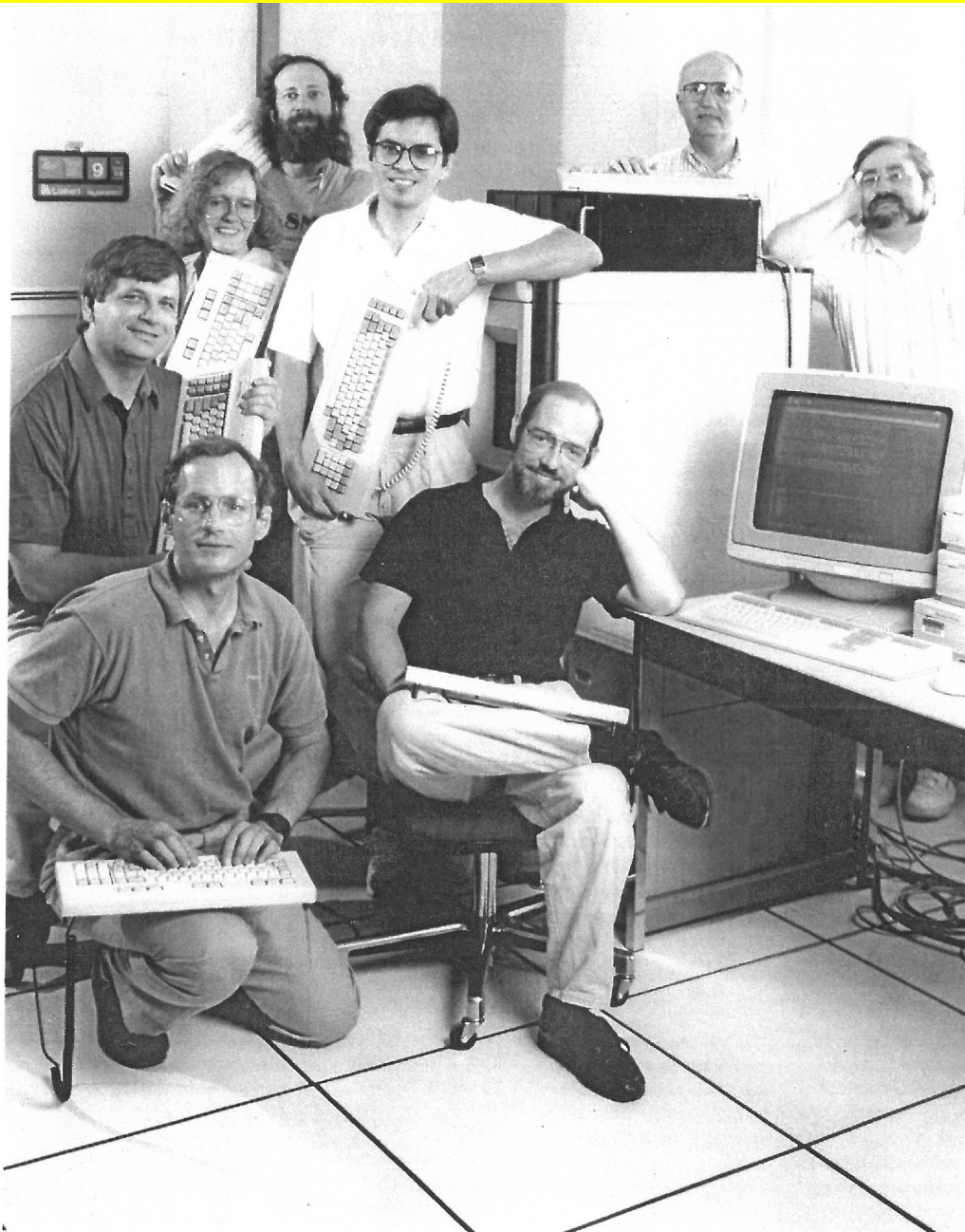


# Cameras As Computational Devices

Prof. Hank Dietz

*CSU, April 8, 2013*

University of Kentucky  
Electrical & Computer Engineering

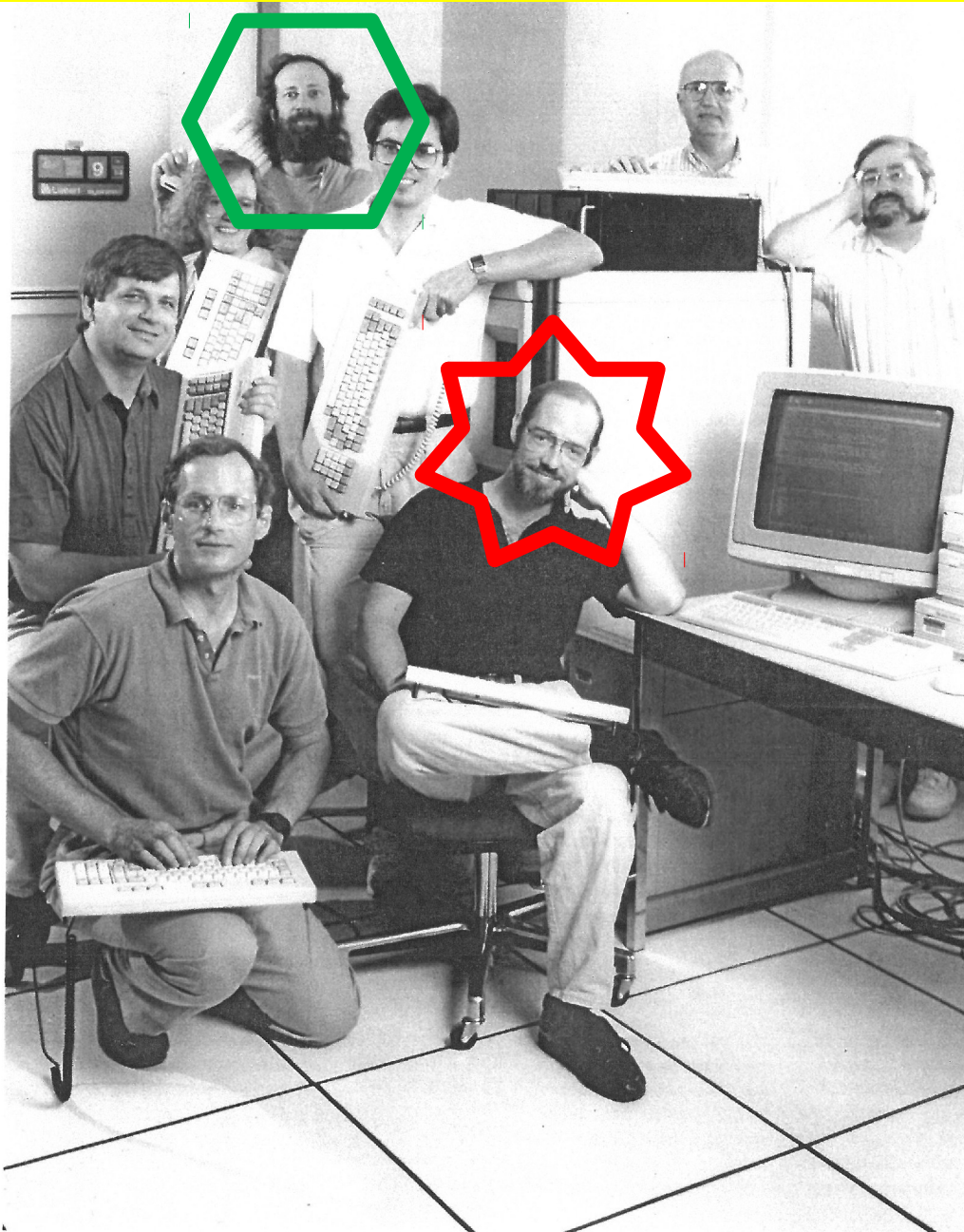


*The acquisition of the MasPar MP-1 started with a human form of "parallel processing" with eight professors cooperating in the preparation of the funding p to the National Science Foundation. Front: Professors Jan Allebach (kneeling), Henry Dietz (seated); from left: Jeff Gray, Leab Jamieson, H.J. Siegel, Jose For, Dave Landgrebe and Ed Delp.*

## **PURDUE STUDENTS FIRST IN U.S. TO HAVE ACCESS TO FULLY CONFIGURED MASPAR MP-1**

Purdue is the first American university to make available to its faculty and students the computing capability of a fully-configured MasPar MP-1 with 16,384 processing units.

