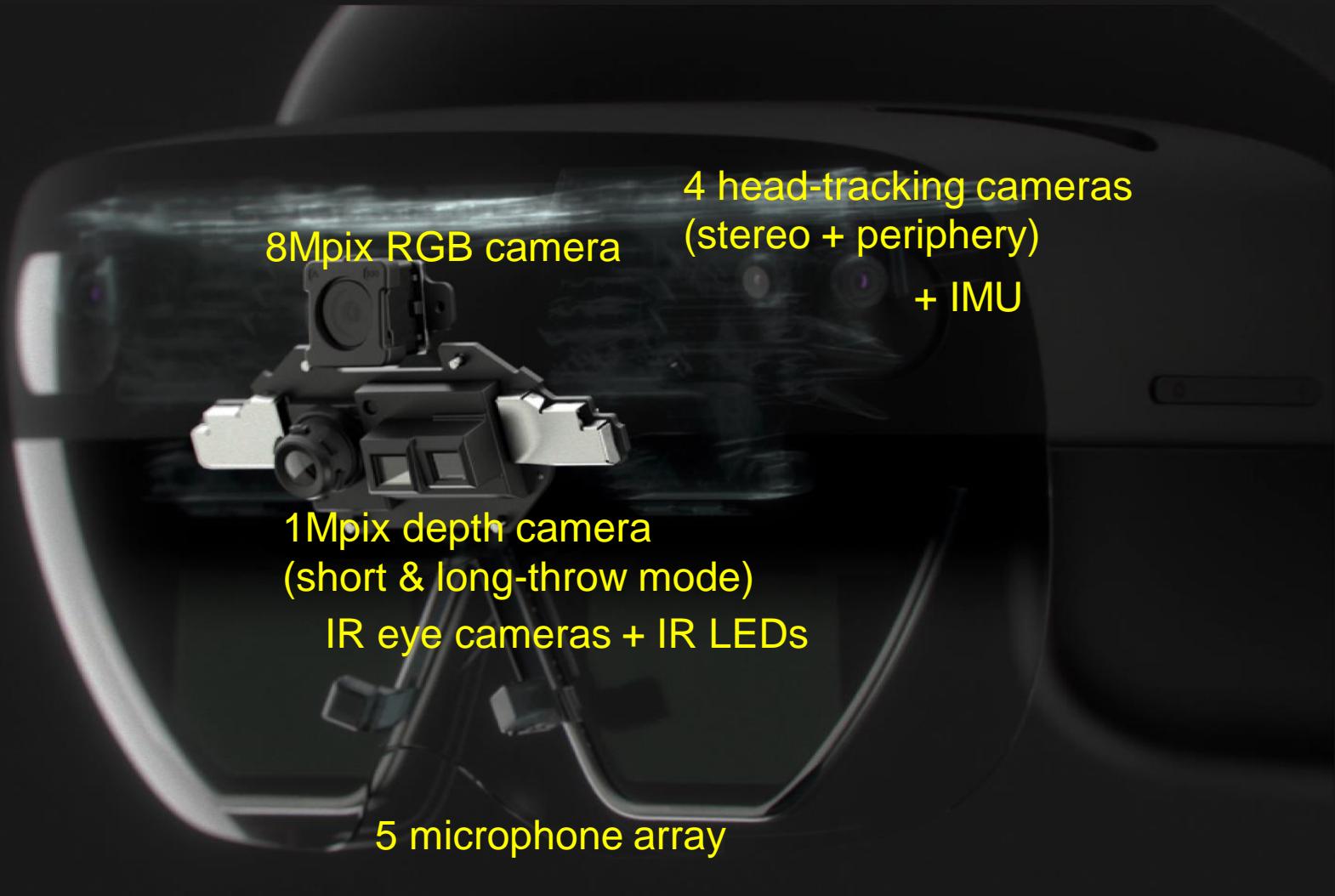
Project Tango

Research partner of Google's Project Tango









8Mpix RGB camera

1Mpix depth camera
(short & long-throw mode)

IR eye cameras + IR LEDs

5 microphone array

4 head-tracking cameras
(stereo + periphery)
+ IMU

HoloLens2 unpacked

By Alex Kipman, Microsoft Technical Fellow

ETH Global Lecture, October 3, 10am, AudiMax



Visual Modeling for Archaeology



3D on mobile phone

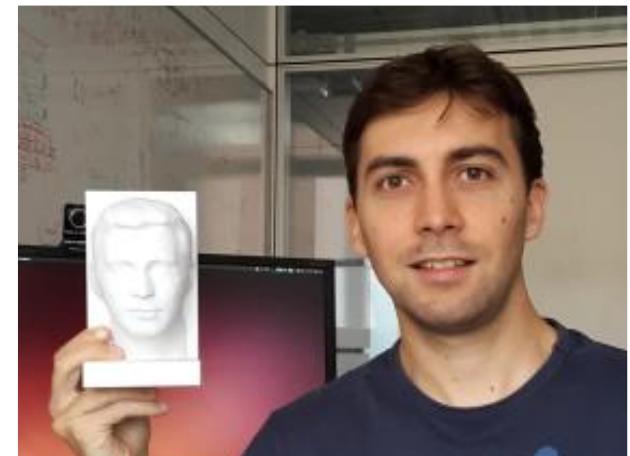
(Tanskanen et al. ICCV13)





(Delaunoy et al. CVPR14)

3D selfies





Surveillance



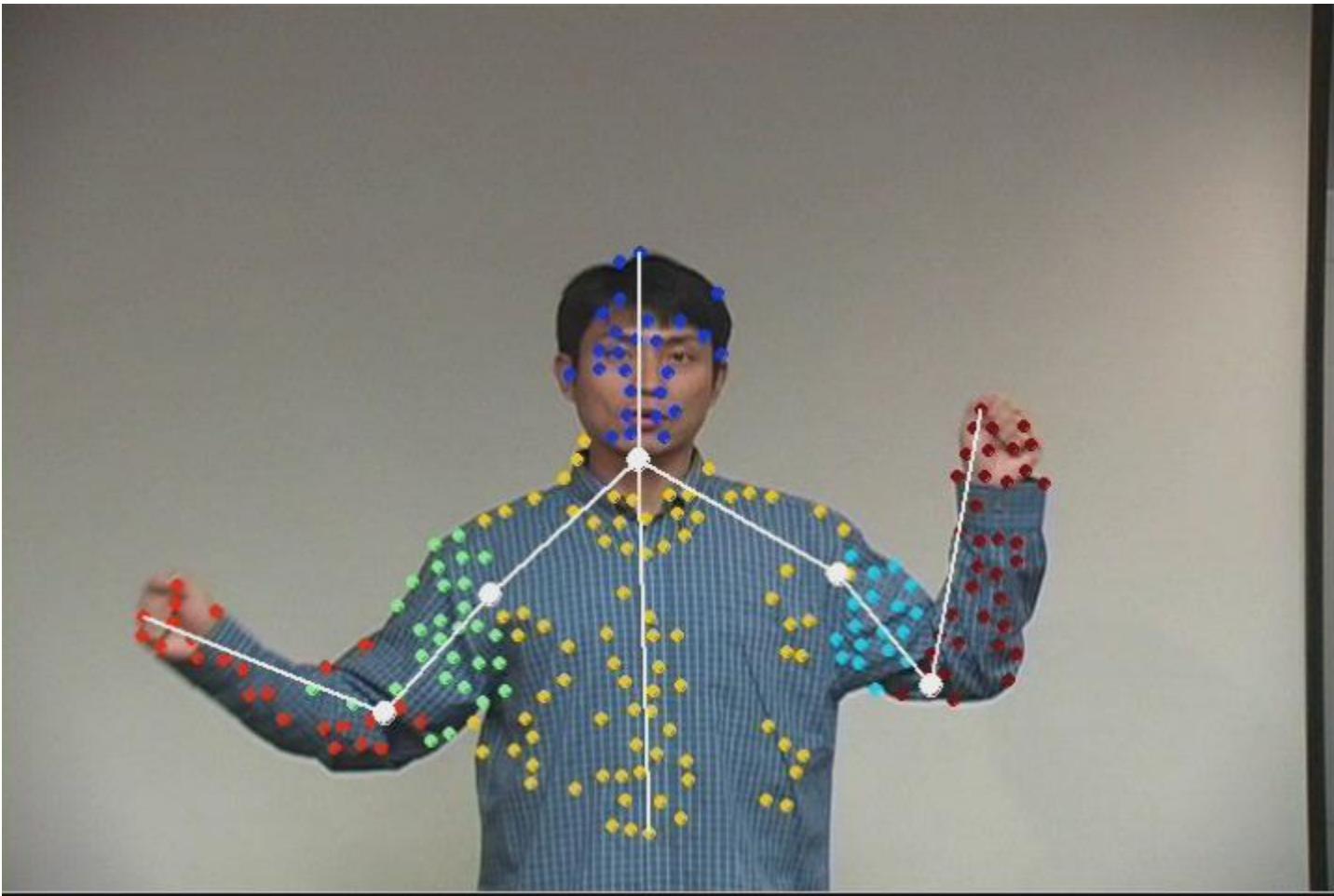
Brostow & Cipolla 2006

Character Animation: Motion Capture



Michael Jackson - Ghost

Articulate Motion Analysis



Markerless motion capture



MS Kinect



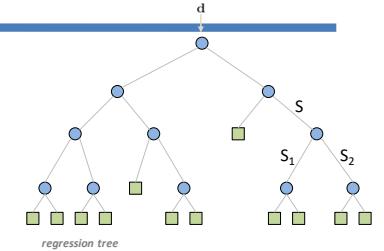
<http://www.xbox.com/en-US/kinect>

[kinect2](#)



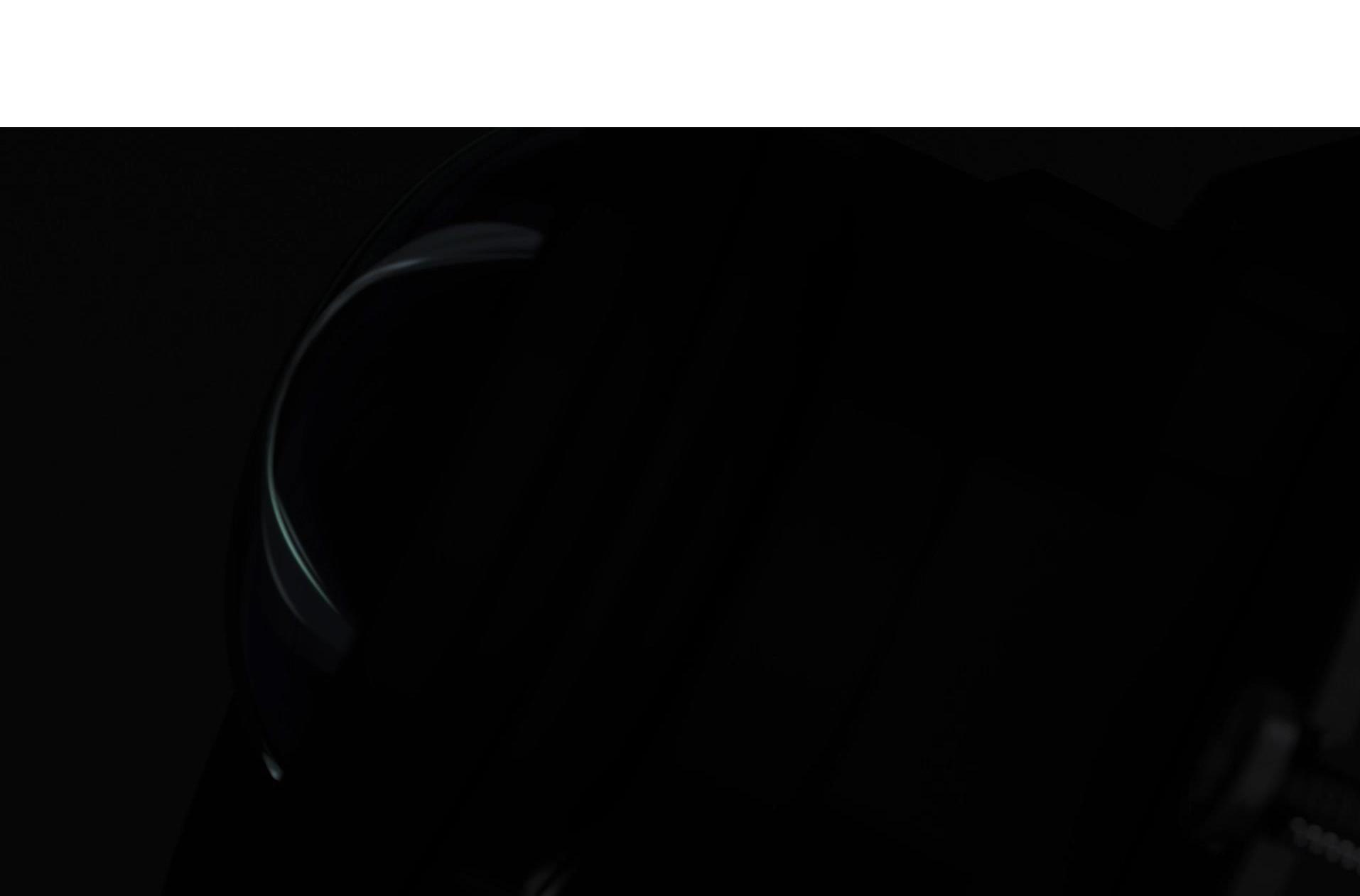
Bodytracking

Randomized forest
(Shotton et al.)

