

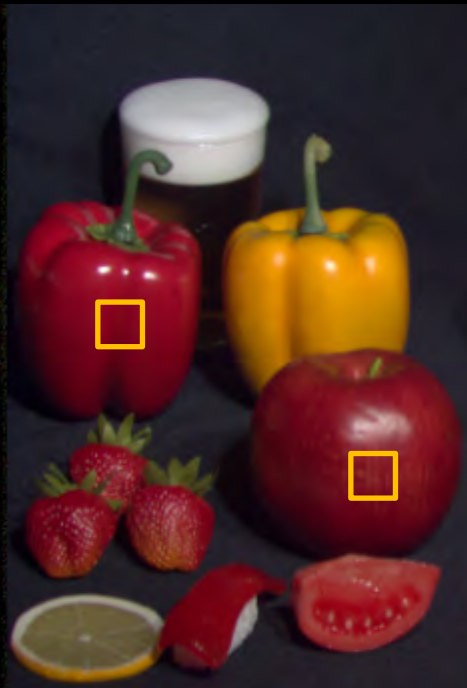
# Multisampling Compressive Video Spectroscopy

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# Fake or Real?

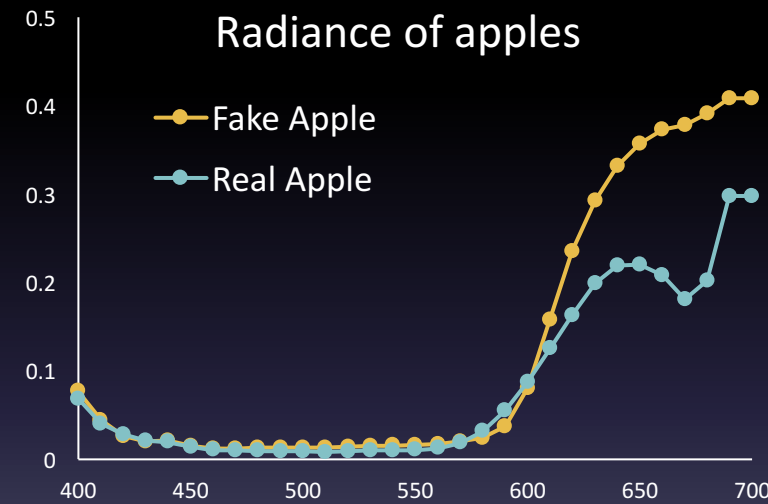
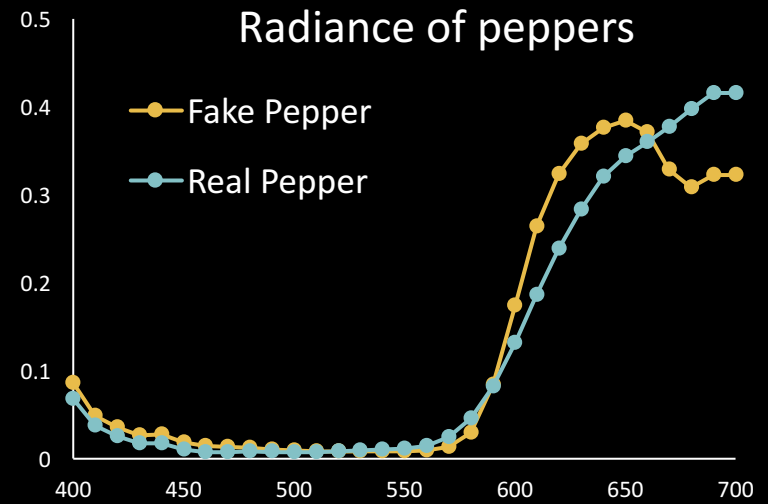
[Yasuma et al. 2008]