The other specifications for this single-instruction stream—multiple-data streams (SIMD) computer are equally impressive. Each of the 16,384 PE's has a 4-bit ALU, hardware support for floating point operations, 48 32-bit registers, and



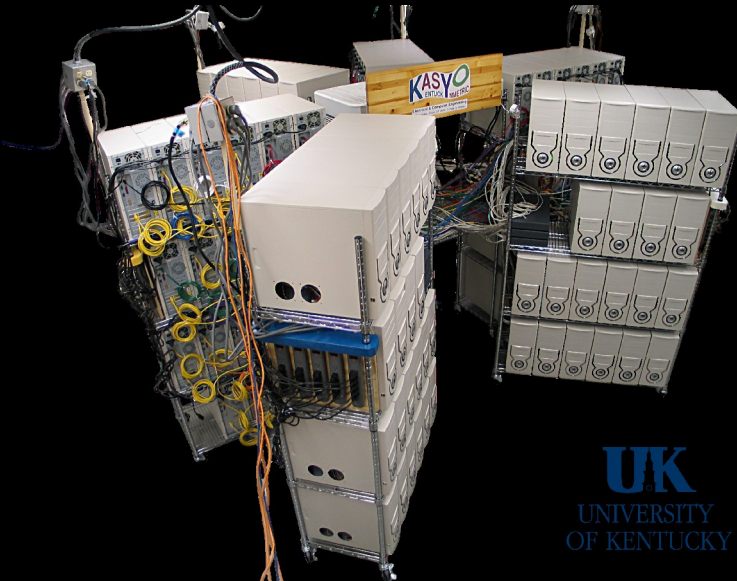
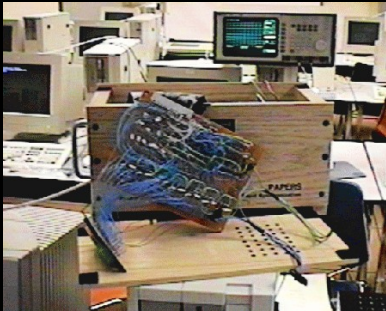
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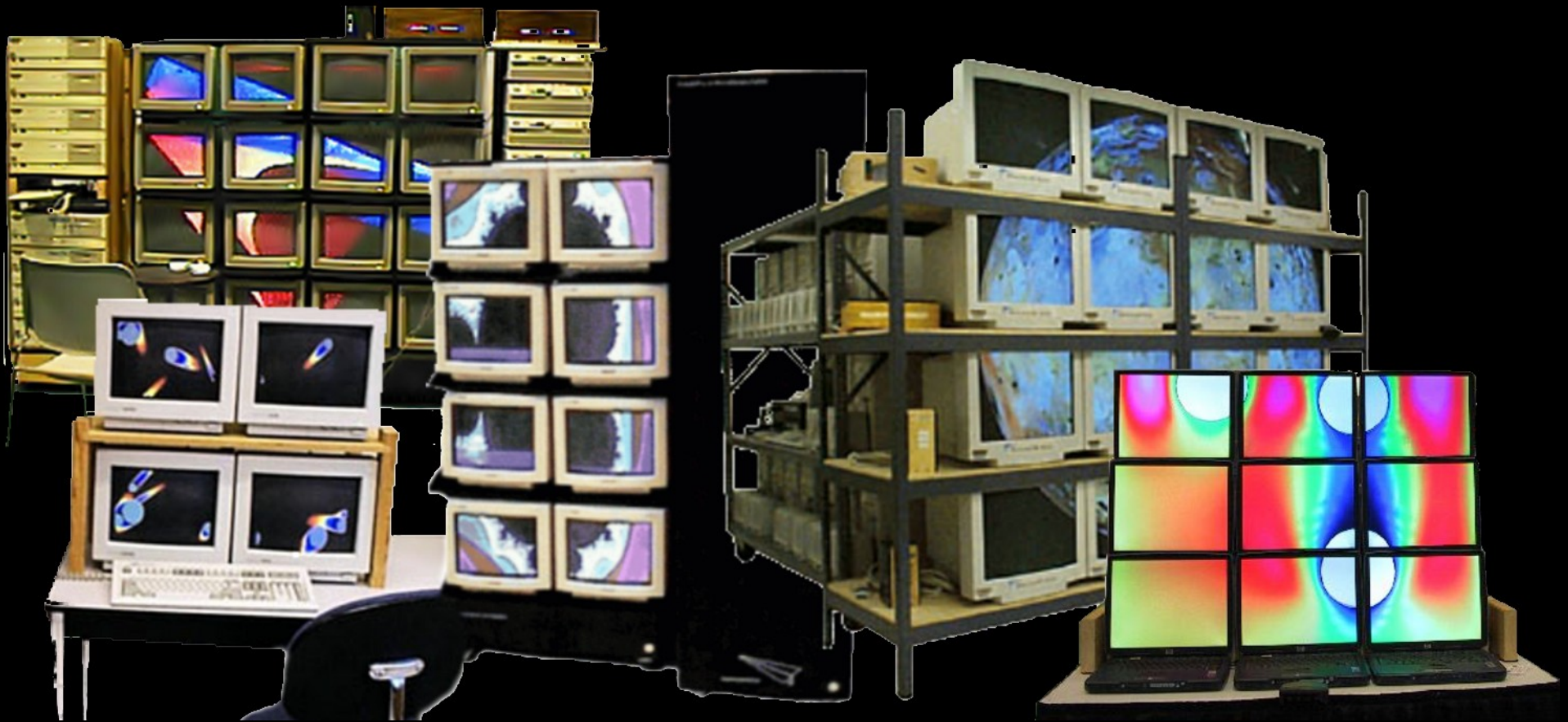
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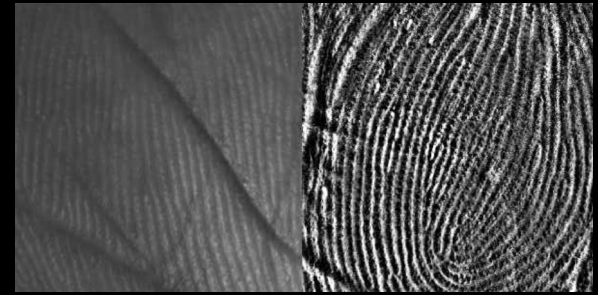
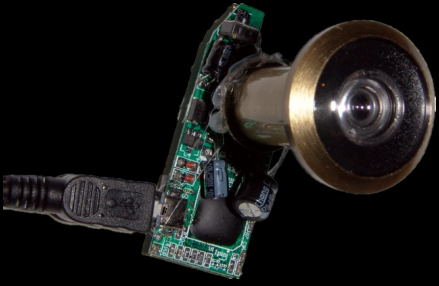
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# My Best-Known Toys



# Some Of My Other Toys

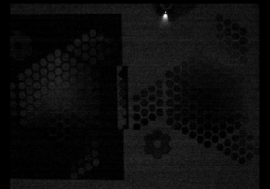
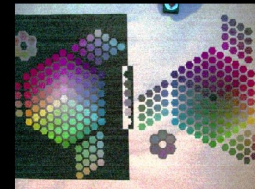
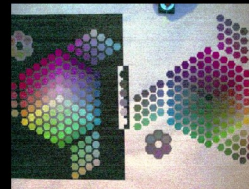




Normal processing

RGB extraction

IR extraction



# My Background

- I am a **computer engineer / systems guy**  
**And...**
- In 1970s, **photo editor** of various school pubs  
and a **published professional photographer**
- Digital halftoning (of X-ray images) in 1984-5
- High-quality & computer-controlled digital  
imaging, e.g., for 30MP video wall in 1996
- Computational photography since 1999...

# Computational Photography

Cameras as computing systems;  
using computation to enhance camera abilities  
and / or to process the data captured.

- New camera / sensor / processing models
- Intelligent computer control of capture
- Detection / manipulation of image properties



# Canon Hack Development Kit (CHDK)



Enables running arbitrary C code in a Canon PowerShot with full access to camera

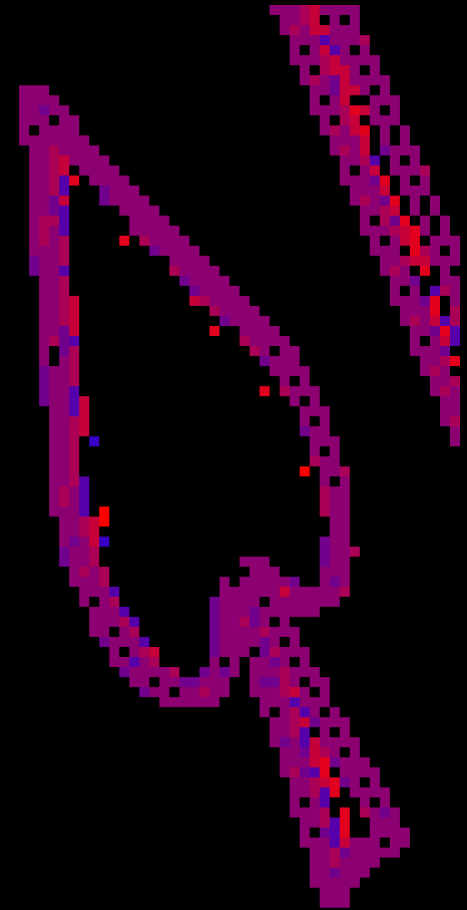
# Spring 2009, EE499

- Jennifer Danhauer, Joe Lanford, Ross Levine project to **capture a depthmap inside a Canon PowerShot using depth-from-focus**
- CHDK scripting so a single press captures a sequence with different focus distances
- CHDK processing modified with custom C code to measure blur & combine images
- Blur measurement was fairly state-of-the-art



# How Good Is The Depthmap?

- Accurate depths at edges
- No depth in featureless fields
- Wrong depths near edges!
- Wrong by a lot
- Wrong both directions
- Seems to “echo” edges...