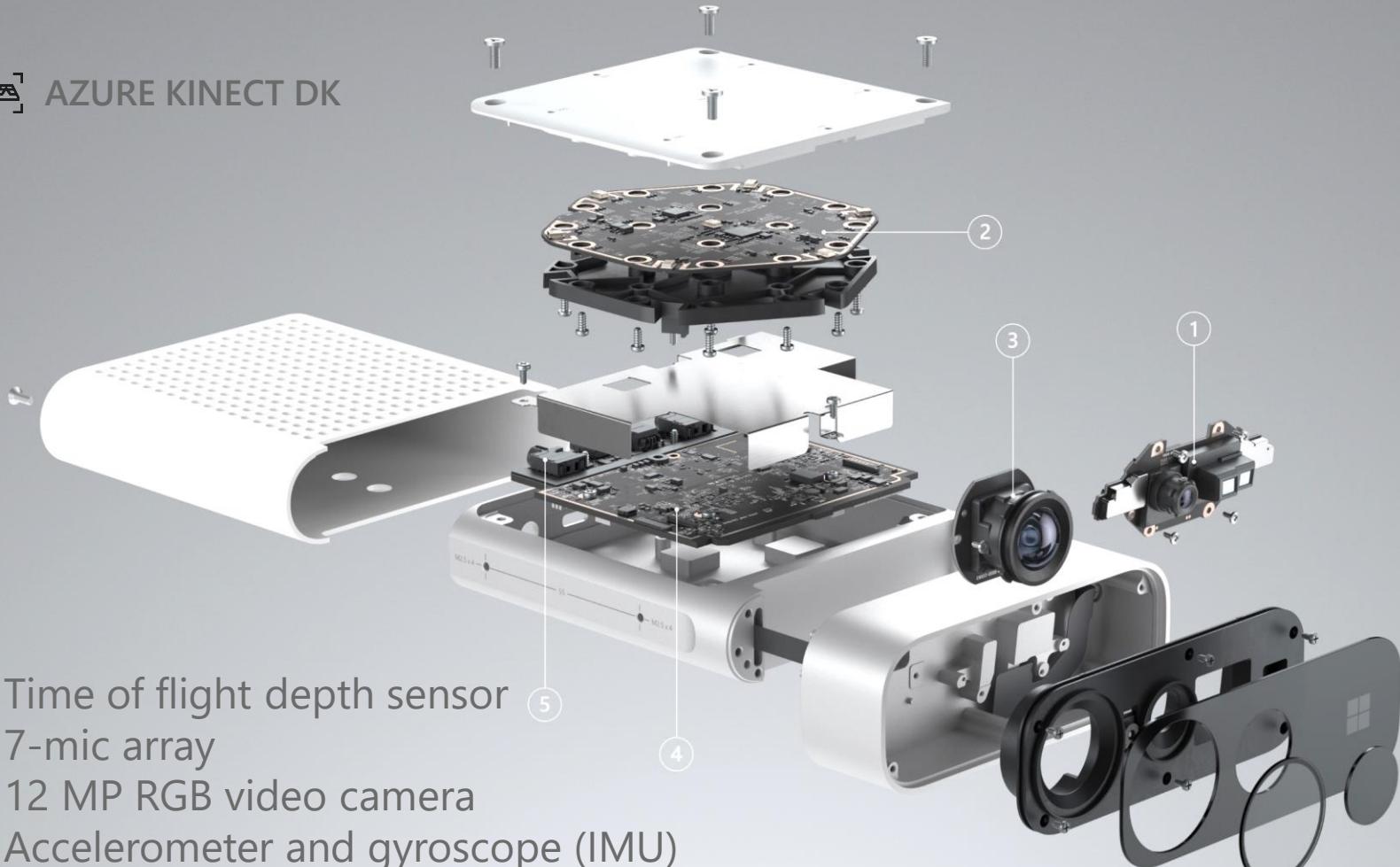


based on simple depth difference tests at each node

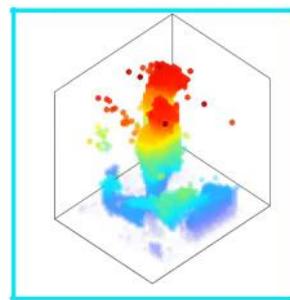
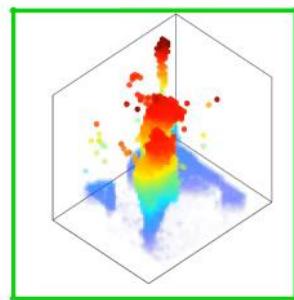
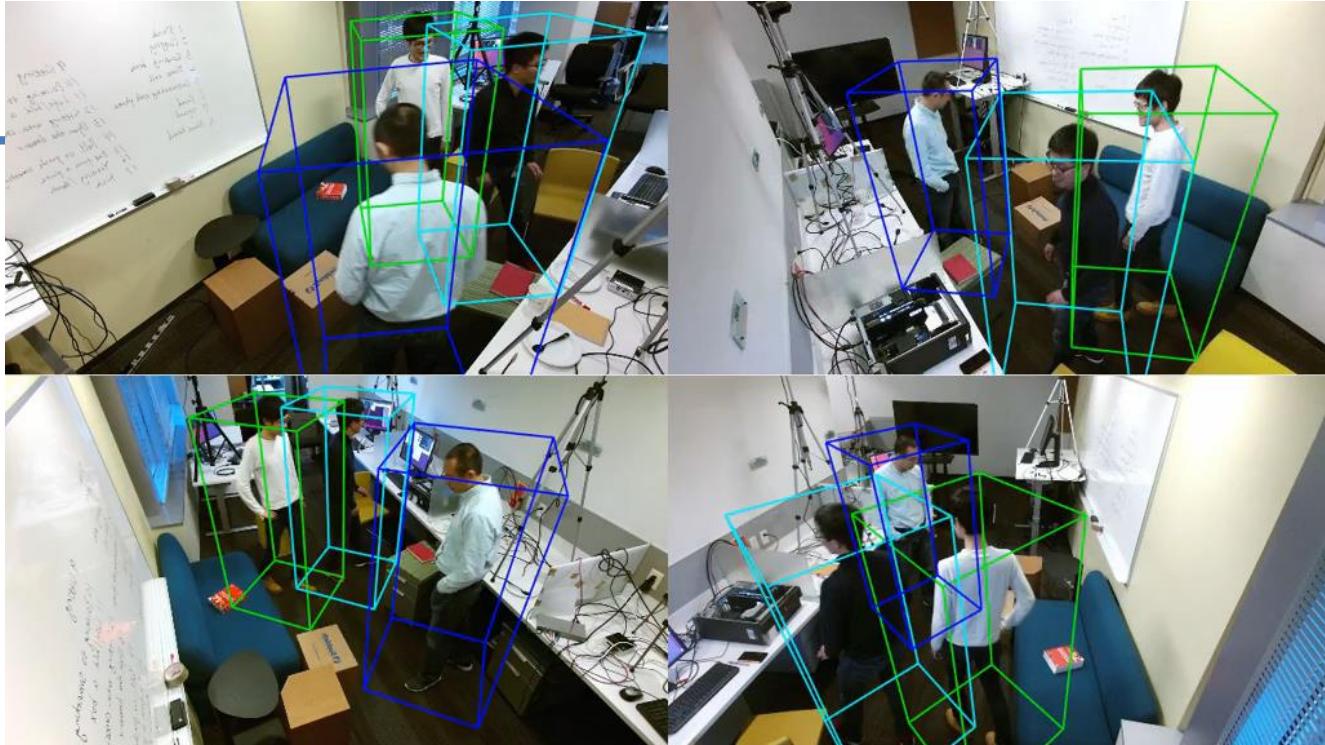




[A] AZURE KINECT DK



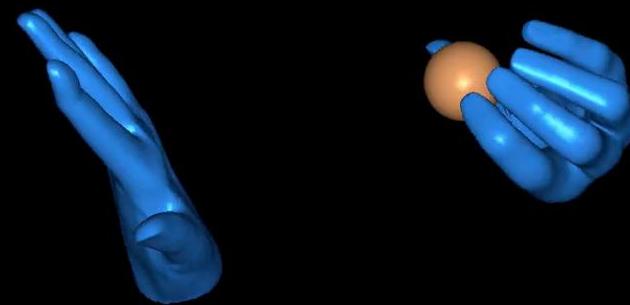
- (1) Time of flight depth sensor
- (2) 7-mic array
- (3) 12 MP RGB video camera
- (4) Accelerometer and gyroscope (IMU)
- (5) External sync pins



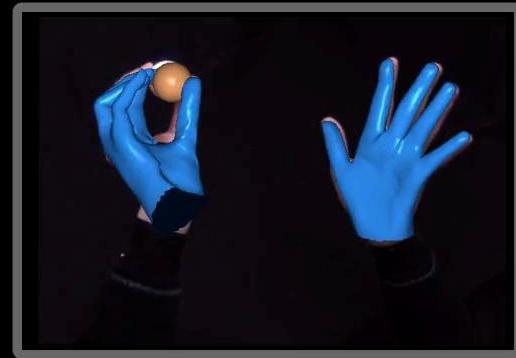
HOLDING AND PASSING A BALL



CAM #5
(INPUT VIDEO)



CAM #5
(RESULT)



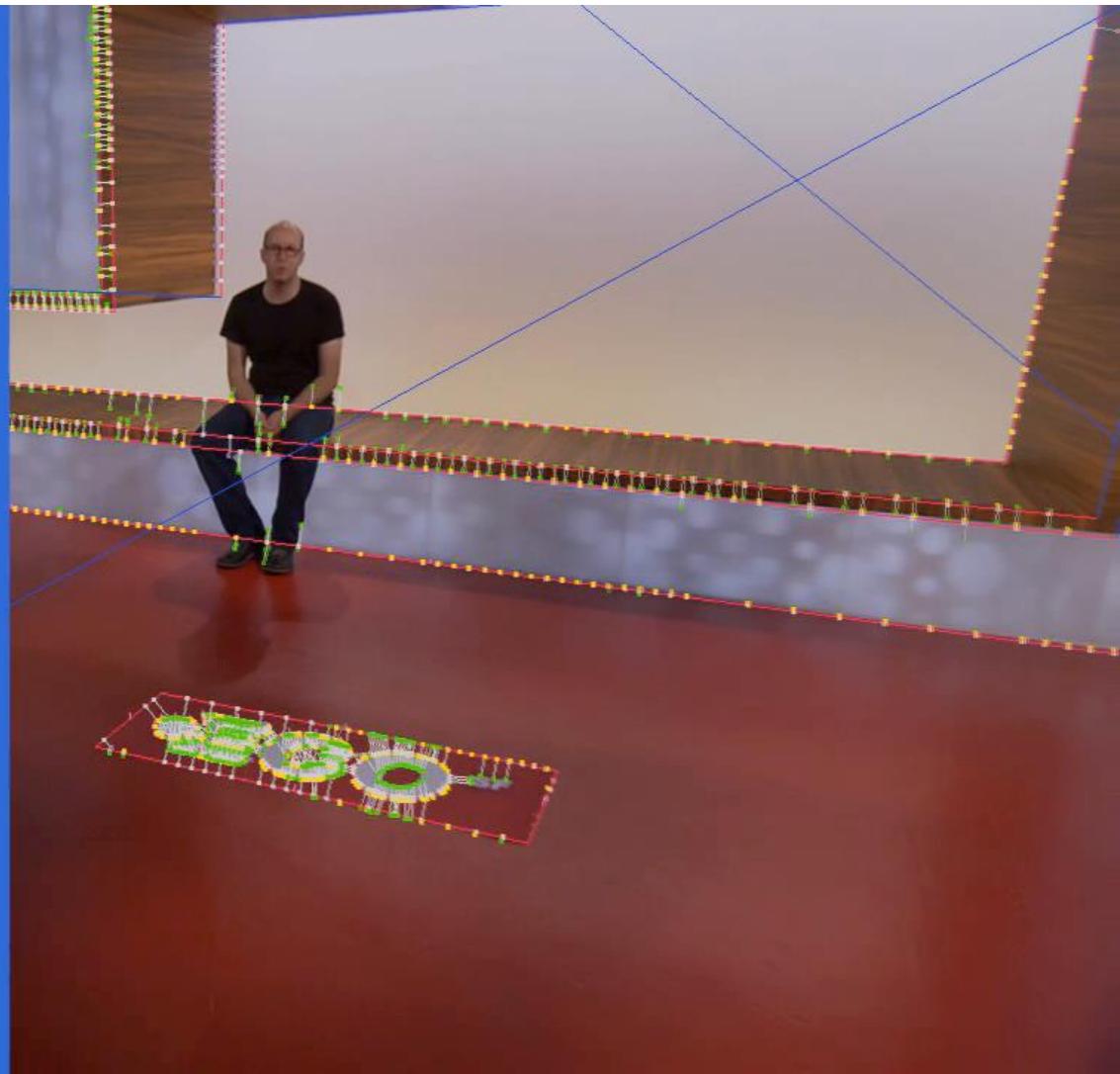
CAM #3
(RESULT OVERLAI
D ON INPUT VIDEO)