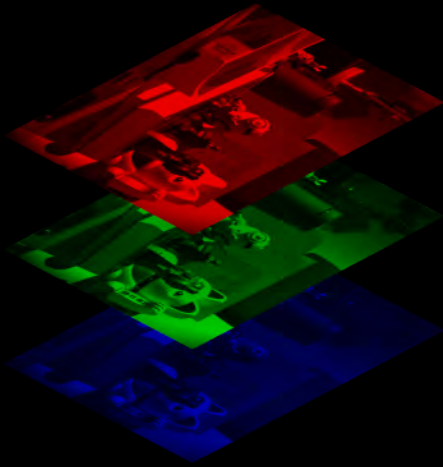


Fake



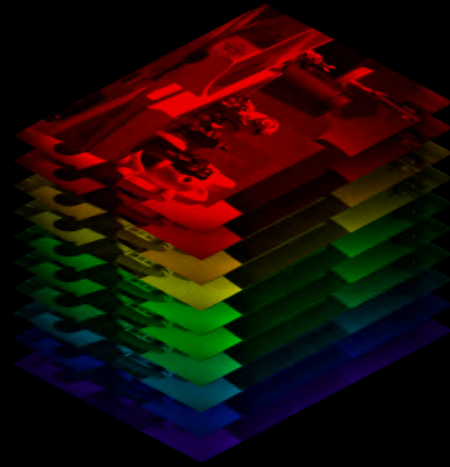
Real





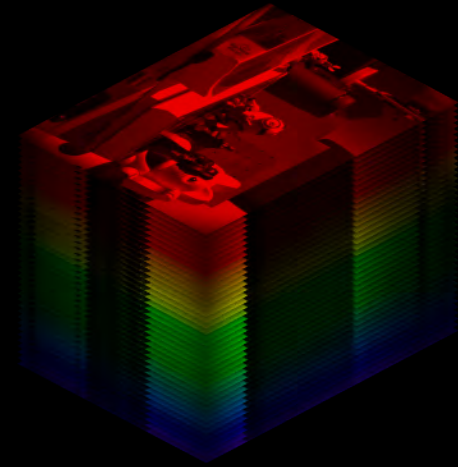
RGB Imaging

3 channels



Multispectral  
Imaging

$< \sim 30$  channels



Hyperspectral  
Imaging

$\geq \sim 30$  channels



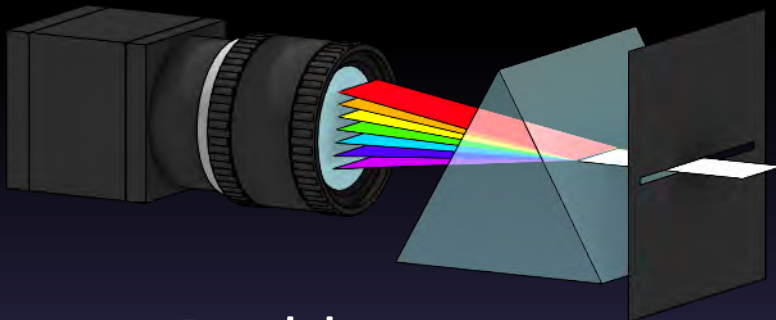
**Bandpass filter**

[Mansouri et al. 2007]



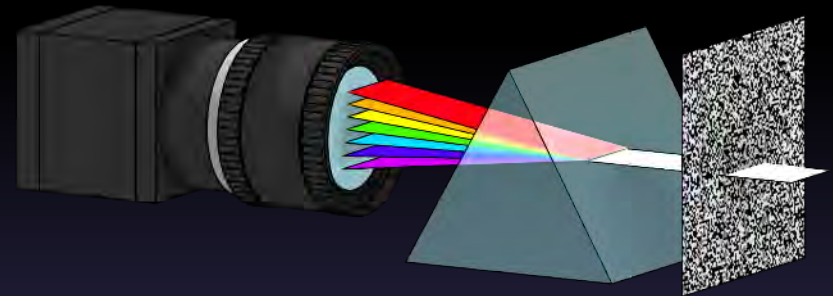
**LCTF** (liquid crystal tunable filter)

[Attas et al. 2003]



**Pushbroom**

[Brusco et al. 2006]



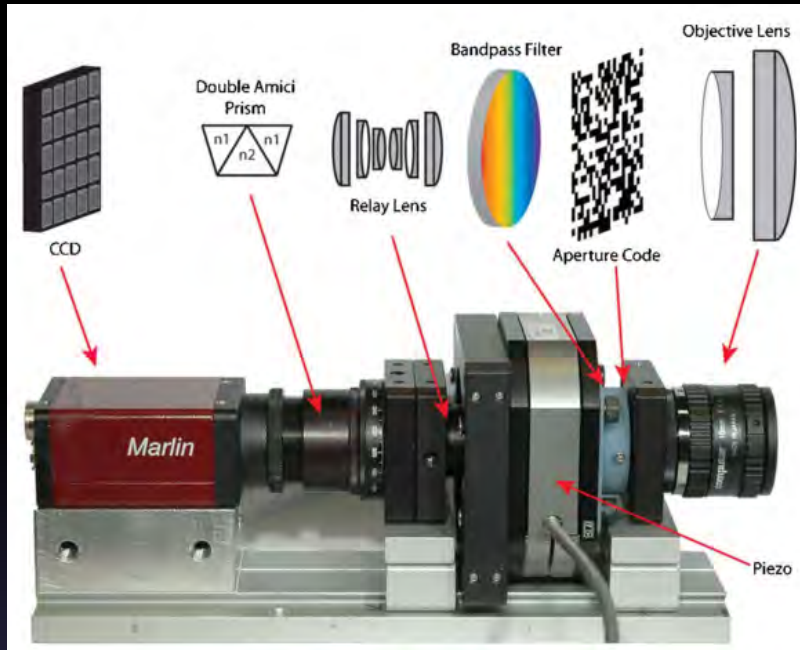
**CASSI**

[Wagadarikar et al. 2008]

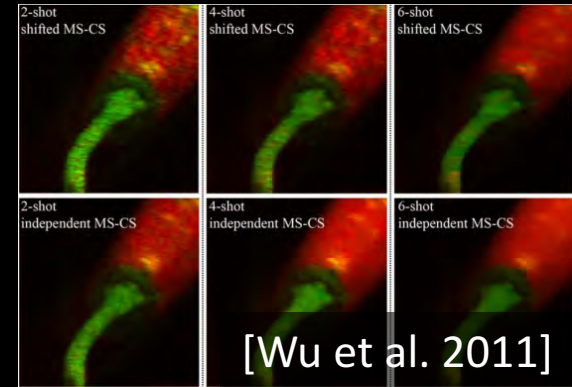
# Multisampling CASSI

Mask shifting using piezo translation stage

[Kittle et al. 2010]



DMD (digital-micromirror-device)