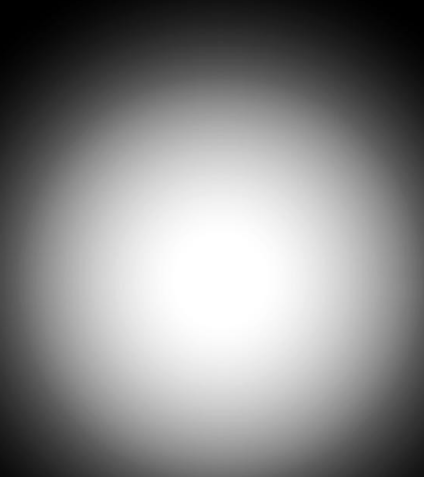


# Point Spread Function (PSF)

- Describes the response of an imaging system to a point source (**impulse response**)
- PSF is the spatial domain representation of the **modulation transfer function (MTF)**
- An image is essentially the sum of the PSFs of all points of light in the scene
- What does a typical **out-of-focus (OOF)** PSF look like?

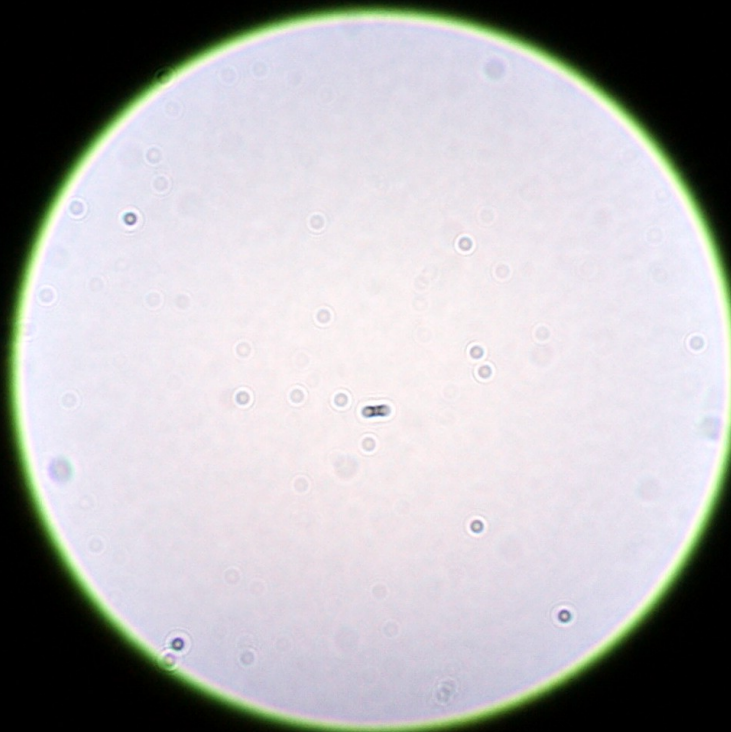
# What Went Wrong?

- Most image processing algorithms model OOF PSF as **Gaussian blur**:

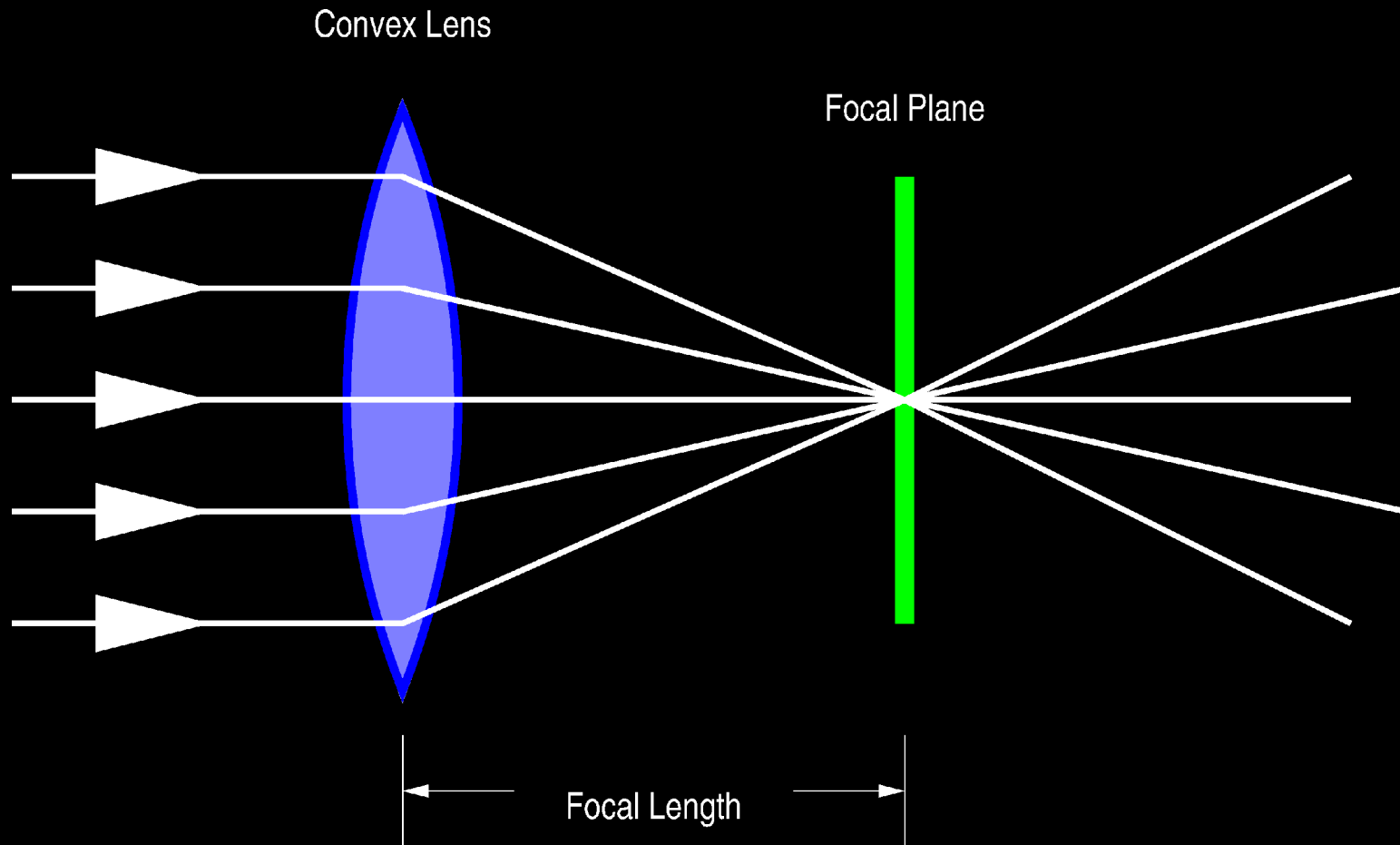


# Out-Of-Focus Isn't Blurry!

- OOF PSF typically has a **sharp edge!**

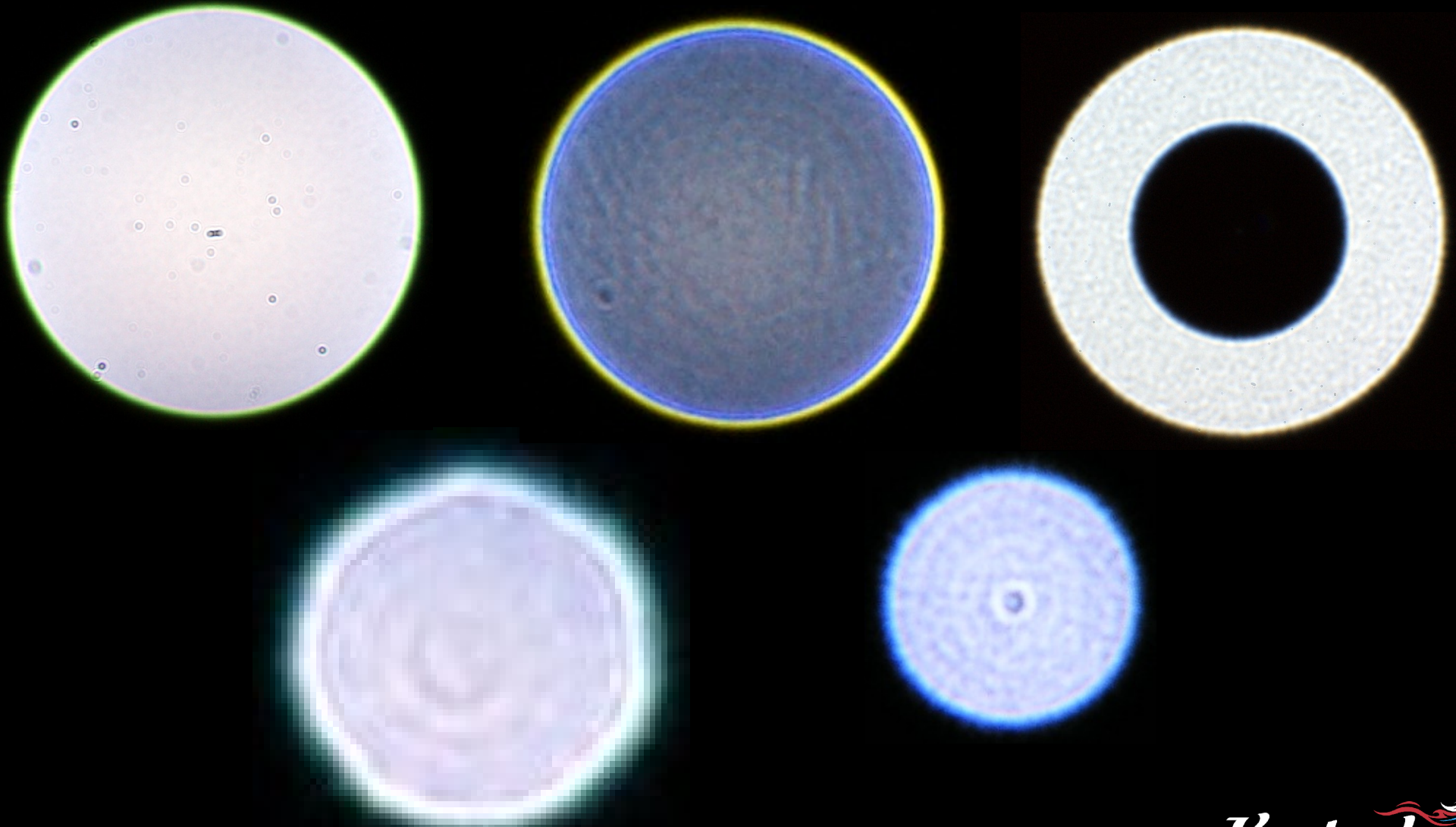


# Why The Sharp Edge?





# Measured OOF PSFs



**Enough science! Let's do some engineering!**

**A sneaky way to make OOF PSFs  
Look like people think they do.**

# Dynamic Bokeh Apodization



- **Bokeh** is the collective effect of OOF PSF
- Approximate Gaussian blur by dynamically changing the aperture size using CHDK

**Ok. I feel better now. Some more science...**

# Apertures For Soft Focus

Imagon & Fujinon “Sink Strainer” apertures



(photos from [mflenses.com](http://mflenses.com) and [m42.org](http://m42.org))

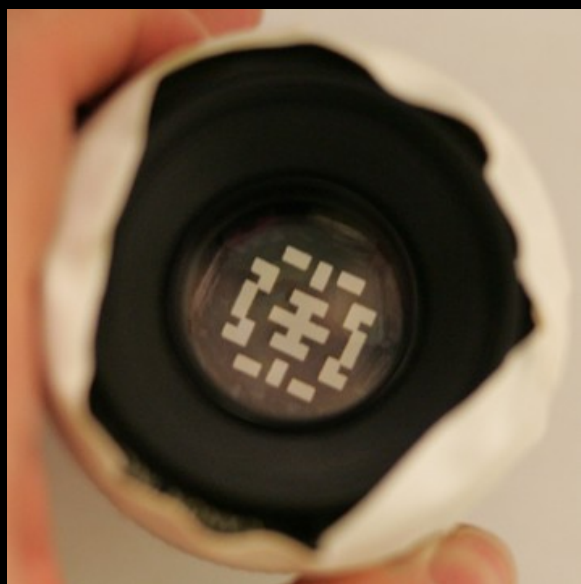
# Apertures For Bokeh Effects

E.g., from [bokehmasterskit.com](http://bokehmasterskit.com)



# Coded To Ease Recognition

(images from MIT CSAIL)



# Coded Aperture Issues

- No need to put aperture inside the lens...
- Recognize PSF by **deconvolution**, but...
  - Aperture corners cause diffraction
  - OOF PSFs don't actually convolve!

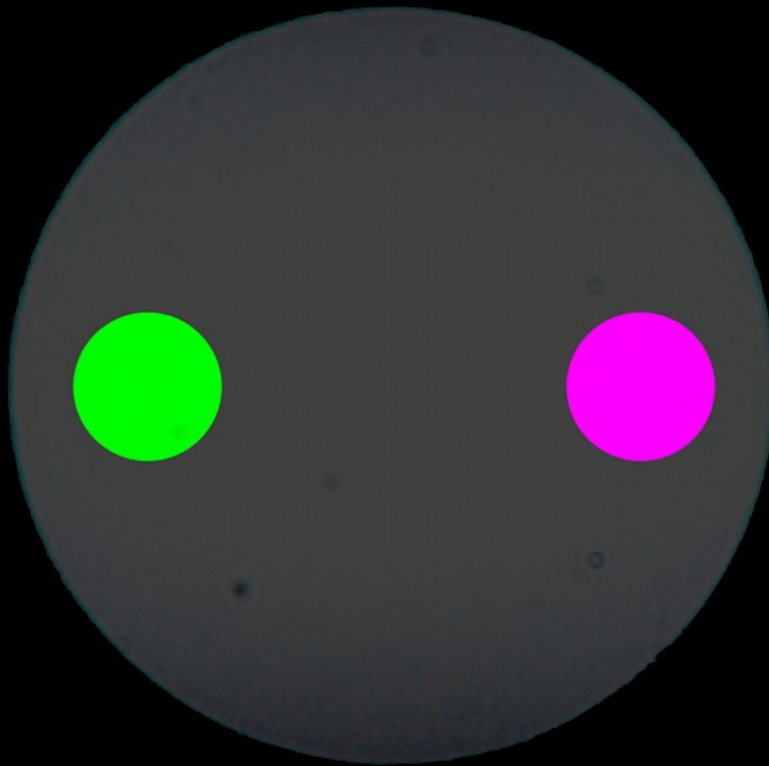




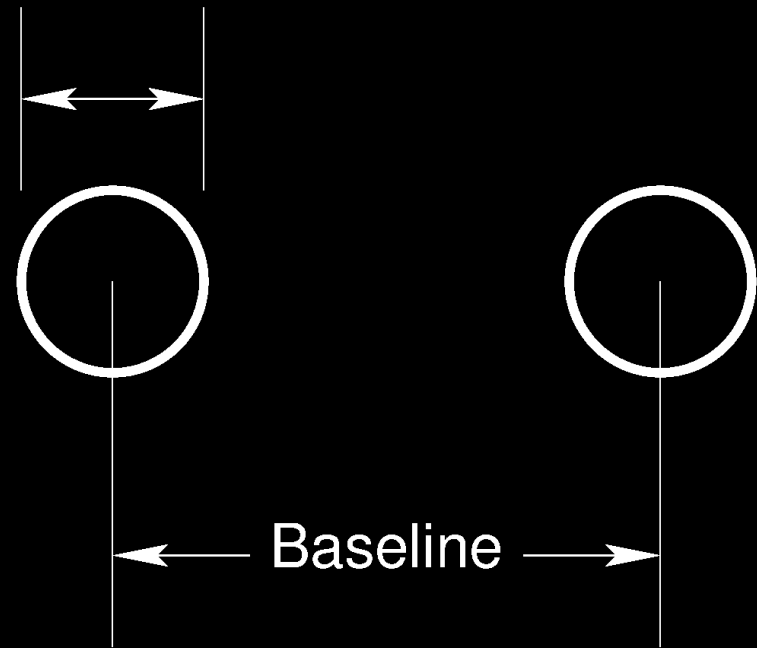
# Why Not Color-Code Aperture?

- Color code views through left and right sides of the lens... to directly capture an **anaglyph**
- Stereo view with glasses (**even live view**)
- Computationally extracting the views allows:
  - Full color stereo pairs
  - After-the-fact refocus, depth capture, etc.
- Design for reprocessing, e.g., **green/magenta**  
Instead of **red/cyan**