Facial animation capture



Match Moving: Joining CG + Real





Visual Computing: The Digital Image

Prof. Marc Pollefeys

Prof. Markus Gross

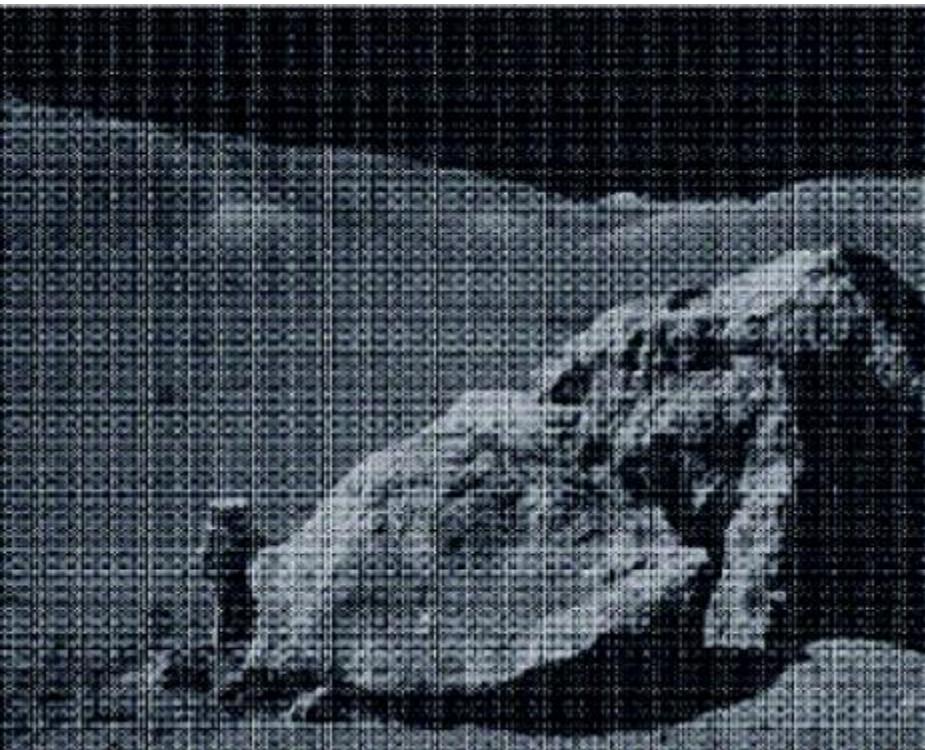


Digital cameras are the best sensors ever!

[\(Example video\)](#)

With a few problems...

Transmission interference



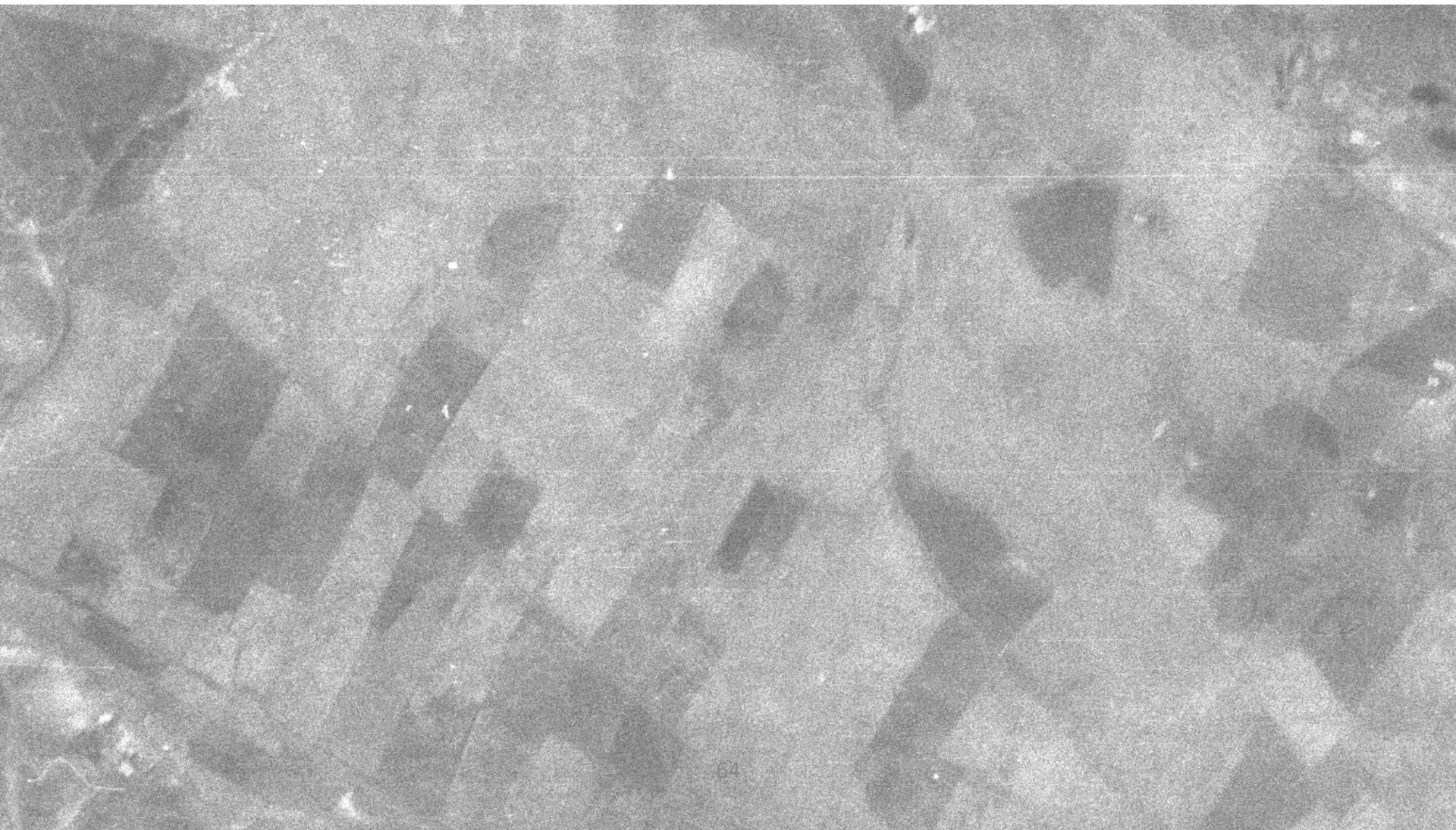
Compression artefacts



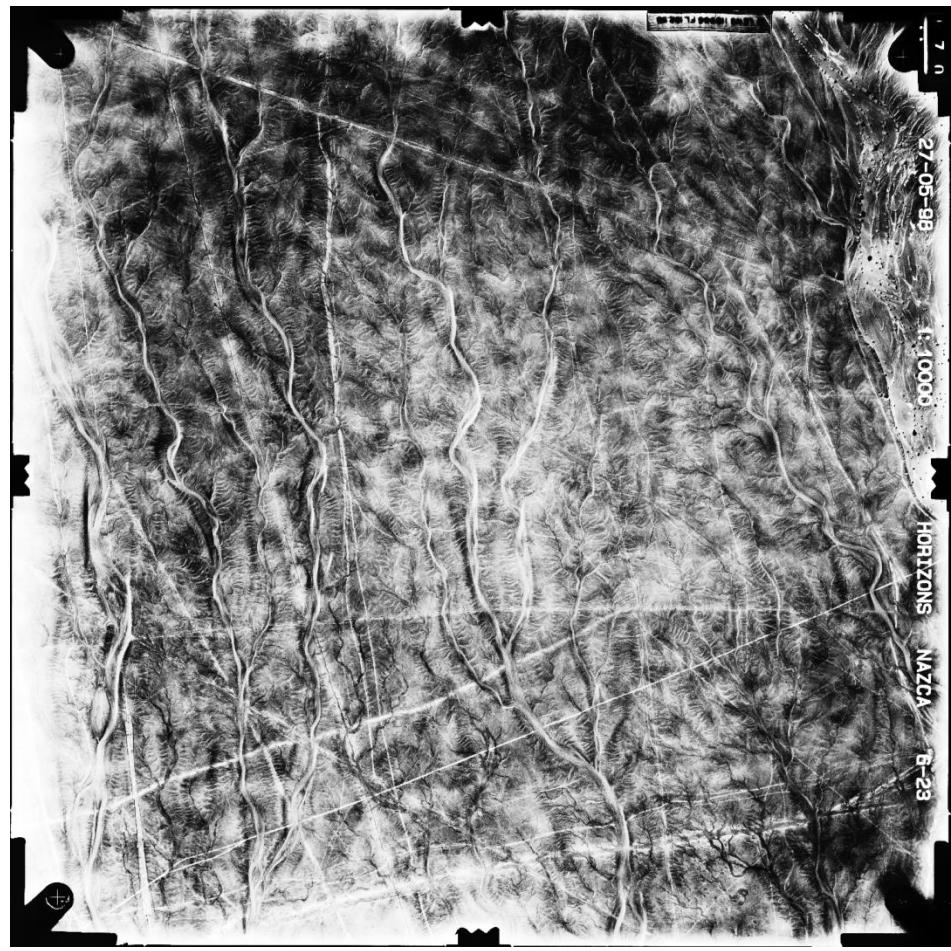
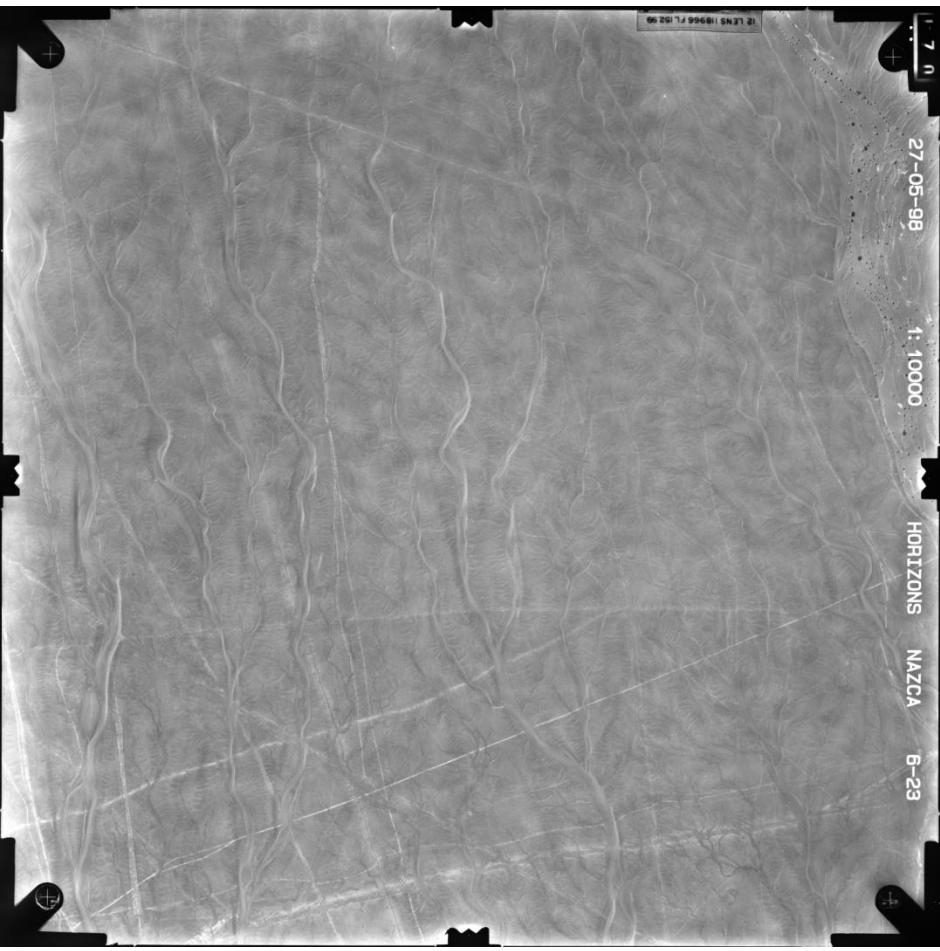
Spilling