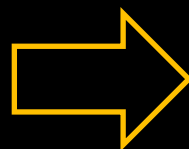
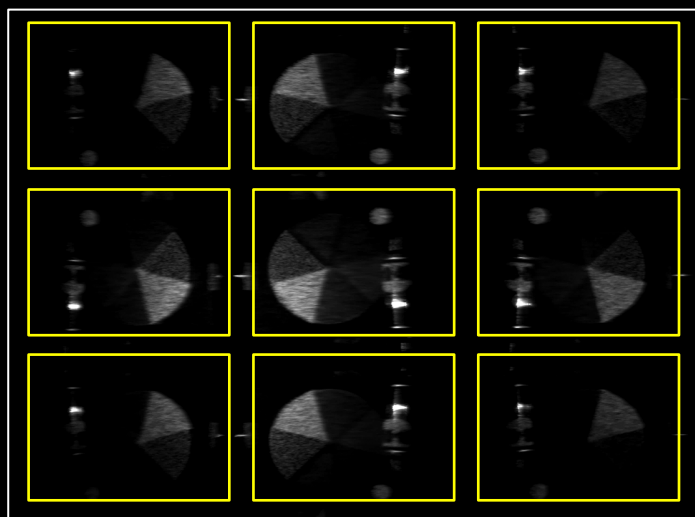


LCOS (liquid crystal on silicon)