# Anaglyph Capture Aperture



Effective Aperture











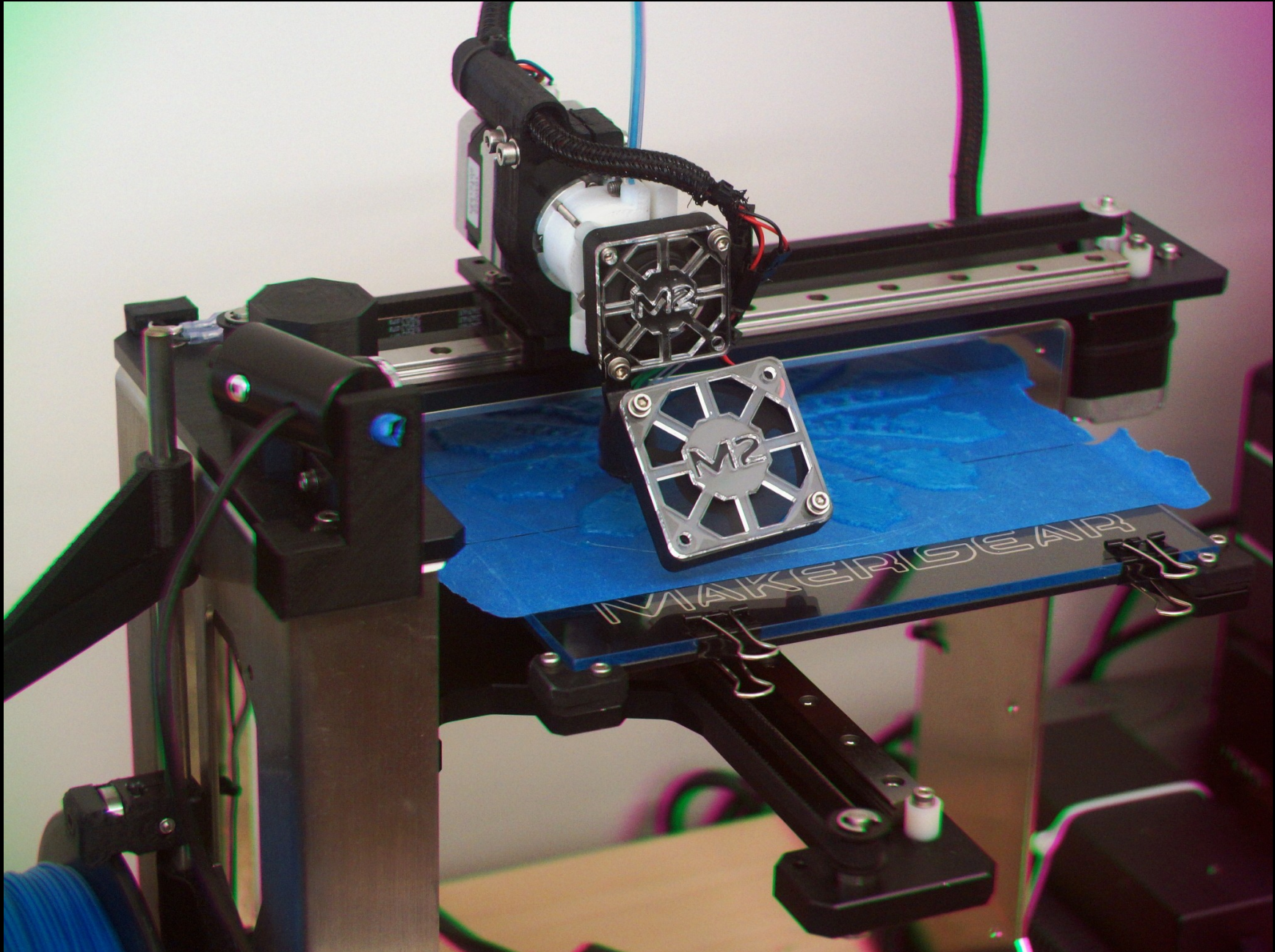


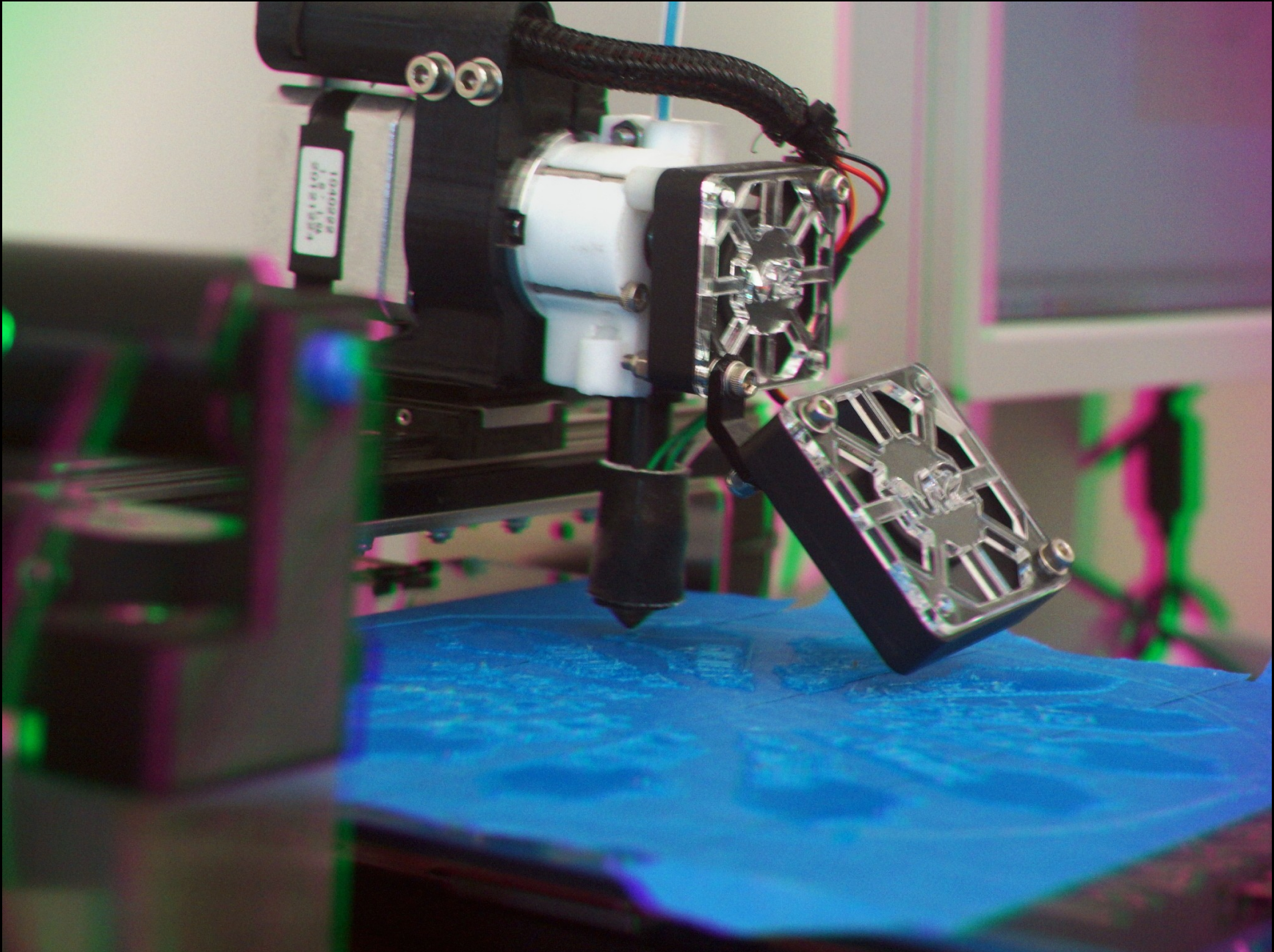














# Can We Computationally Create A Full-Color Stereo Pair?

- Theoretically it's impossible...



Red



Green



Blue

# How To Computationally Create A Full-Color Stereo Pair

- It is really hard...
- Deconvolution fails completely, but more powerful GA PSF matching works s-l-o-w-l-y
- Blur & mask works badly
- Stereo matching has trouble finding matches
- Modified superpixel / shape matching is ok
- Color analysis currently works best...















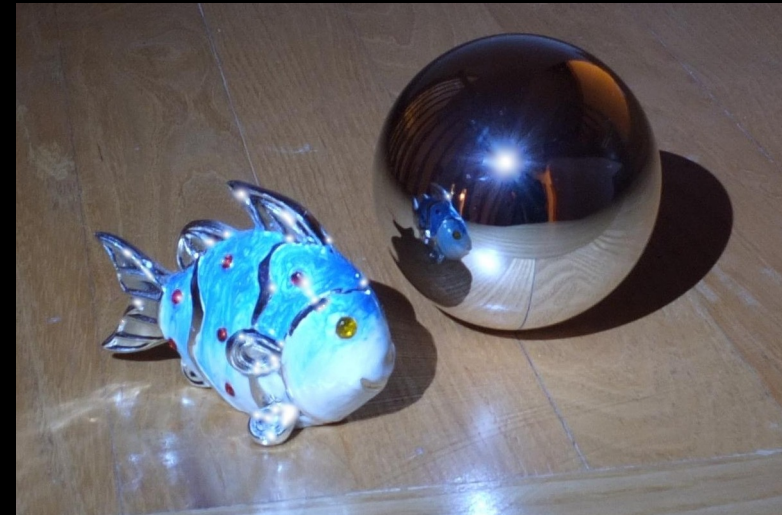
And now for something slightly different:

Software that replaces ugly  
sensor defects with pretty lies.