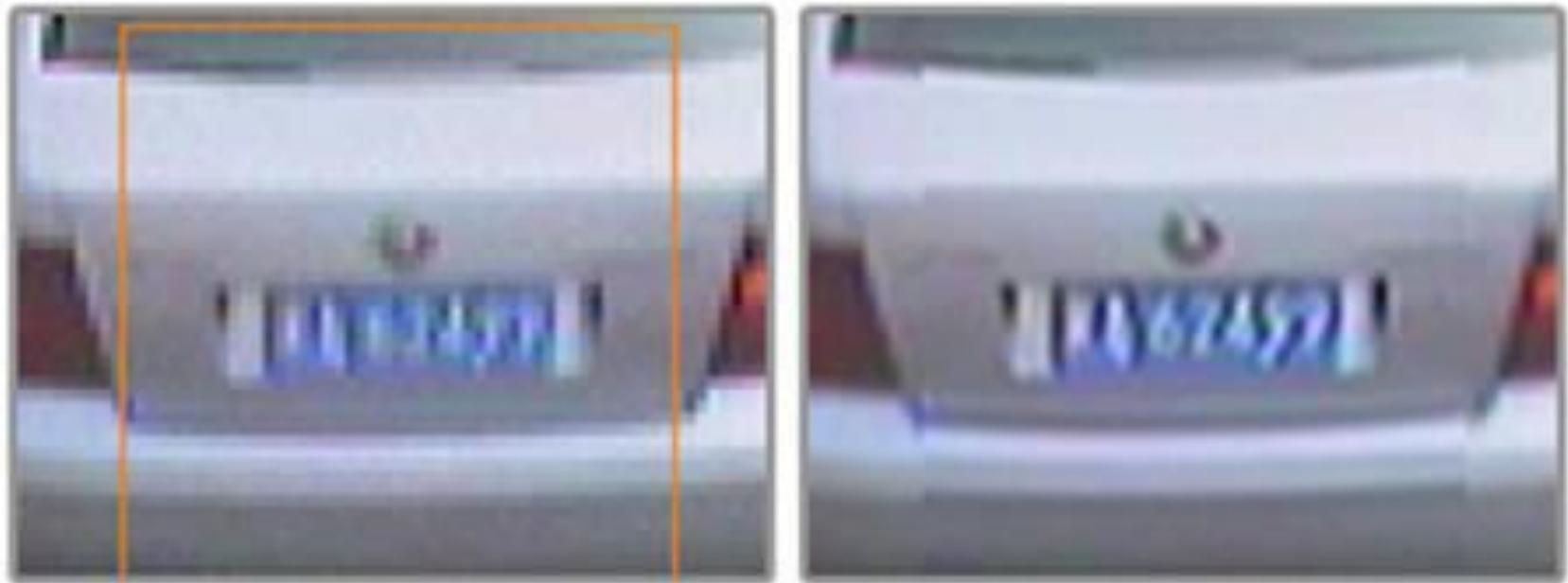
Scratches, Sensor noise



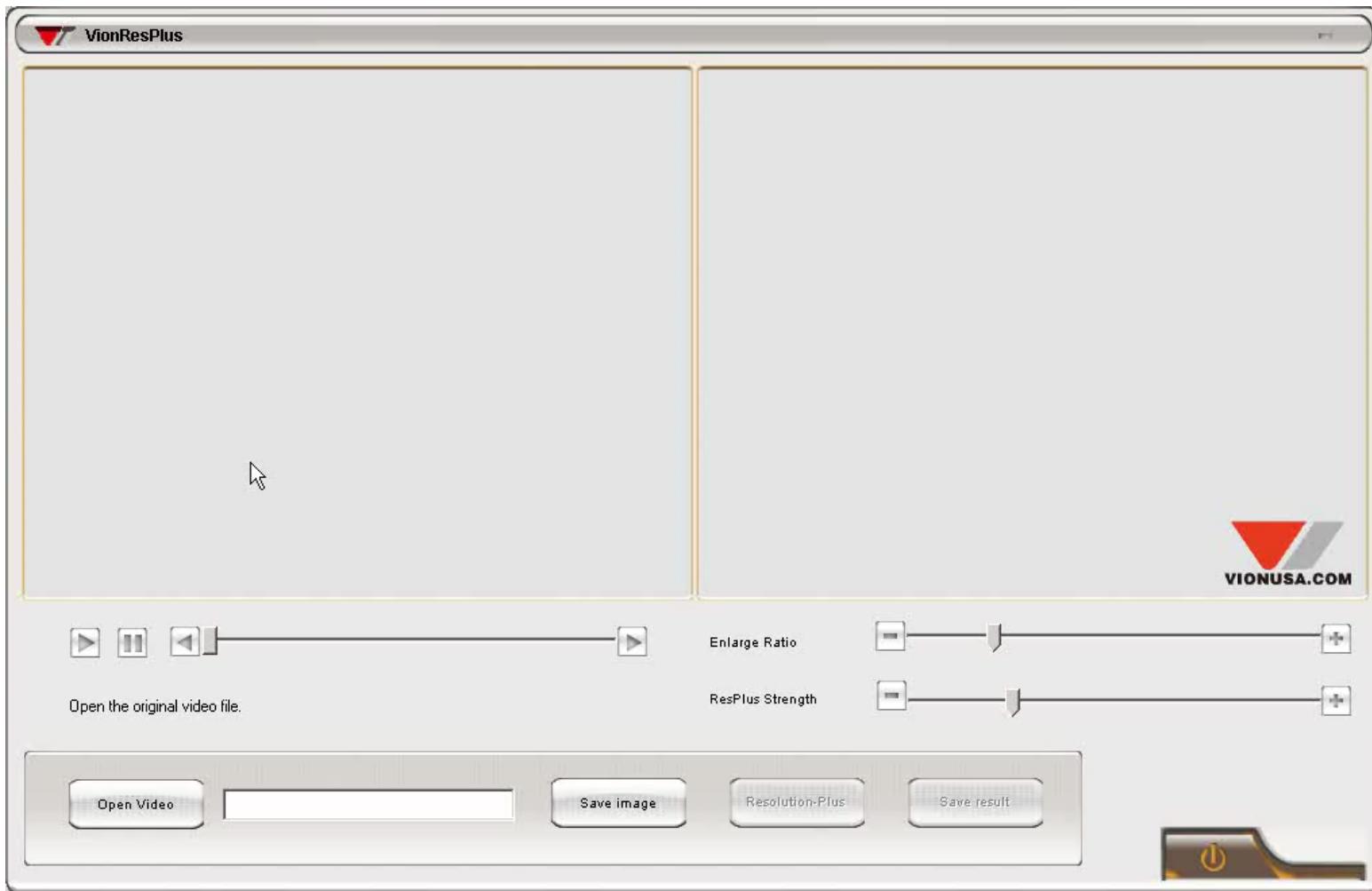
Bad contrast



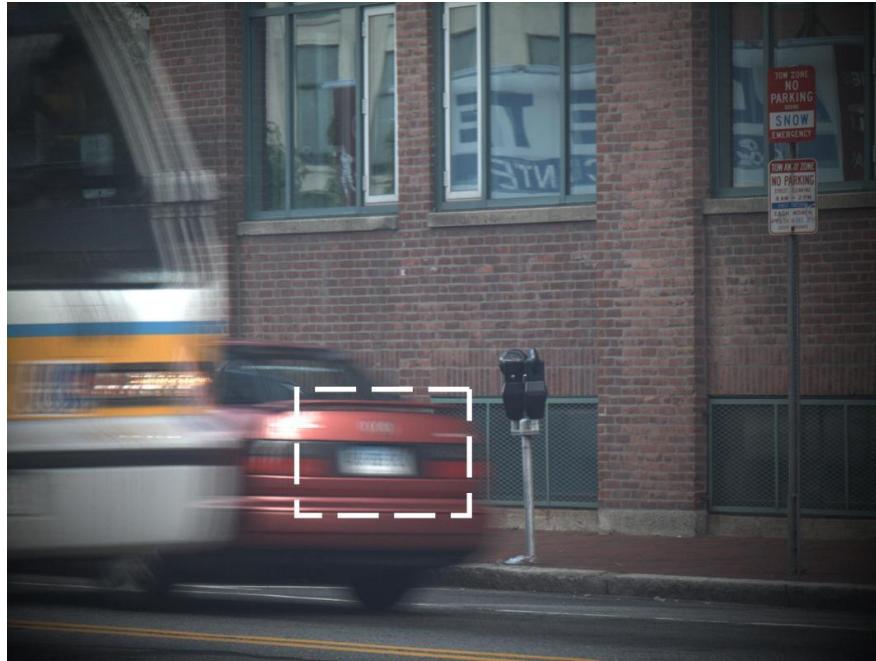
Resolution → Super resolution?



Super resolution



Removing motion blur



Original image



Cropped subwindow



After motion blur removal

[Images from Amit Agrawal]

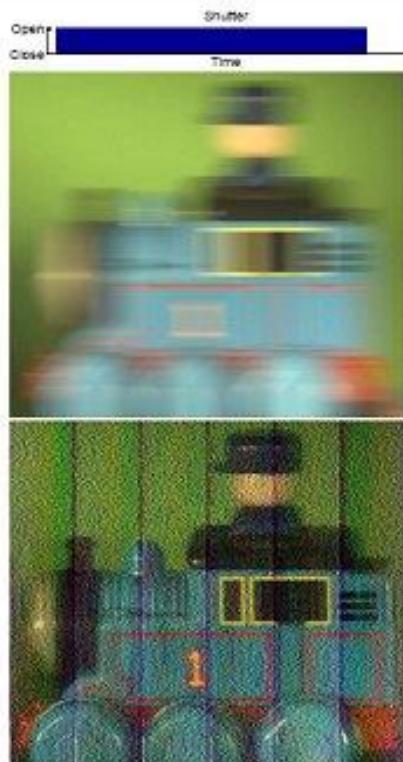
Removing motion blur

Coded Exposure Photography:
Assisting Motion Deblurring using Fluttered Shutter
Raskar, Agrawal, Tumblin (Siggraph2006)

Short Exposure



Traditional



← Shutter

← Captured Photos

← Deblurred Results

E
Image is dark
and noisy

Result has Banding
Artifacts and some spatial
frequencies are lost⁶⁹

Fluttered Shutter Camera

Raskar, Agrawal, Tumblin Siggraph2006



Ferroelectric shutter in front of the lens is turned opaque or transparent in a rapid binary sequence⁷⁰

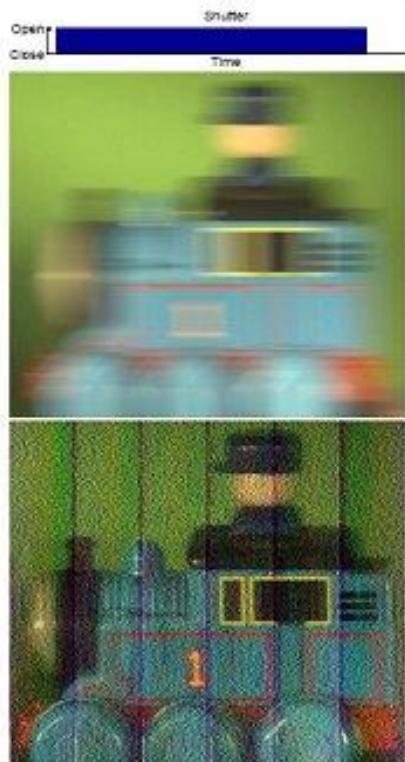
Removing motion blur

Coded Exposure Photography:
Assisting Motion Deblurring using Fluttered Shutter
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Short Exposure



Traditional



← Shutter

← Captured Photos

← Deblurred Results

E
Image is dark
and noisy

Result has Banding
Artifacts and some spatial
frequencies are lost⁷¹

Matlab is Your Friend

- Start matlab:
 - matlab or
 - /opt/matlab7/bin/matlab
- Download any simple image
- Load it into matlab:

```
>> I = imread('foo.jpg');
```

Unassessed Assignment

- Display the image in Matlab:

```
>> imshow(I);
```

- Print the image data array:

```
>> I
```

- Print the size of the image array and create a subimage:

```
>> size(I)
```

```
>> Isubwindow = I(72:92, 62:82);
```

```
>> imshow(Isubwindow);
```

Unassessed Assignment

- Start the Matlab help tool (Help menu).
- In the “Contents” pane to the left of the window. Click on MATLAB.
- Go through the “Getting Started” section.
- Continue to the “Using MATLAB” section when you have time.



What is an image?



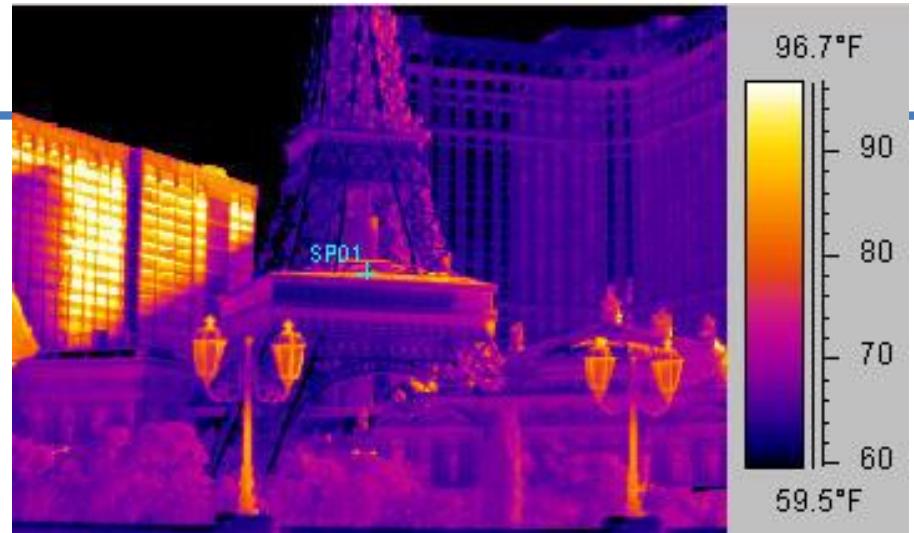
Image as 2D signal

- **Signal:** function depending on some variable with physical meaning
- **Image:** continuous function
 - 2 variables: xy - coordinates
 - 3 variables: xy + time (video)
- Brightness is usually the value of the function
- But can be other physical values too:
temperature, pressure, depth ...