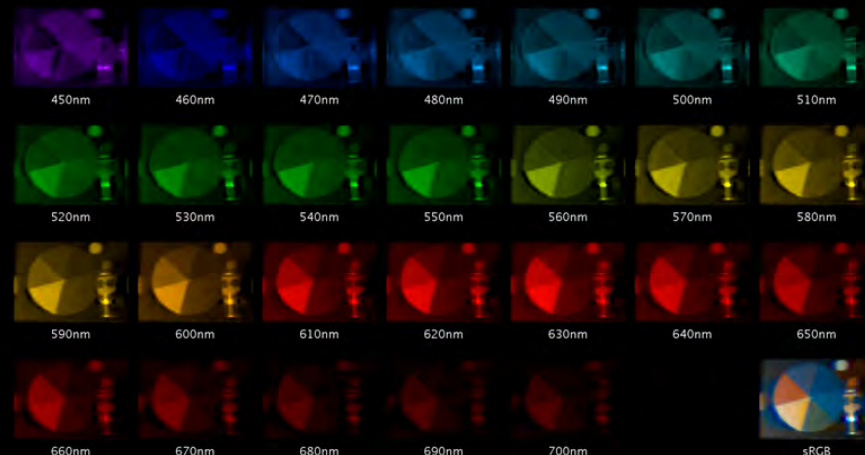


Multisampling CASSI systems require multiple captures

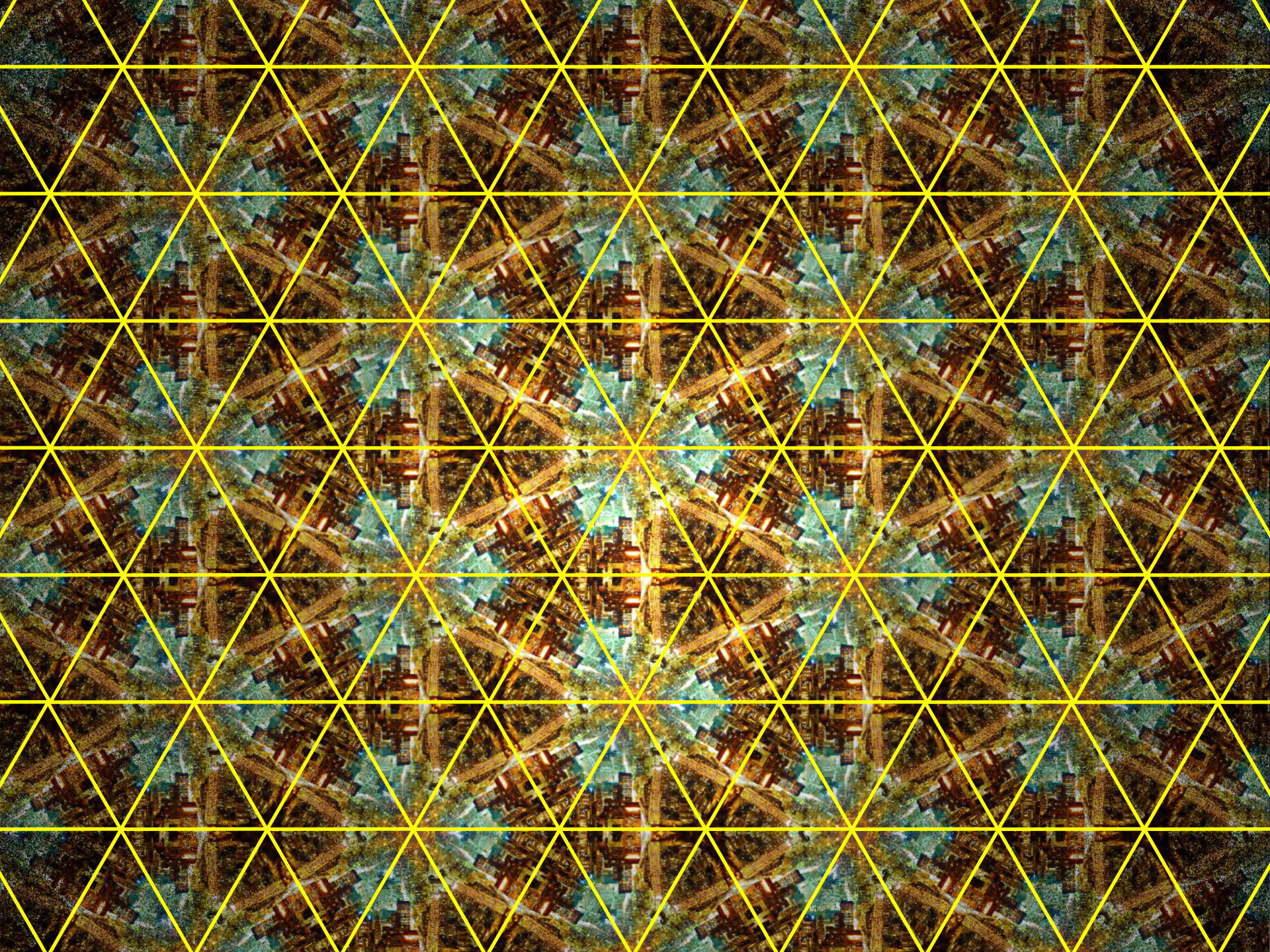
## Single coded input



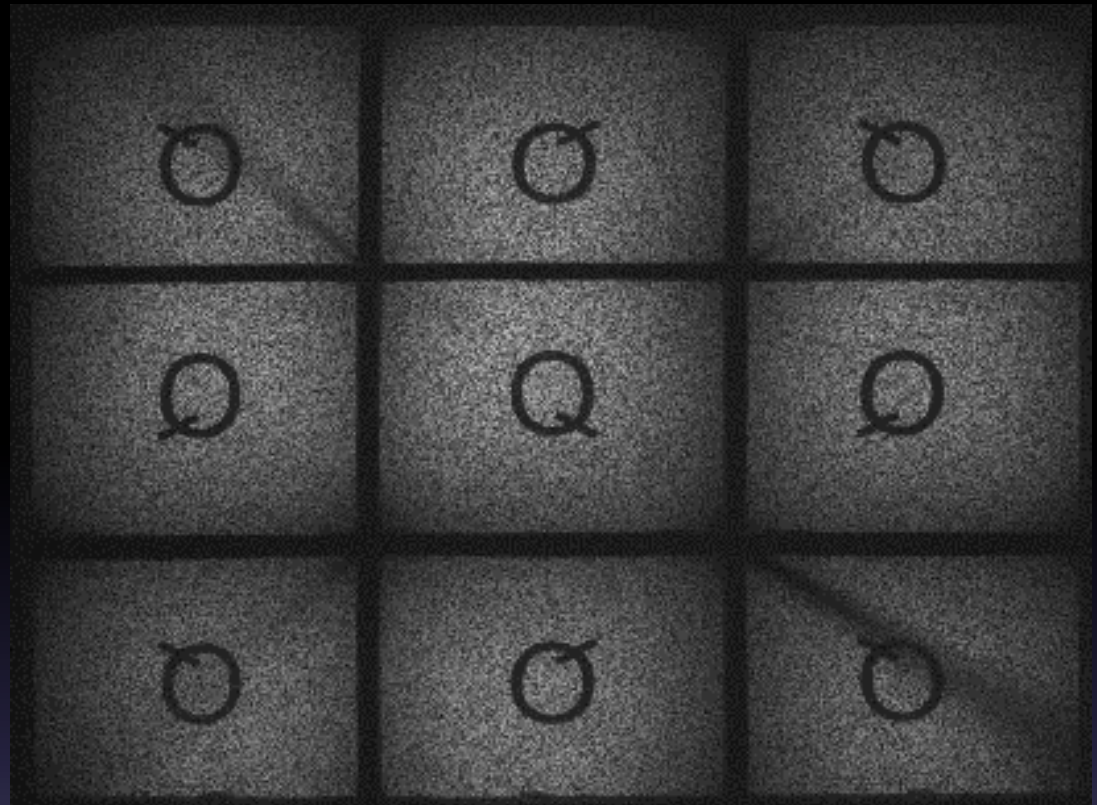
## Hyperspectral video



- Multisampling compressive imaging
  - High spectral resolution
  - High spatial resolution
- Single snapshot hyperspectral imaging
  - **Video spectroscopy**