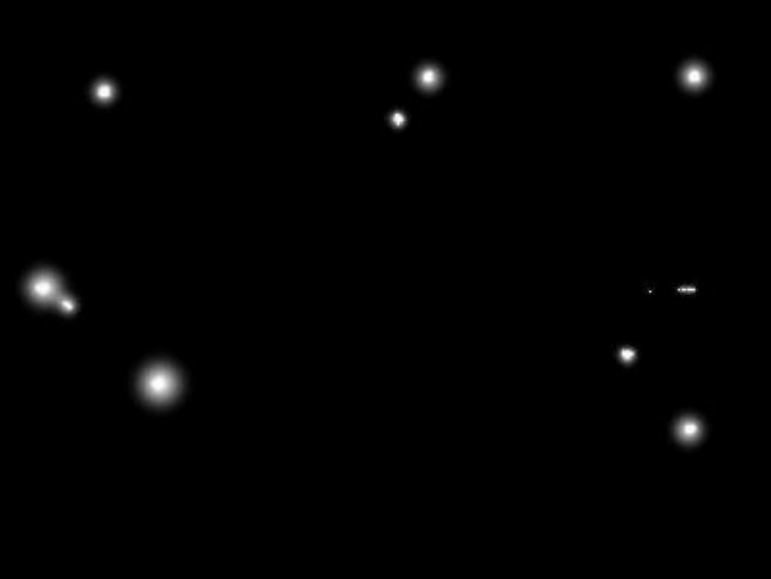
FUJIFILM



White Orbs



- X10 “**White Orbs**” look like OOF PSFs...
- Easier to recognize and computationally Fix – which is what **DeOrbIt** does





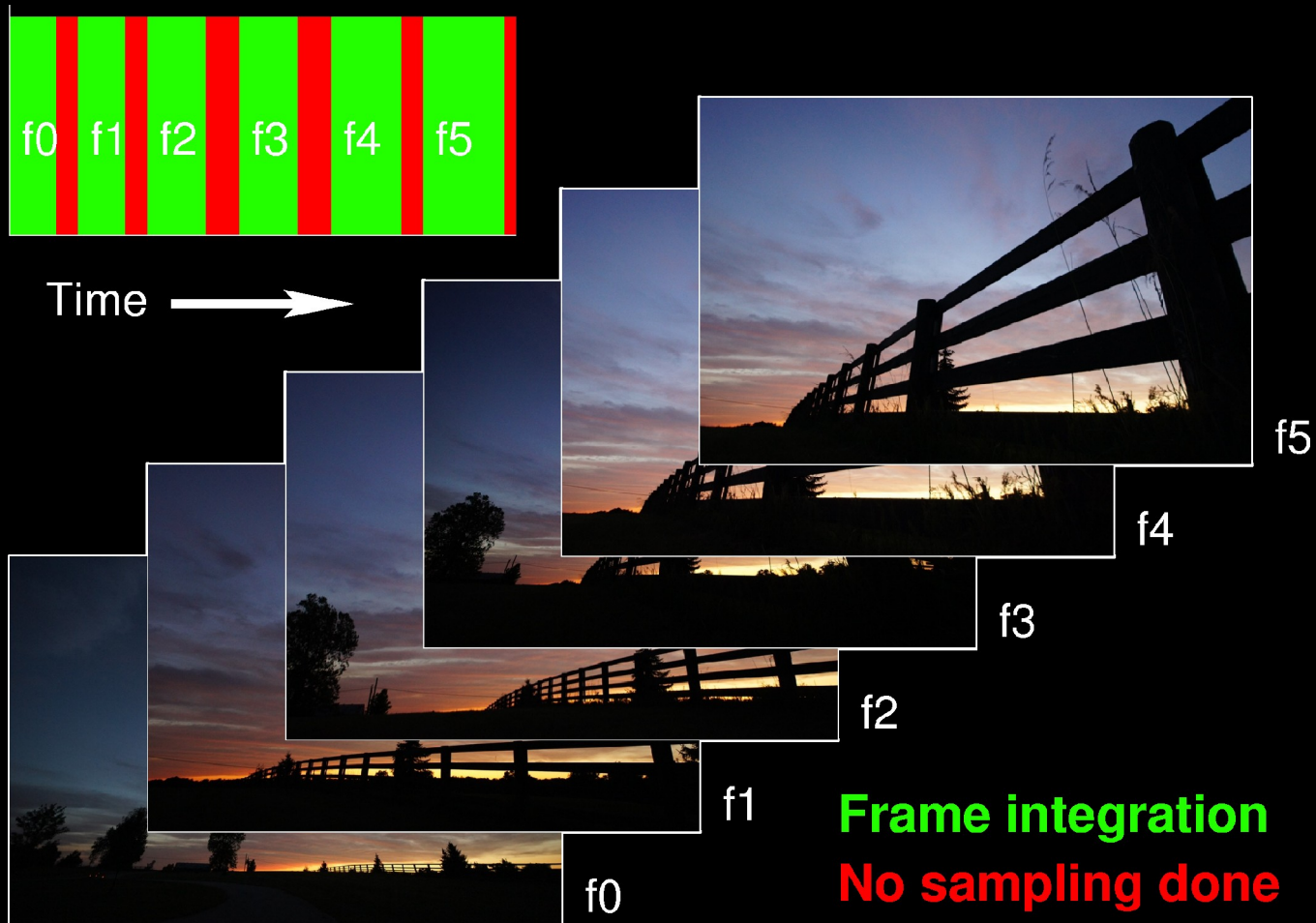
**And now for something completely different:**

**An image sensor  
that doesn't capture images.**

# Traditional Image Capture

- Shutter is opened
- Sensor is exposed to light; each photon adds to the accumulated analog charge (~linearly)
- Shutter is closed
- Analog charge accumulated by each sensel is read-out and digitized to form “**raw**” image
- Processing converts raw into JPEG, etc.

# Traditional Image Capture



# Problems: **Dynamic Range**

- **HDR (high dynamic range)** of scenes
- Linearity of sensel charge accumulation
  - Noise issues with low charge
  - Clipping/leakage at high charge
- **Photon shot noise** – natural statistical variation in photon emission rate; accurate sampling requires *many* photons
- Exposure interval == integration period

# Problems: Shutter Lag


■ IN TOUCH WITH THE FUTURE CASIO

< Home


Ultra-high speed burst shooting captures **60 still images** per second

60fps HI SPEED


**Pre-shot Burst Mode**



High speed movie recording at **300 fps**




Shutter button half-press




*Ultra-high speed continuous shooting of action that occurs before the shutter button is pressed*

Shutter button full-press




Desired image



Recorded images

**Past continuous shooting starts**  
Image buffer continuously updated.

The high-speed Past Continuous shooting of CASIO's next-generation digital camera uses an image buffer that is constantly refreshed with images of the action that occurs in front of the camera's lens. Then when you press the shutter button, the images in the image buffer are recorded, ensuring that you never miss any of those special moments because you pressed the shutter button too late.



*You are able to capture exactly the moment you want.*

Please let us know what you think about this prototype.

Copyright © CASIO COMPUTER CO., LTD. 2007

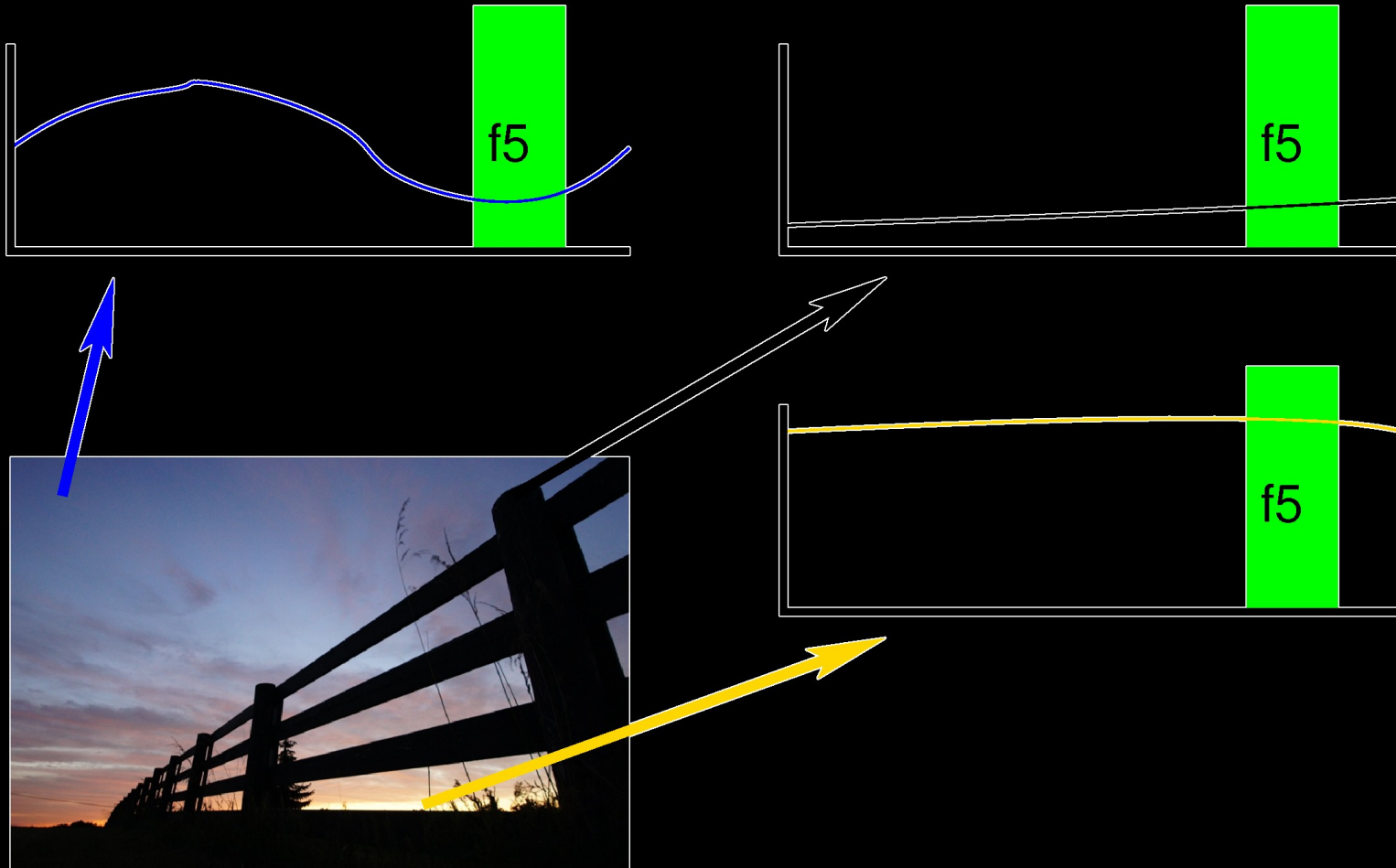
# Problems: **Video**

- What is the framerate for movies?
  - 24 FPS 35mm film (often triple flashed)
  - 25 FPS PAL standard
  - 29.97 FPS (59.94 fields/s) NTSC
- The “jumping telephone poles” pan effect caused by time gap between frames (1/500s @ 24 FPS misses 95% of the action)