Example 2D Images



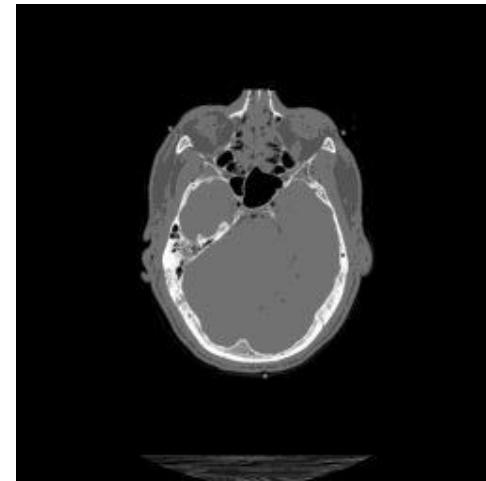
ultrasound



temperature (far IR)



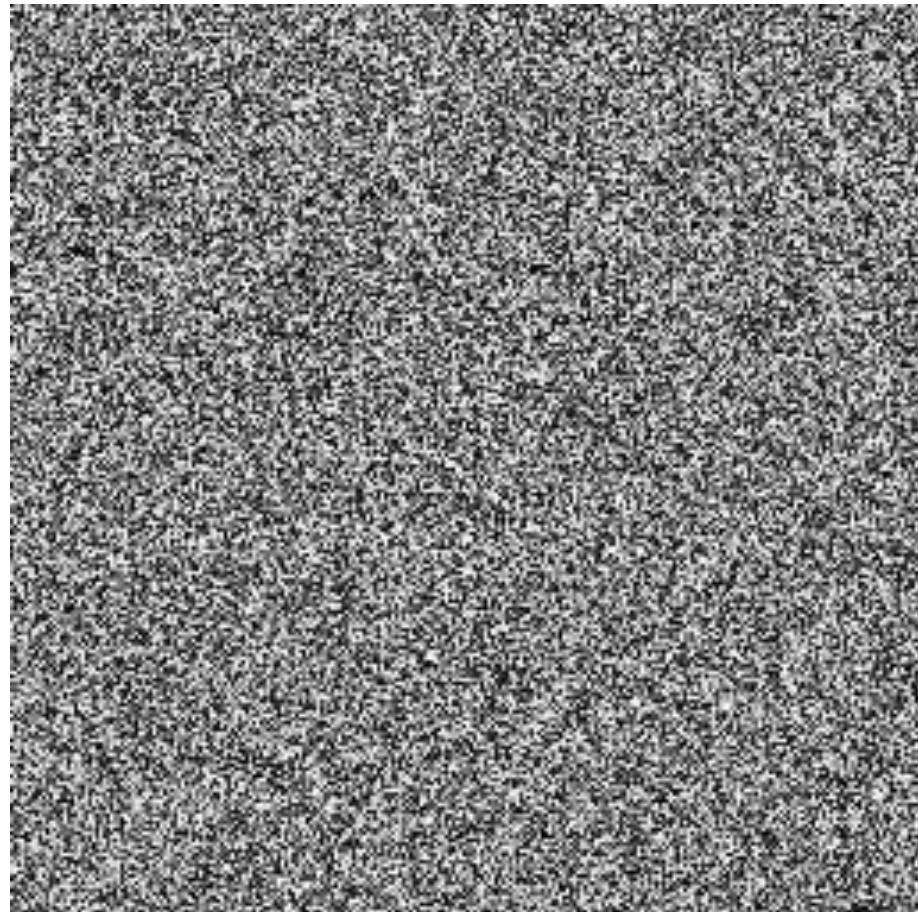
camera image



CT

Random Image

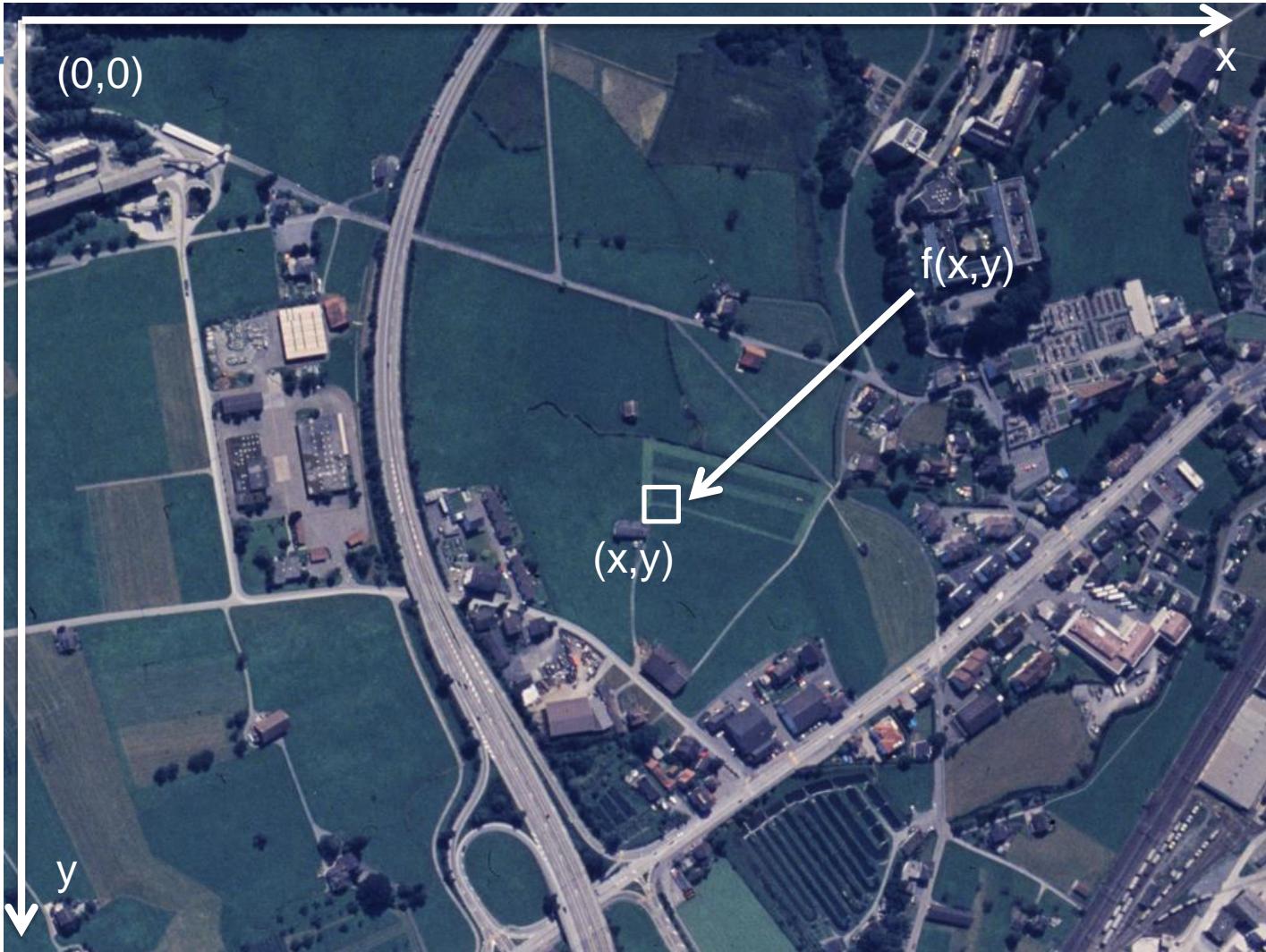
```
>> t=rand(256,256);  
>> imshow(t)
```



What is an image?

- A picture or pattern of a value varying in space and/or time.
- Representation of a function
- $f : \Re^n \rightarrow S$
- In digital form, eg:
- $I : \{1, \dots, X\} \times \{1, \dots, Y\} \rightarrow S$.
- For greyscale CCD images, $n = 2, S = \Re^+$.

What is a pix-el?



Not a little square!

- ***A Pixel Is Not A Little Square, A Pixel Is Not A Little Square, A Pixel Is Not A Little Square! (And a Voxel is Not a Little Cube),***
– Alvy Ray Smith,
MS Tech Memo 6, Jul 17, 1995

**A Pixel Is Not A Little Square,
A Pixel Is Not A Little Square,
A Pixel Is Not A Little Square!
(And a Voxel is Not a Little Cube)¹**

Technical Memo 6
Alvy Ray Smith
July 17, 1995

Abstract
My purpose here is to, once and for all, rid the world of the misconception that a pixel is a little geometric square. This is not a religious issue. This is an issue that strikes right at the root of correct image (sprite) computing and the ability to correctly integrate (converge) the discrete and the continuous. The little square model is simply incorrect. It harms. It gets in the way. If you find yourself thinking that a pixel is a little square, please read this paper. I will have succeeded if you at least understand that you are using the model and why it is permissible in your case to do so (is it?).

Everything I say about little squares and pixels in the 2D case applies equally well to little cubes and voxels in 3D. The generalization is straightforward, so I won't mention it from hereon².

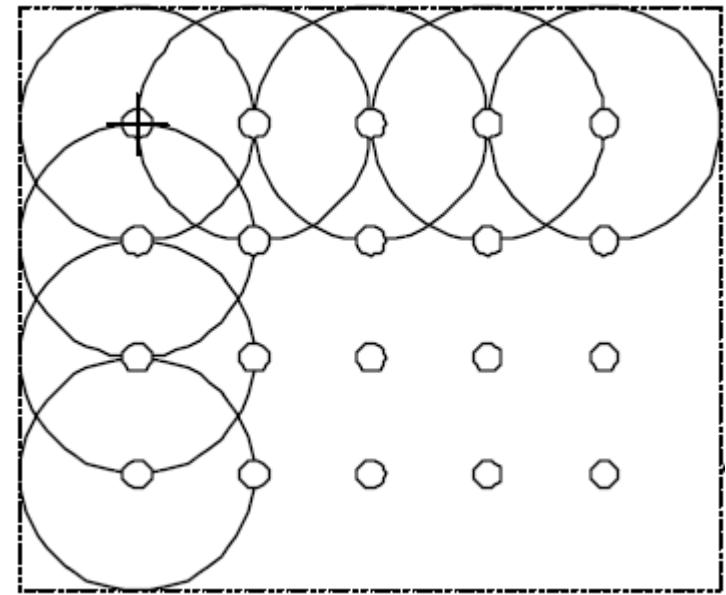
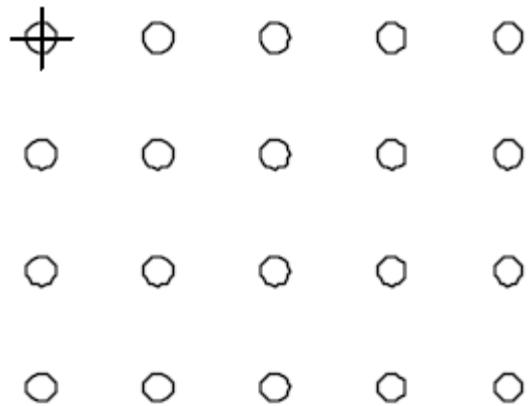
I discuss why the little square model continues to dominate our collective minds. I show why it is wrong in general. I show when it is appropriate to use a little square in the context of a pixel. I propose a discrete to continuous mapping—because this is where the problem arises—that always works and does not assume too much.

I presented some of this argument in Tech Memo 5 ([Smith95]) but have encountered a serious enough misuse of the little square model since I wrote that paper to make me believe a full frontal attack is necessary.

The Little Square Model
The little square model pretends to represent a pixel (picture element) as a geometric square³. Thus pixel (i, j) is assumed to correspond to the area of the plane bounded by the square $\{(x, y) \mid i-.5 \leq x \leq i+.5, j-.5 \leq y \leq j+.5\}$.

¹ Added November 11, 1996, after attending the Visible Human Project Conference '96 in Bethesda, MD.
² In general, a little rectangle, but I will normalize to the little square here. The little rectangle model is the same mistake.

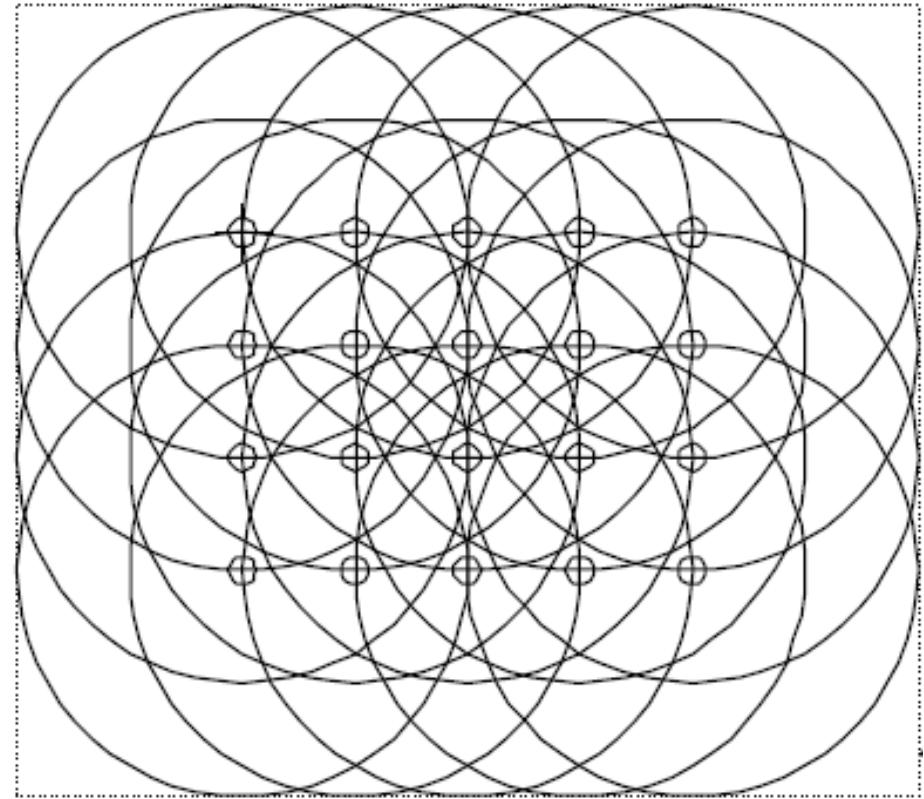
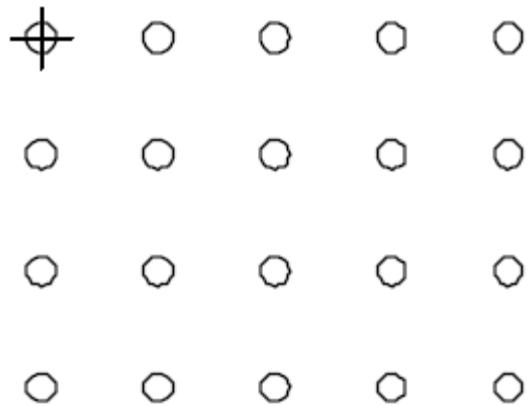
Not a little square!