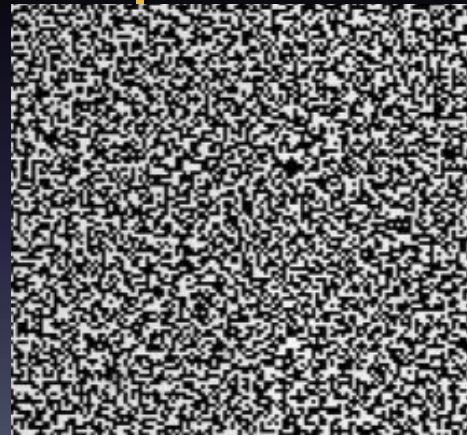
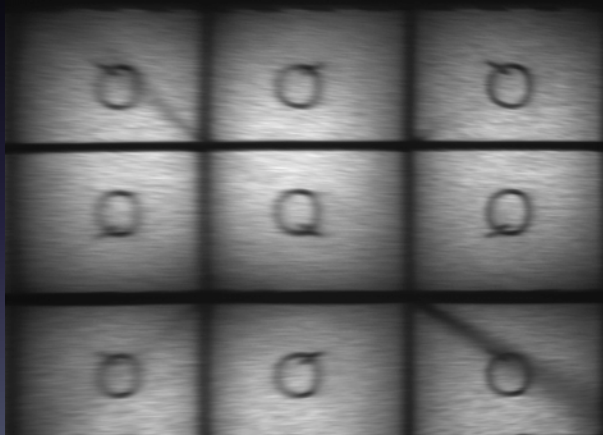
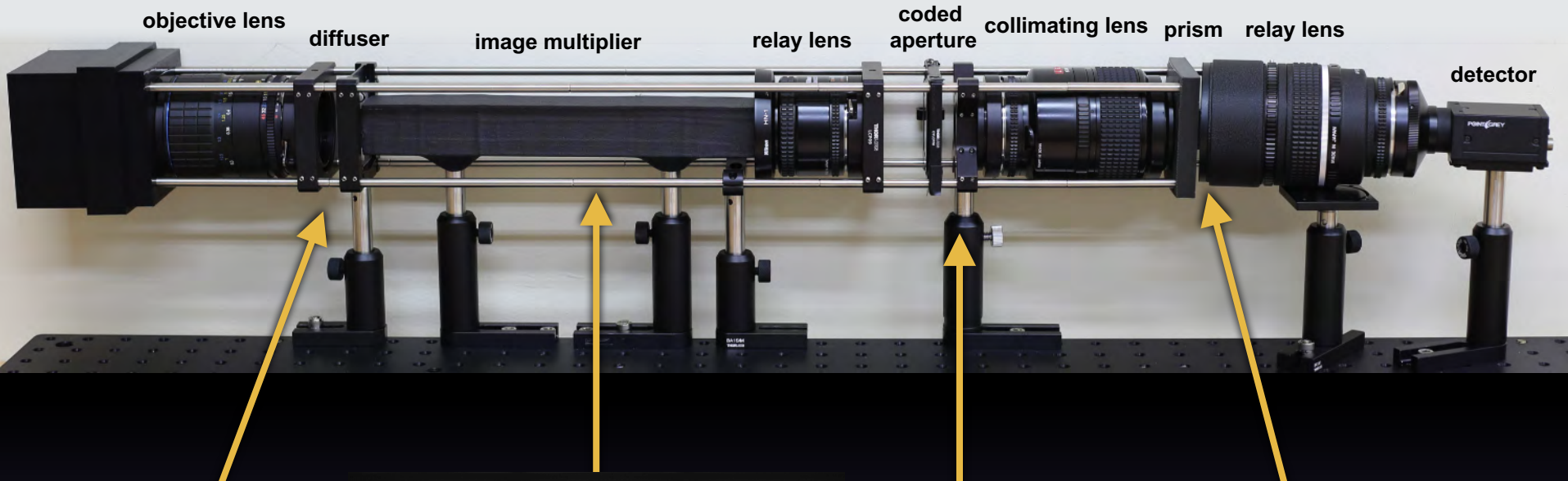