# Time Domain Continuous Imaging (TDCI)

- Photon arrival rate at each sensel is measured independently at each sensel
- Raw output is the time-varying value at each sensel – a waveform per pixel, which can be efficiently compressed
- An image is formed for a given interval by computing the average value of each pixel's waveform over that interval

# Continuous Capture

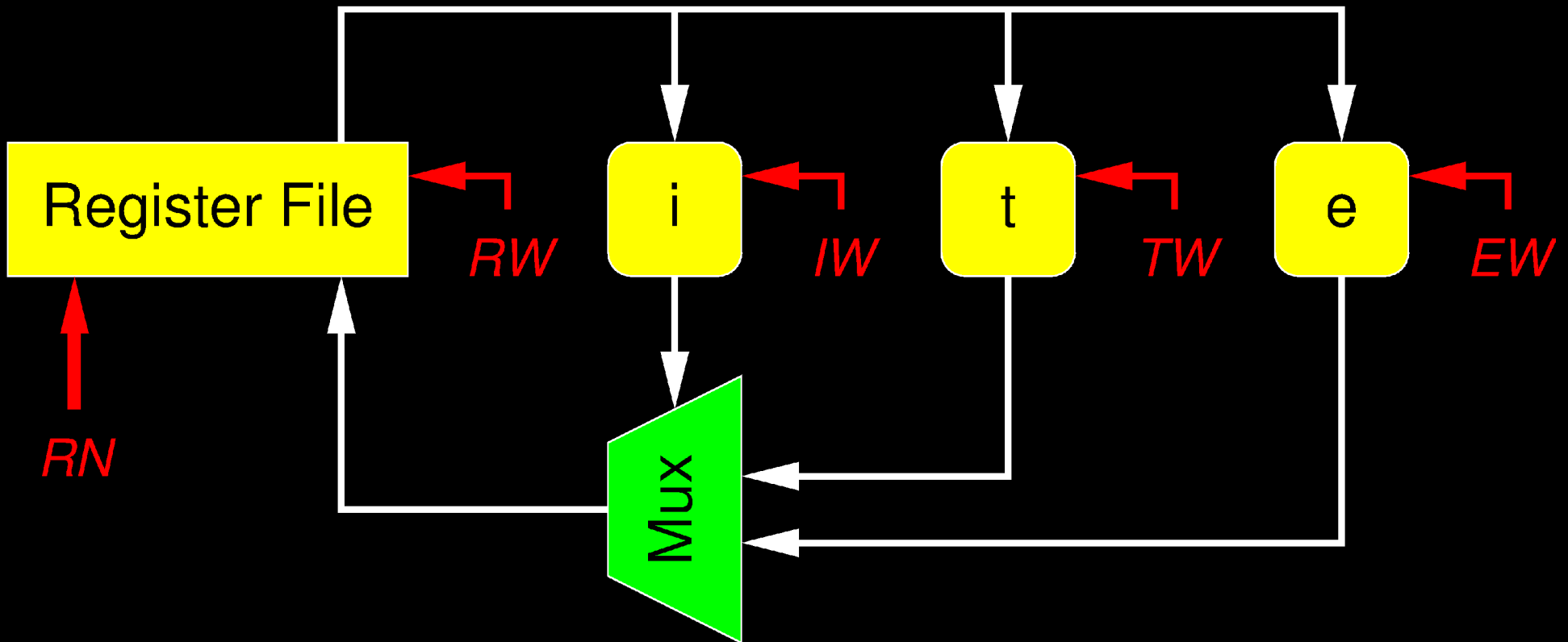




# A Nanocontroller Per Sensel

- Each sensel has a tiny, programmable, nanocontroller *under* it
- Each nanocontroller **counts how long its sensel takes to reach a charge threshold**, then updates the encoded waveform
- The nanocontrollers together operate as **a parallel computer with millions of tiny PEs**, for example, reducing off-sensor bandwidth

# Nanoprocessor Architecture



# Nanocontroller Operation

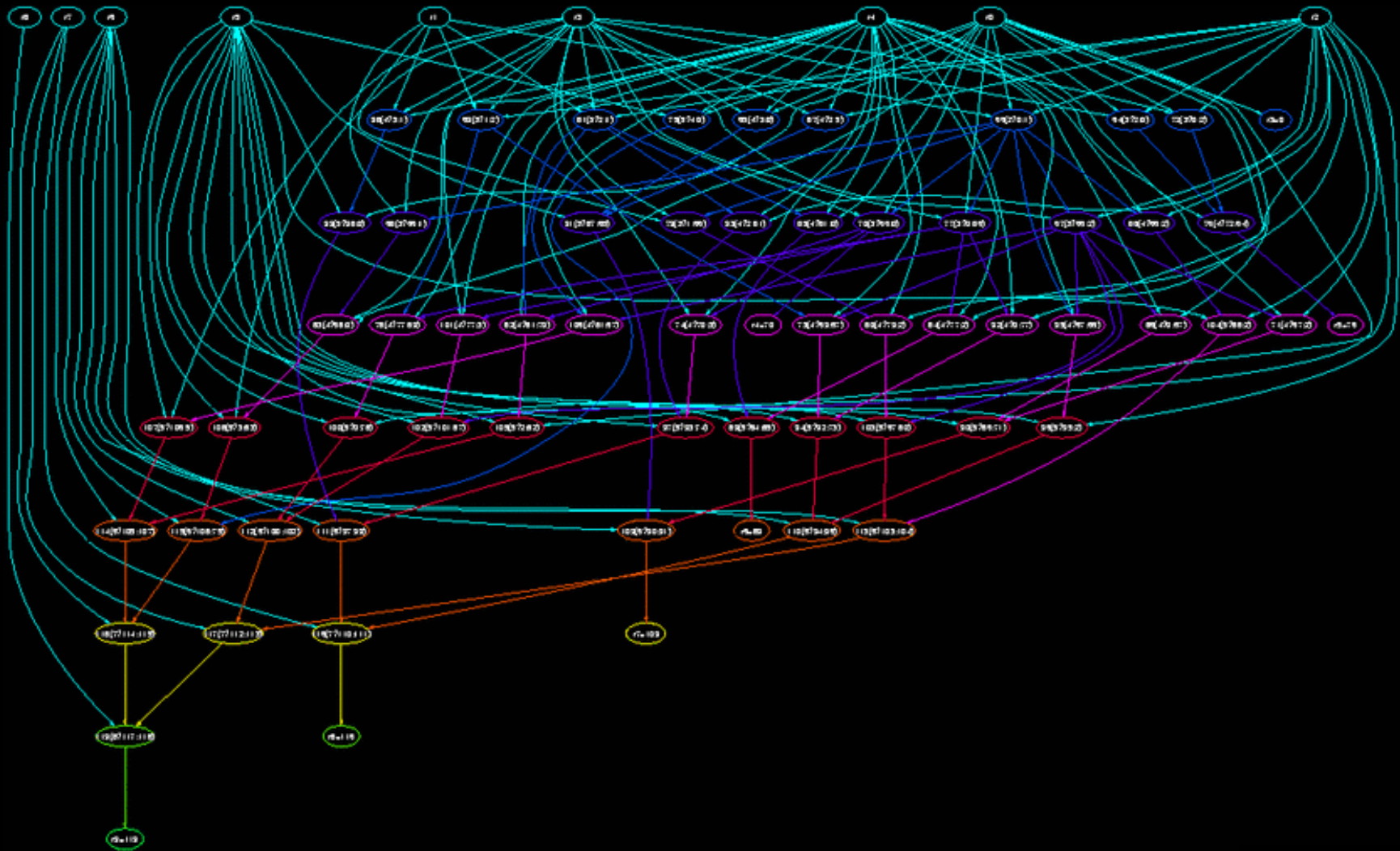
- SIMD hardware, MIMD program executed via **MSC (meta-state conversion)**
- Program using **BitC**, a small C dialect:
  - Explicit precision: `int:3 a;`
  - Mapped I/O & net: `int:1 adc@5;`
  - Adds: `?<` (min), `?>` (max), `$` (ones), etc.
- Compiled into gate-level circuit design, then serialized for just one 1-of-2 mux...