Gaussian reconstruction filter

Illustrations: Smith, MS Tech Memo 6, Jul 17, 1995

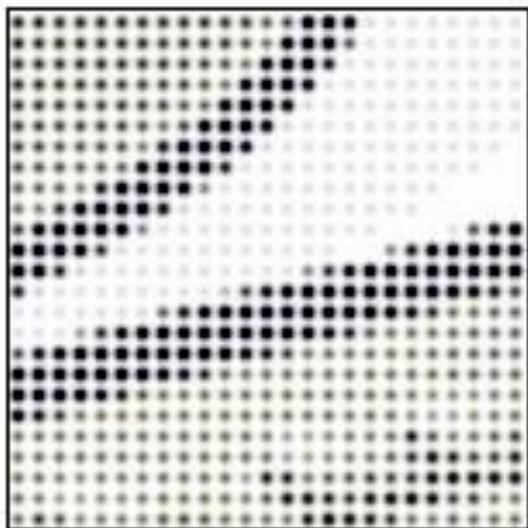
Not a little square!



Cubic reconstruction filter

Illustrations: Smith, MS Tech Memo 6, Jul 17, 1995

Not a little square!



Graphics: Dick Lyon, 2006

Where do images come from?

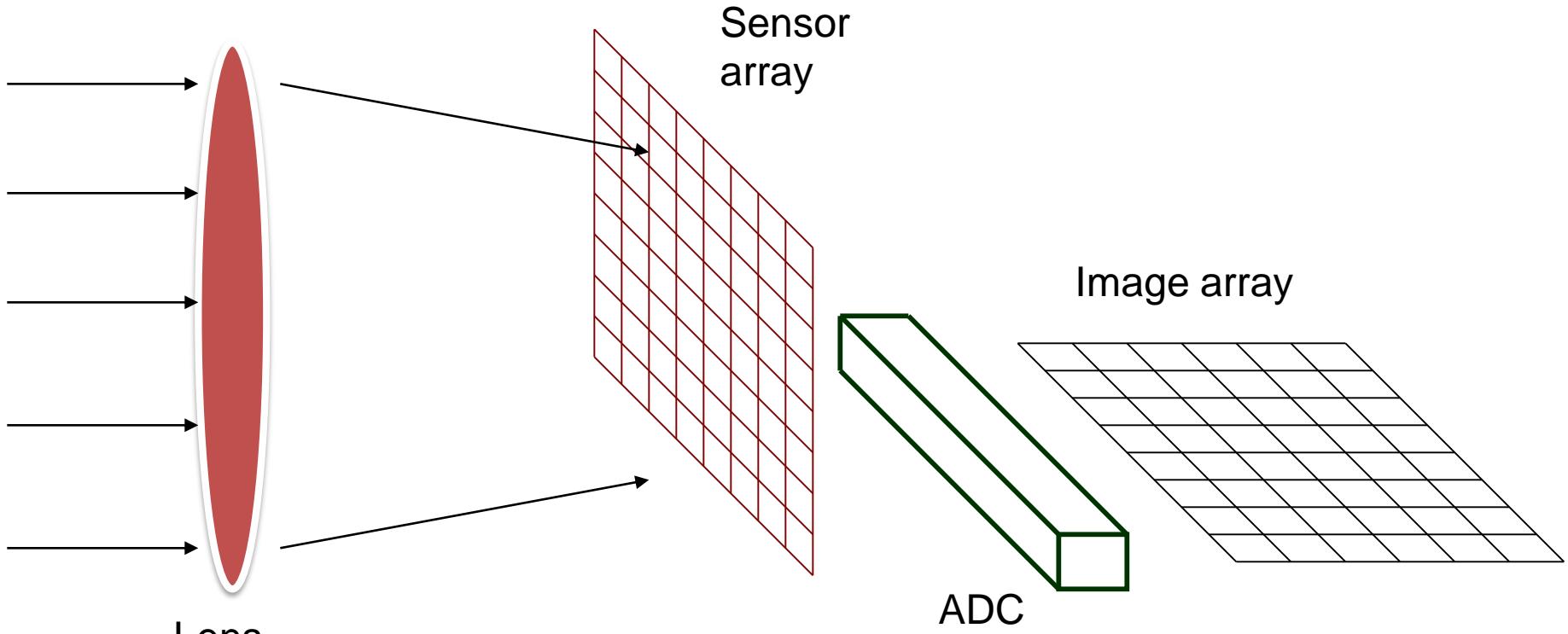
- Digital cameras
- MRI scanners
- Computer graphics packages
- Body scanners
- Laser range finders
- Many more...

Where do images come from?

- Digital cameras
- MRI scanners
- Computer graphics packages
- Body scanners
- Laser range finders
- Many more...

The digital camera

- A *Charge Coupled Device* (CCD).



Full-Frame CCD Architecture

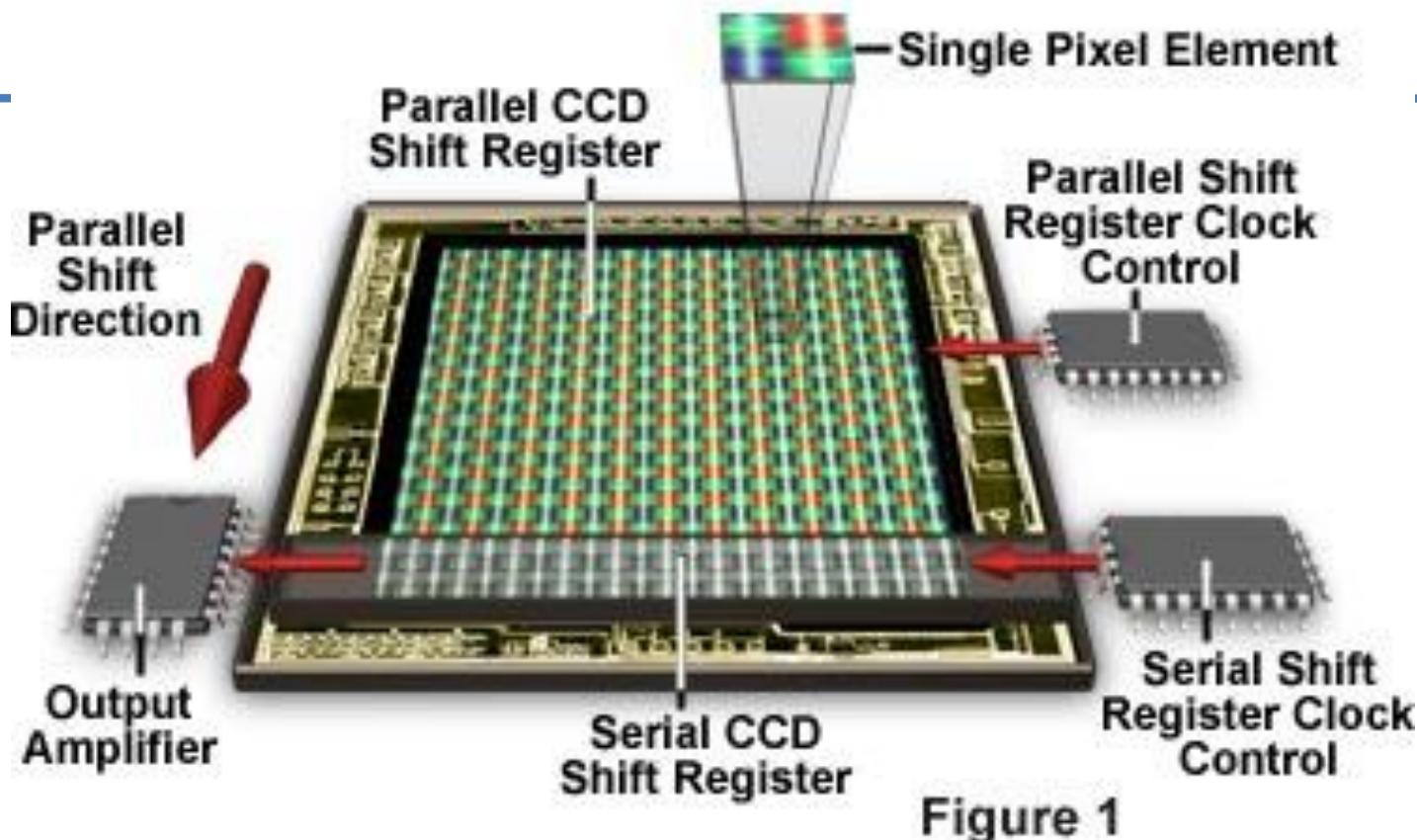
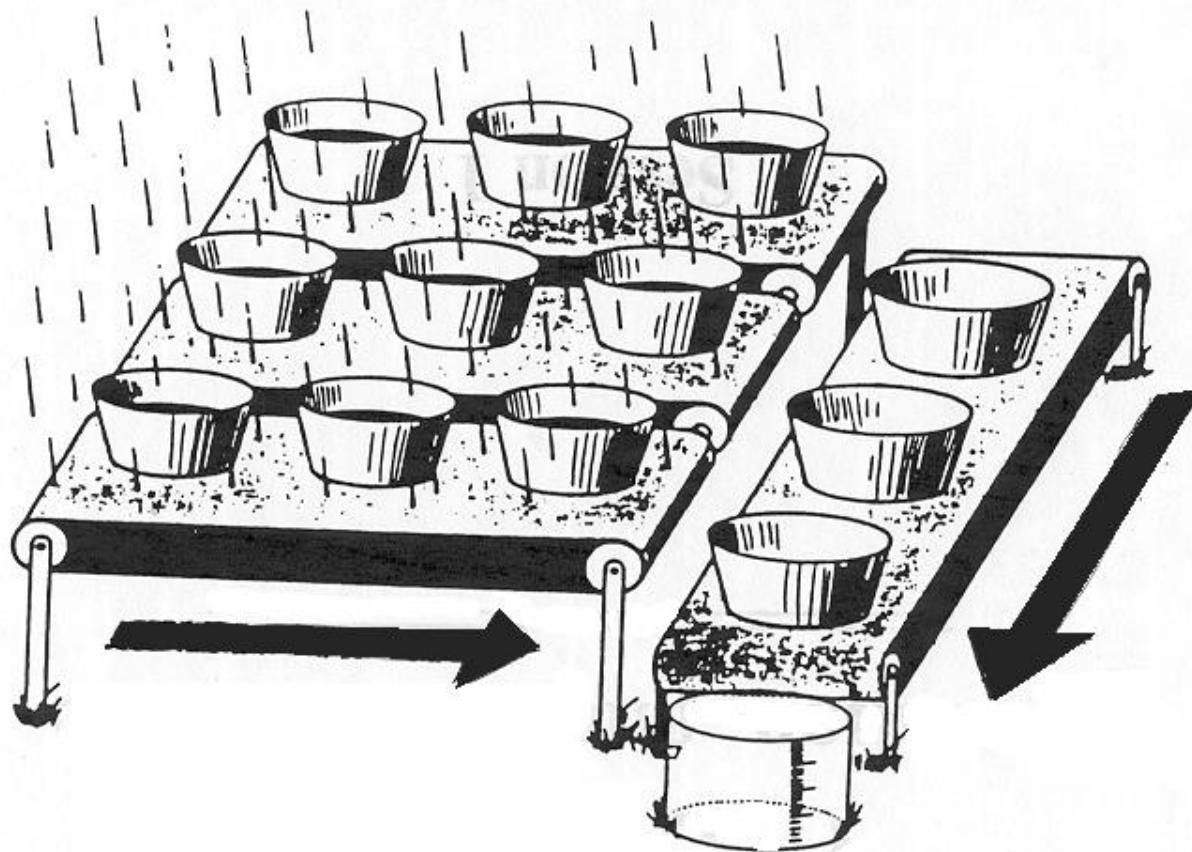