- Coded aperture snapshot spectral camera
- Multisampling  
→ **Kaleidoscope**

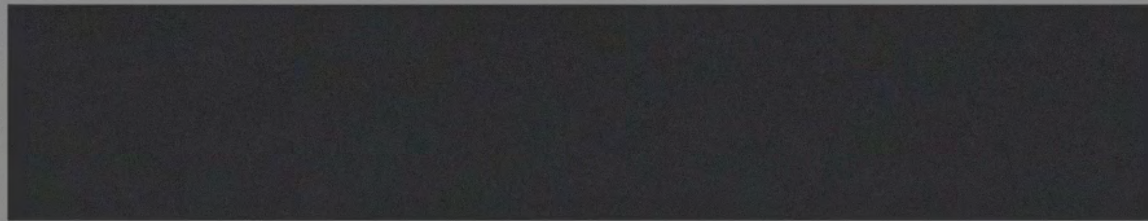




# System Setup

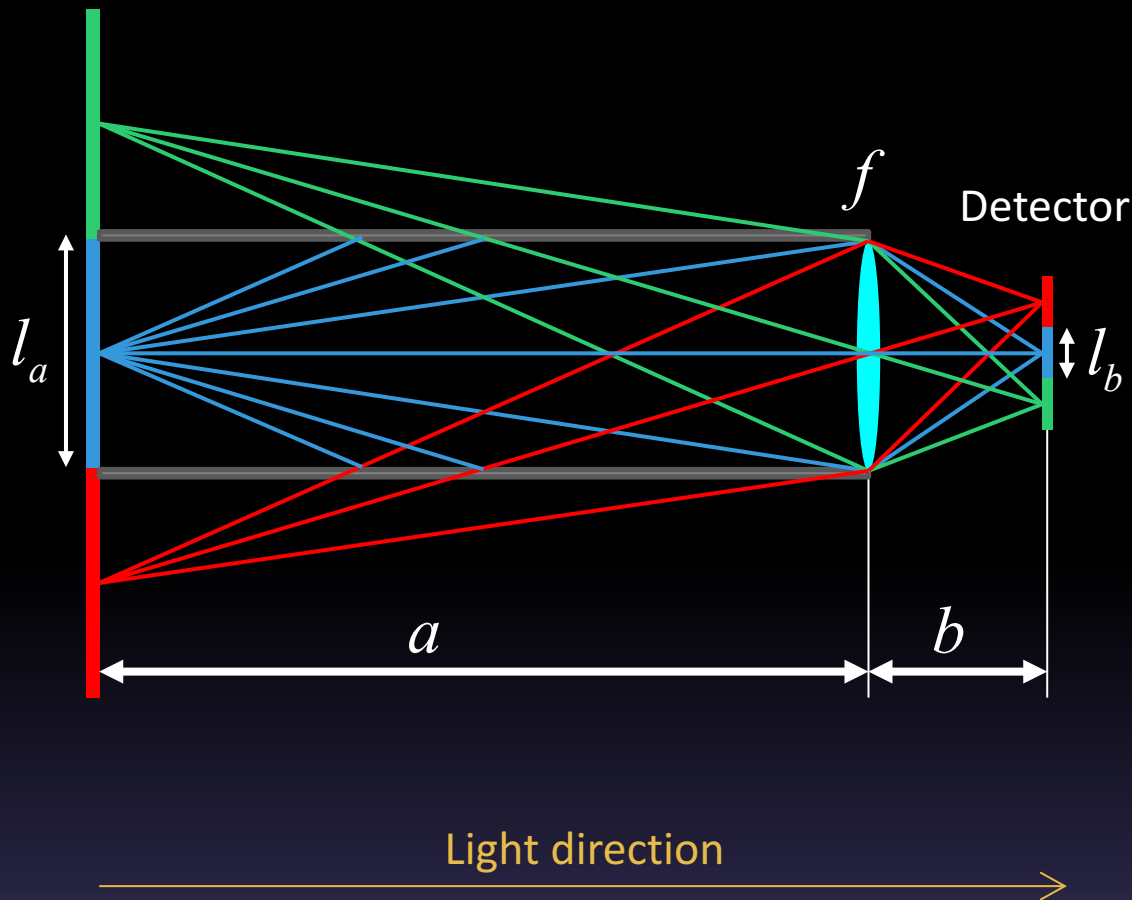


# Examine Kaleidoscope



# View Multiplication

Diffuser