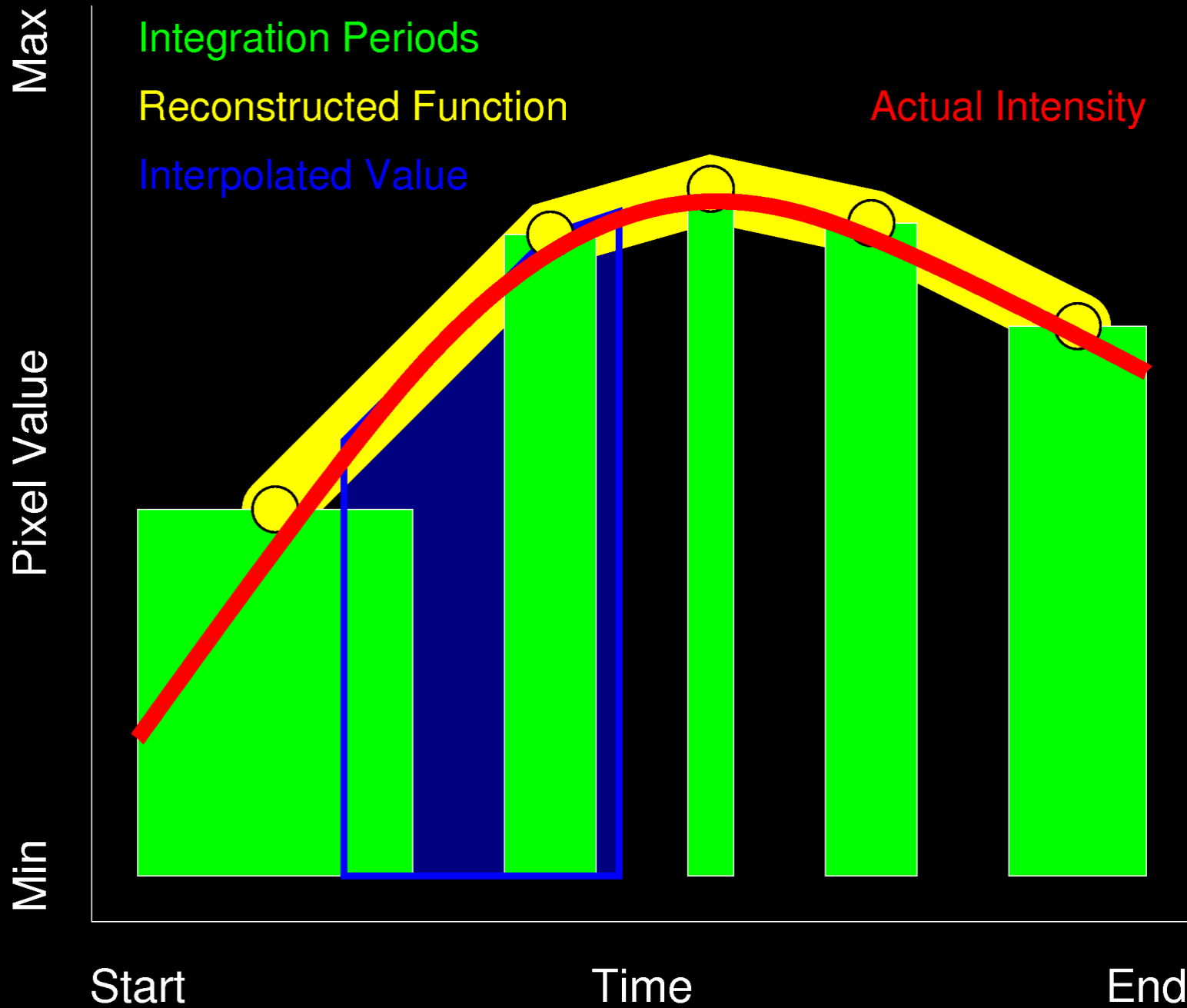
# SITE (Store If-Then-Else)

- Like NAND, ITE (1-of-2 mux) is complete
- Mapping from more familiar gates:

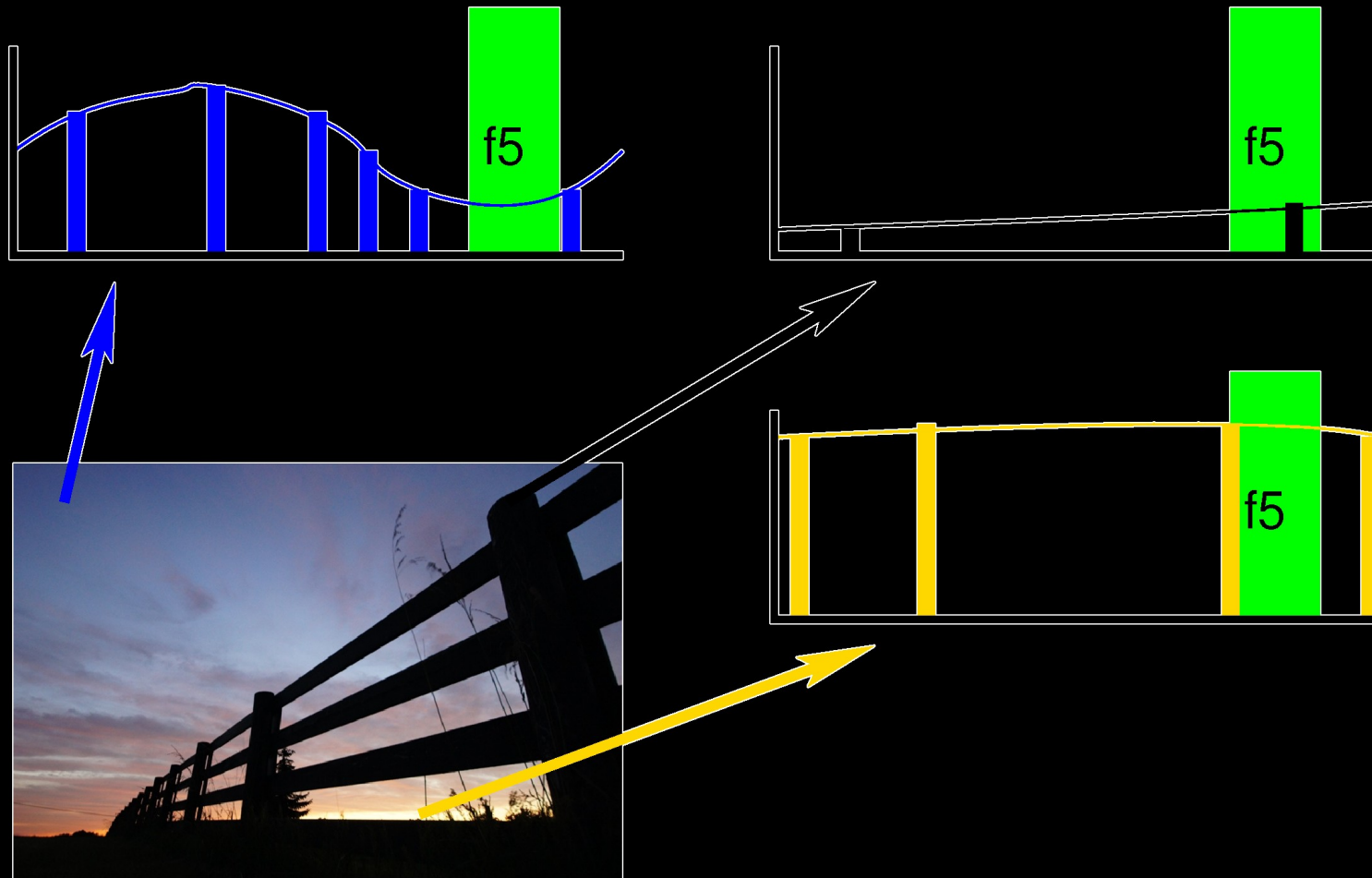
Logic Operation	Equivalent ITE Structure
$(x \text{ AND } y)$	$(x ? y : 0)$
$(x \text{ OR } y)$	$(x ? 1 : y)$
$(\text{NOT } x)$	$(x ? 0 : 1)$
$(x \text{ XOR } y)$	$(x ? (y ? 0 : 1) : y)$
$((\text{NOT } x) ? y : z)$	$(x ? z : y)$

```
int:8 a; a = a * a;
```





# Pseudo-Random Sampling



# The Camera I Want To Build



- Large format (4"x5") solar cell based sensor
- Lens resolution → ~500MP-1.5GP
- Nanocontrollers @1GHz → ~1KFPS
- *Uncompressed* ~1TB/s HDR data stream



# Conclusion

- Cameras are computing systems
- Computation controlling capture and clever post-processing are not all you can do – rethinking the entire system will enable new capabilities

# Want To Know More?

Watch our research WWW site:

**Aggregate.Org**   
*UNBRIDLED COMPUTING*