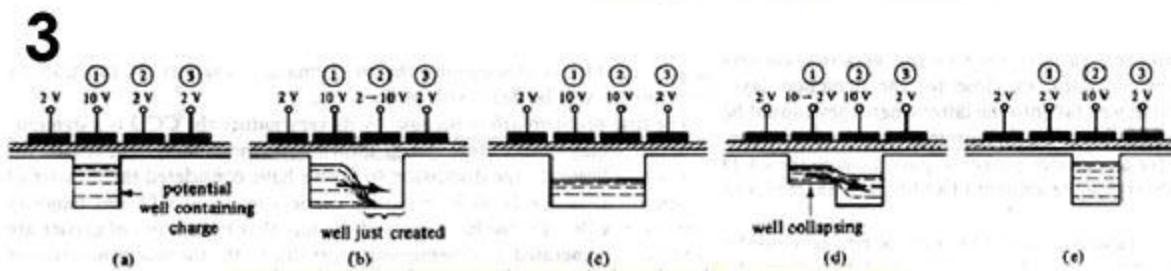
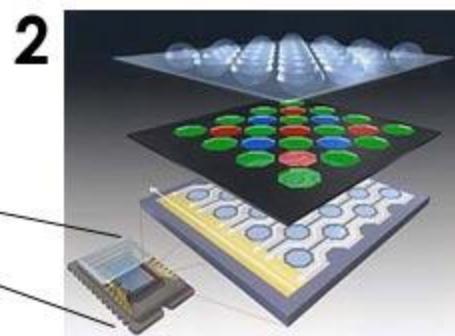
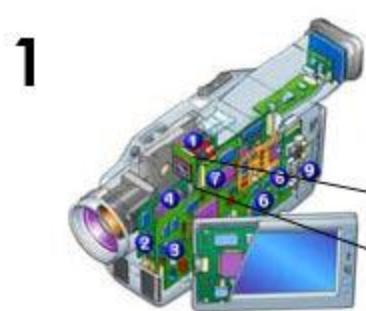
Figure 1

<http://www.astro.virginia.edu/class/oconnell/astr121/im/CCD-fullframearc-FSU.jpg>

Capturing photons



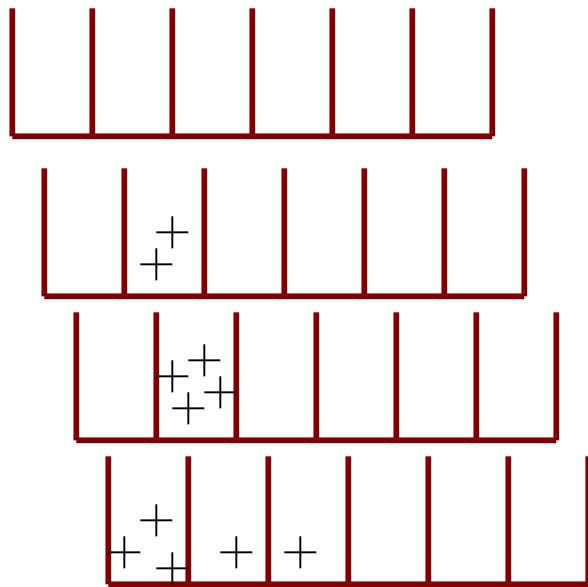
From: Lecture Notes – EAAE
and/or Science “Nuggets” 2000



<http://www.science.ca/images/scientists/s-boyle-infographic.jpg>

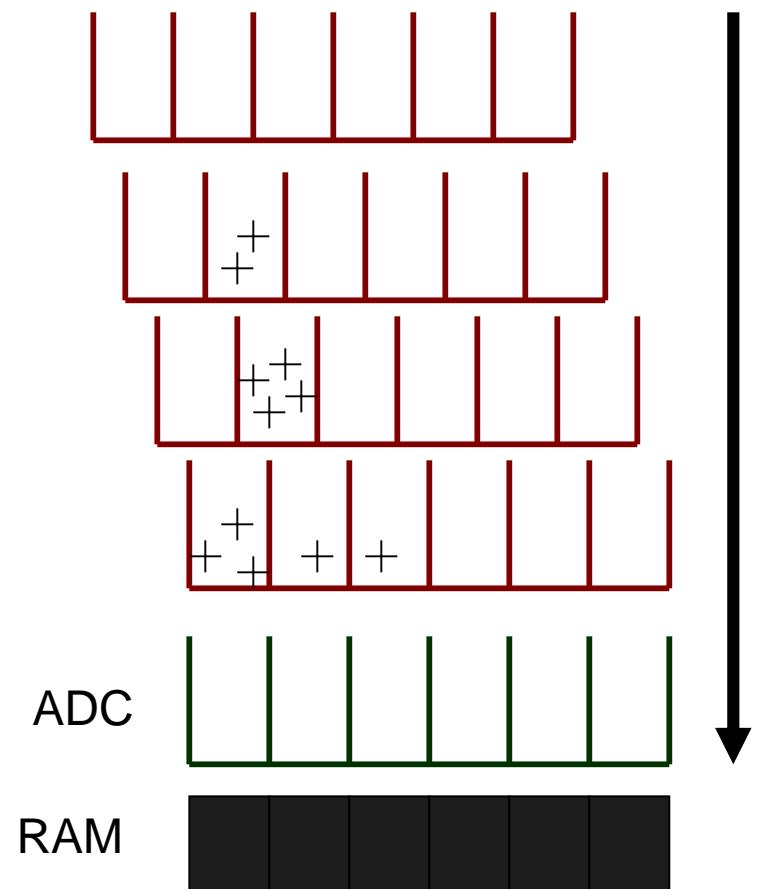
The sensor array

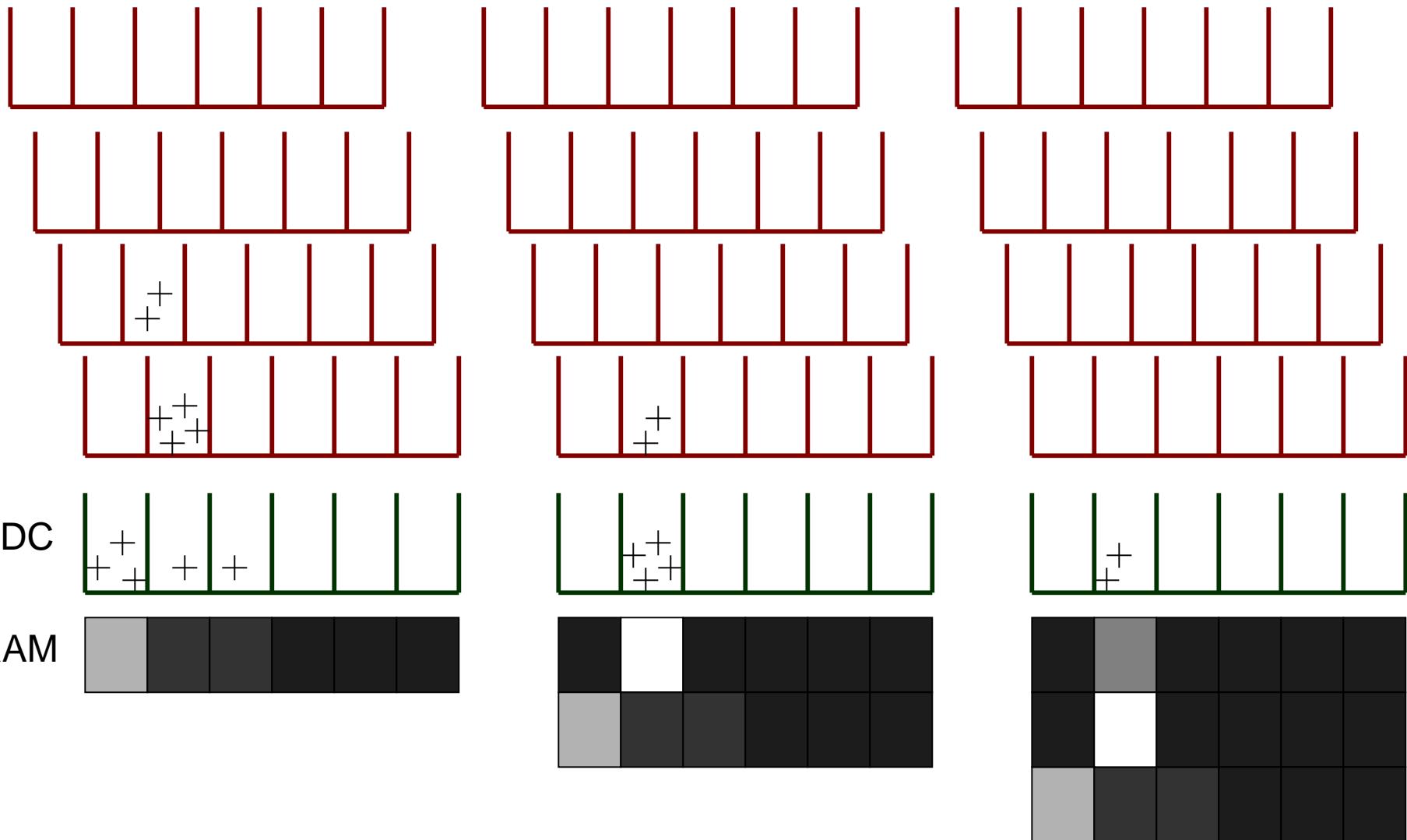
- Can be $< 1\text{cm}^2$.
- An array of *photosites*.
- Each photosite is a bucket of electrical charge.
- They contain charge proportional to the incident light intensity during exposure.



Analog to Digital Conversion

- The ADC measures the charge and digitizes the result.
- Conversion happens line by line.
- The charges in each photosite move down through the sensor array.



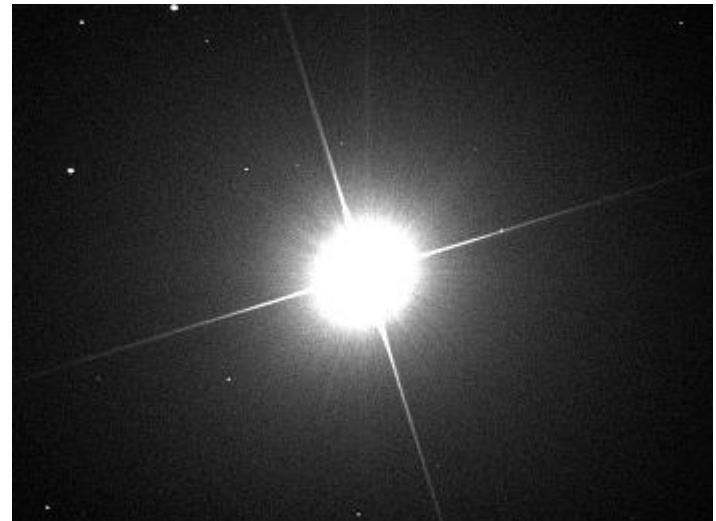
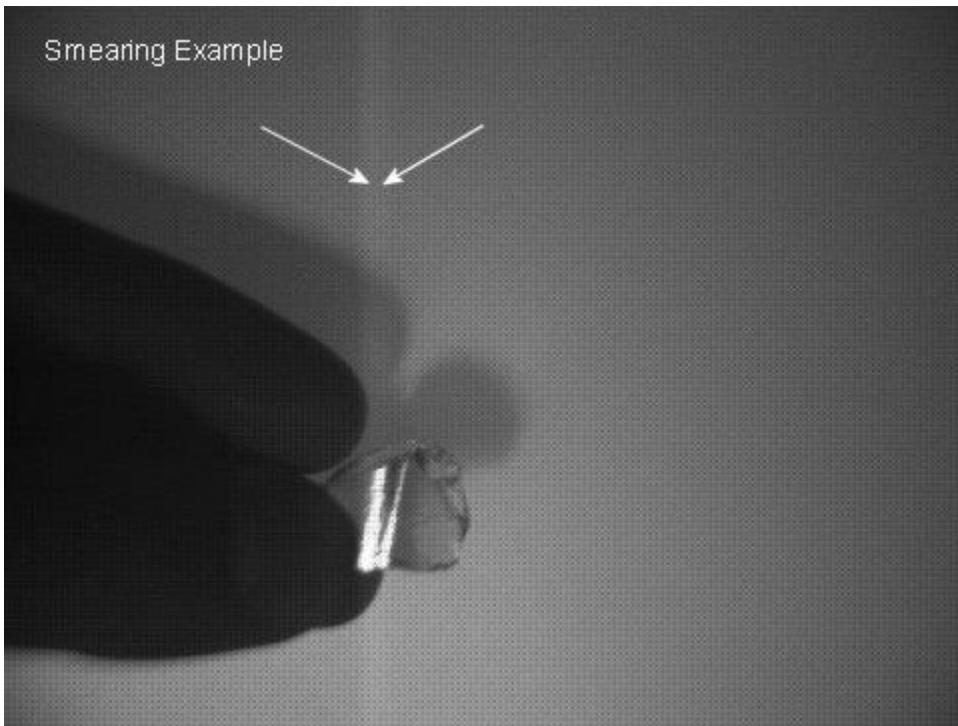