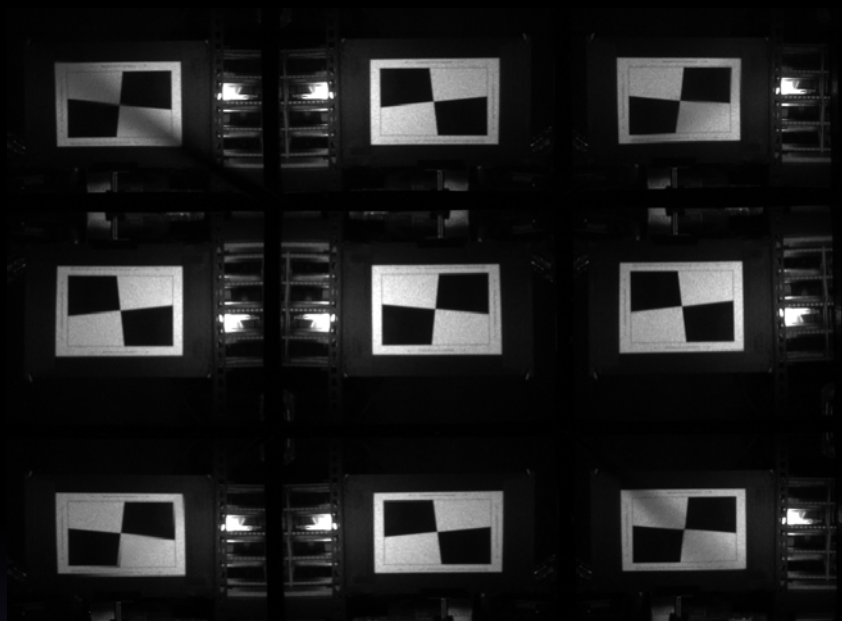


$m$  : magnification

$$m = \frac{b}{a} = \frac{1}{a/f - 1}$$

$$\frac{1}{a} + \frac{1}{b} = \frac{1}{f}$$

# Effect of Diffuser

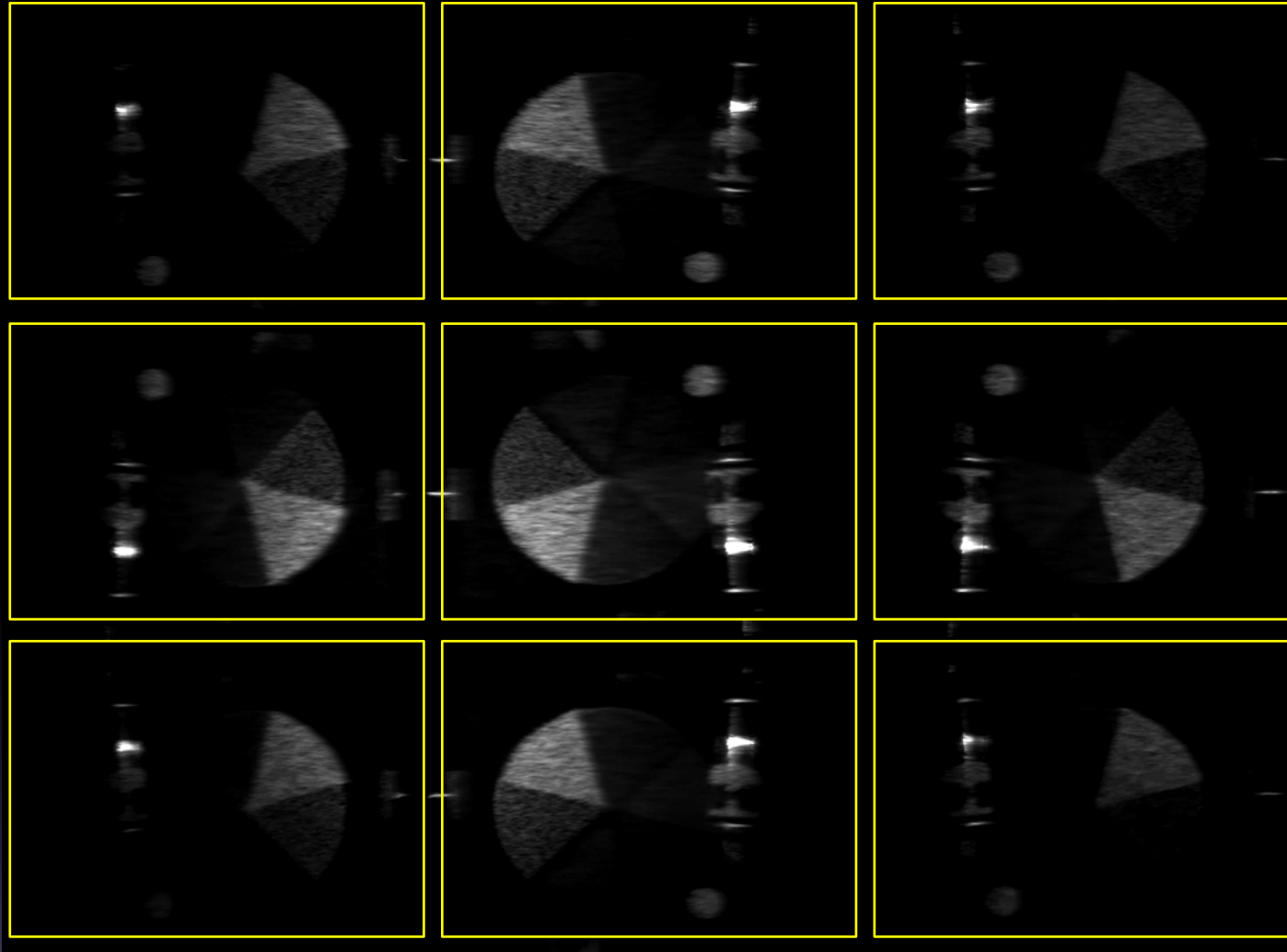