Blooming

- The buckets have finite capacity
- Photosite saturation causes blooming



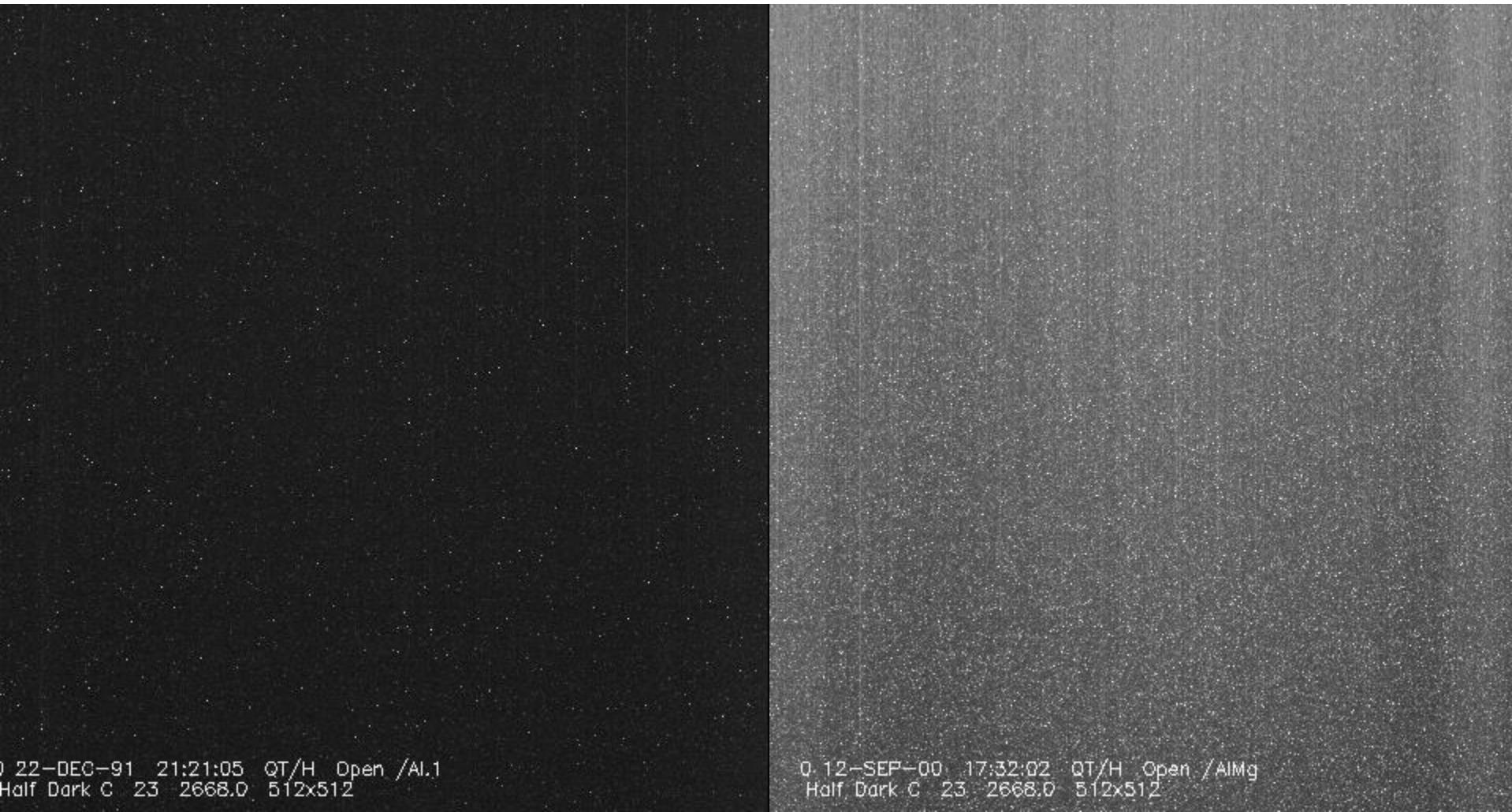
Bleeding or smearing



During transit buckets still accumulate some charges
Influenced by time ‘in transit’ versus integration time
Effect is worse for short shutter times (only problem with electronic shutter)

Dark Current

Yohkoh satellite, 9 years apart ..

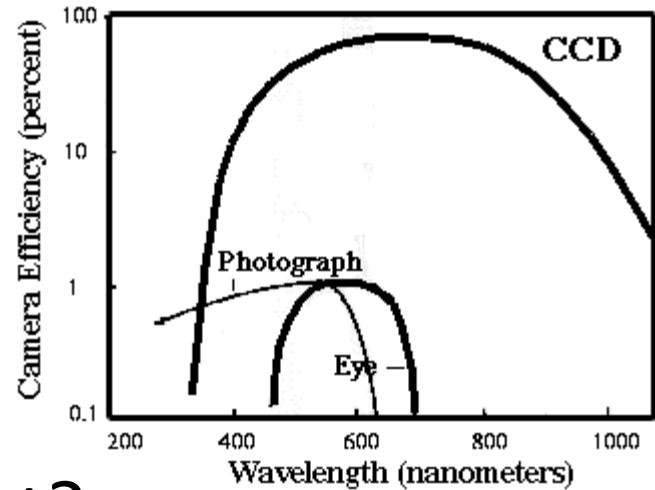


0 22-DEC-91 21:21:05 QT/H Open /AI.1
Half Dark C 23 2668.0 512x512

0 12-SEP-00 17:32:02 QT/H Open /AIMg
Half Dark C 23 2668.0 512x512

Dark Current

- CCDs produce thermally-generated charge.
 - They give non-zero output even in darkness.
 - Partly, this is the *dark current*.
 - Fluctuates randomly.
-
- How can we reduce dark current?



From: Lecture Notes - EAAE

CMOS

Same sensor elements as CCD

Each photo sensor has its own amplifier

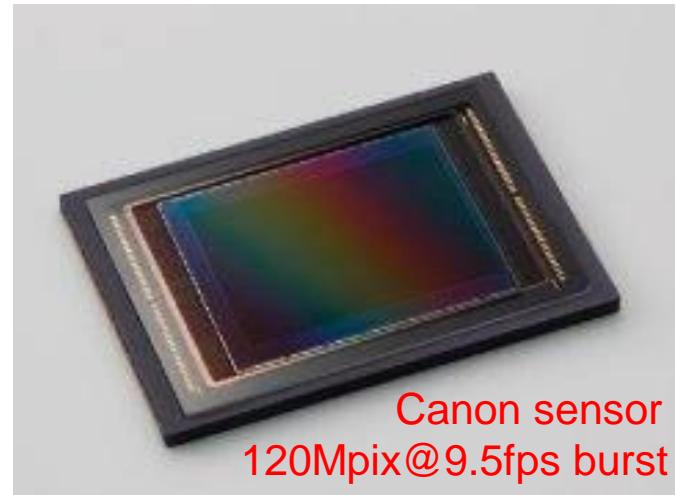
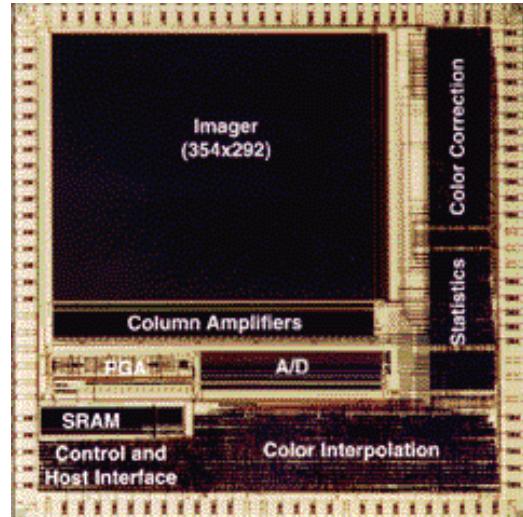
- More noise (reduced by subtracting ‘black’ image)

- Lower sensitivity (lower fill rate)

Uses standard CMOS technology

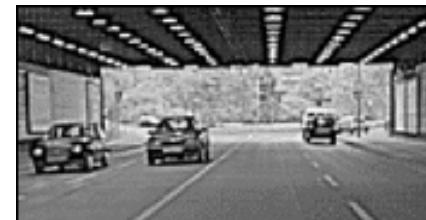
- Allows to put other components on chip

- ‘Smart’ pixels



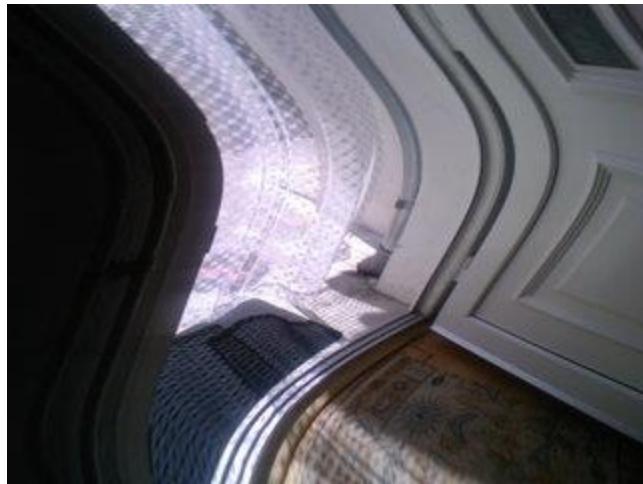
CCD vs. CMOS

- Mature technology
- Specific technology
- High production cost
- High power consumption
- Higher fill rate
- Blooming
- Sequential readout
- Recent technology
- Standard IC technology
- Cheap
- Low power
- Less sensitive
- Per pixel amplification
- Random pixel access
- Smart pixels
- On chip integration with other components

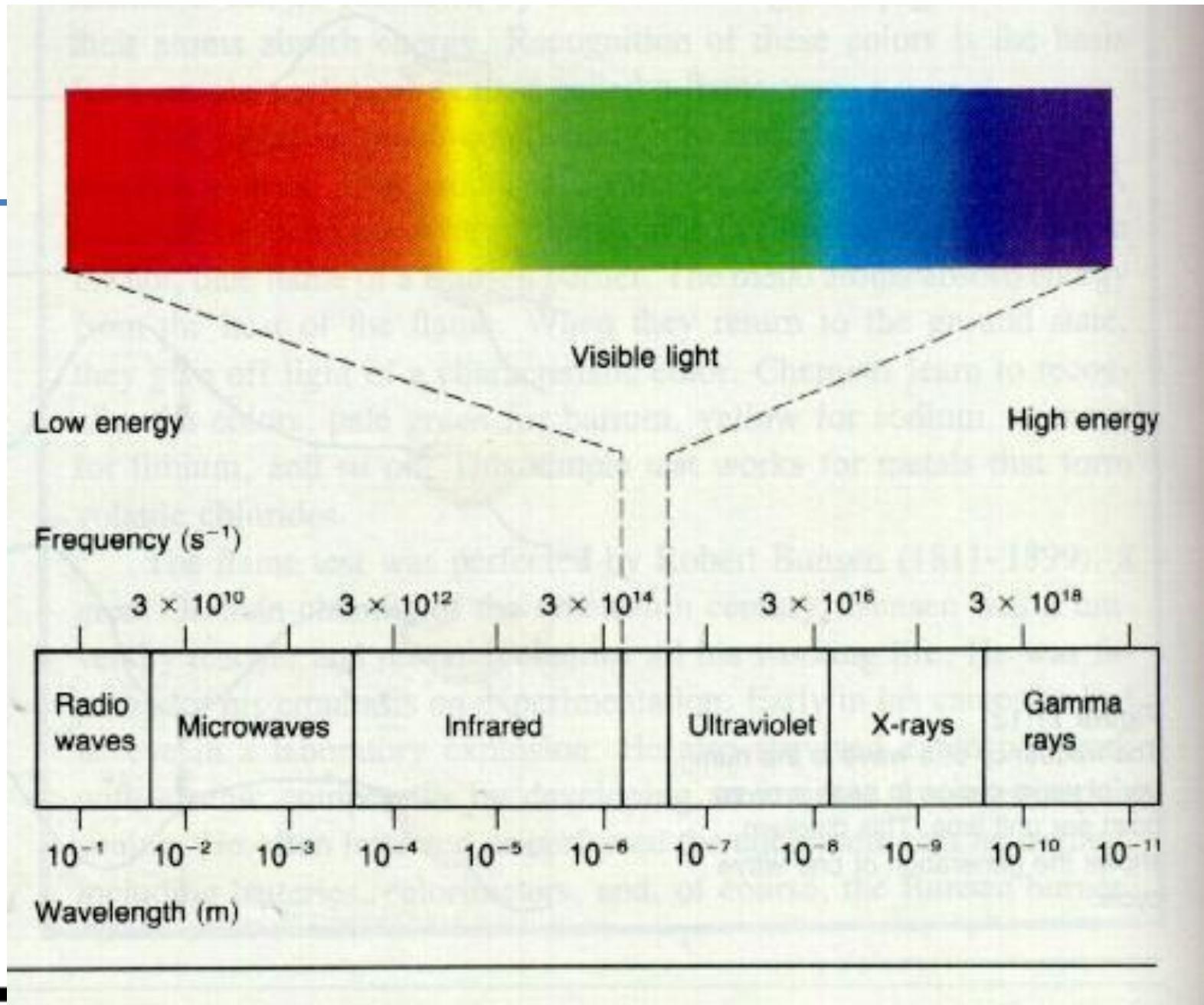


CMOS video sensor issues

- Rolling shutter
 - Sequential read-out of lines



[video](#)



-
- Color sensing from Computational Photography?

... and much more
see you Thursday!