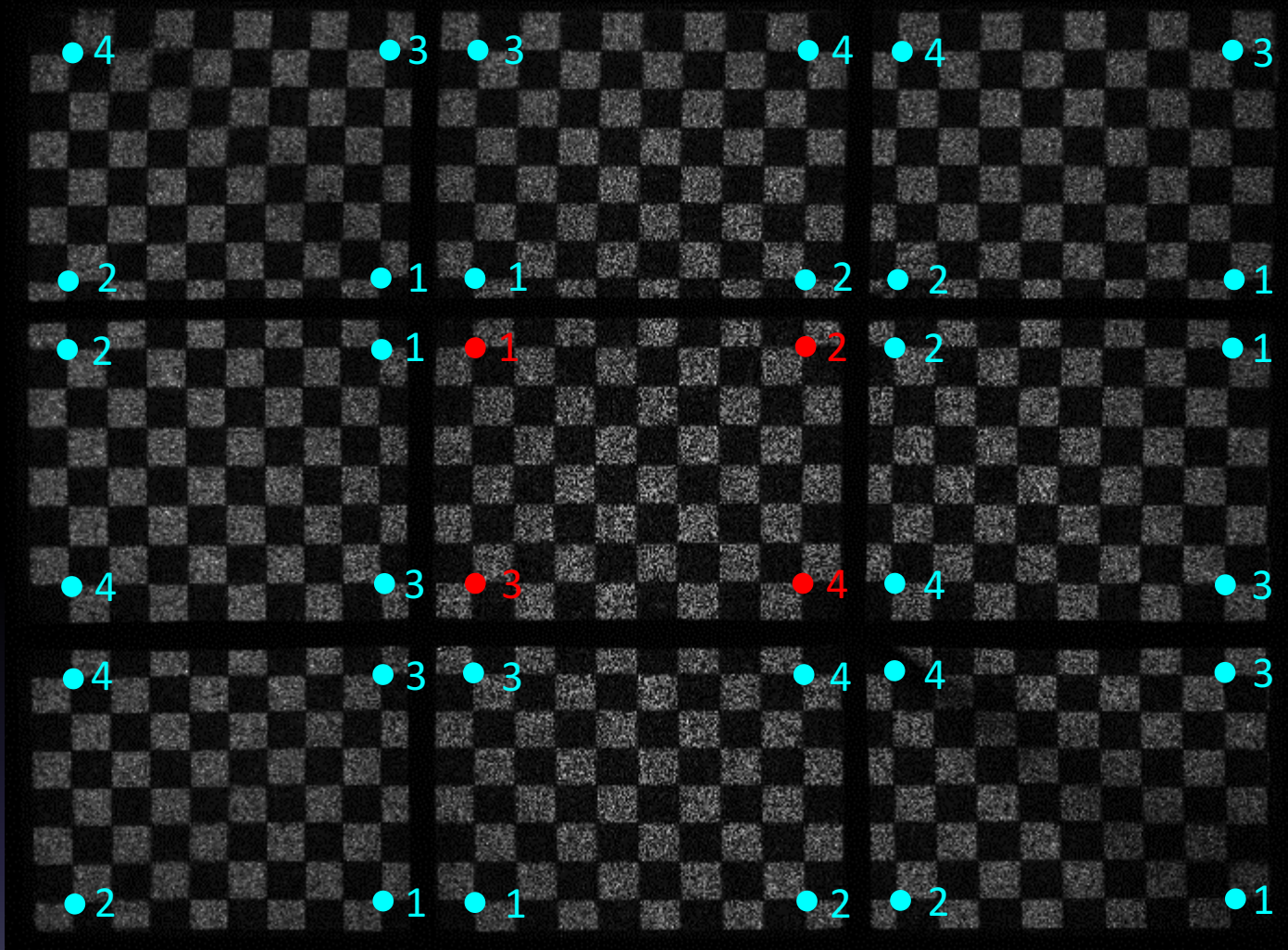
With diffuser



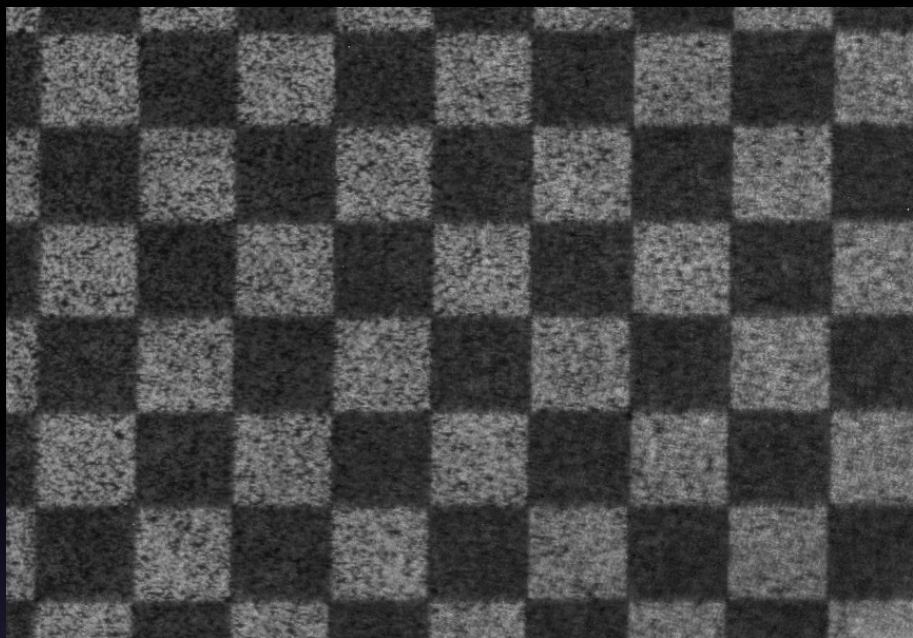
Without diffuser

# Raw Input Video

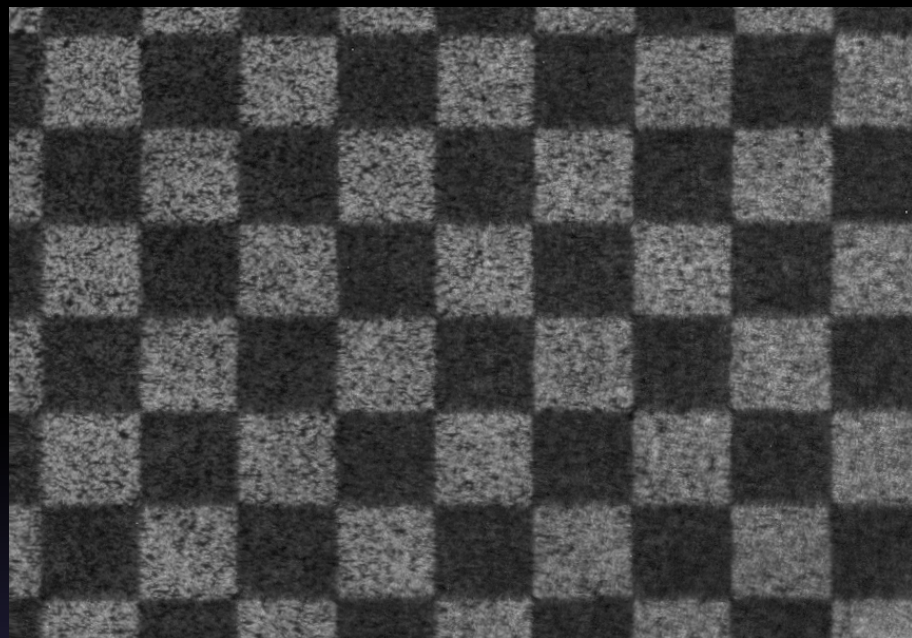




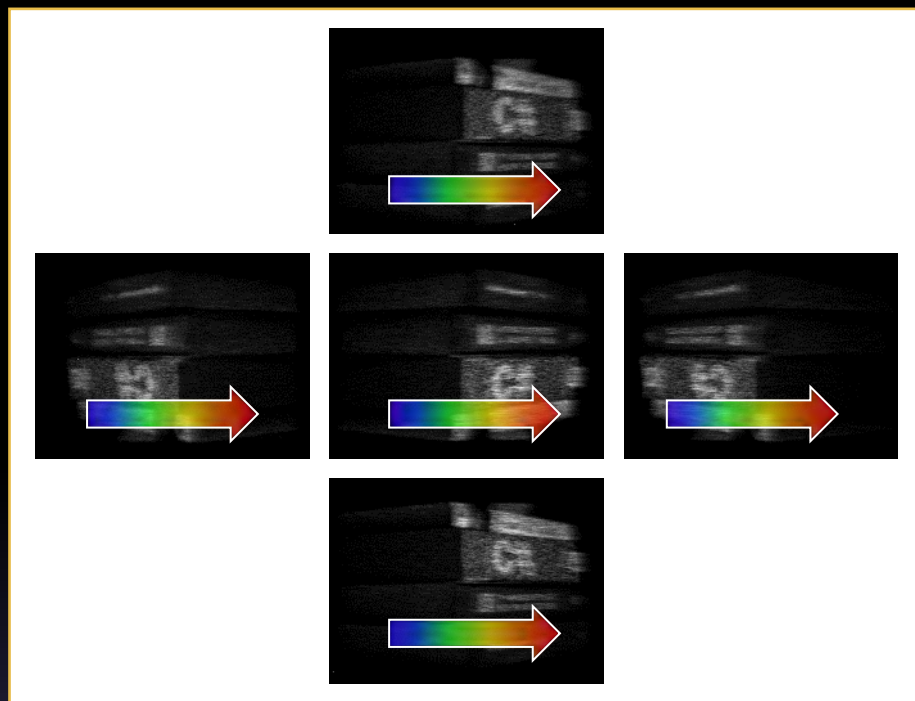
Before apply optical flow



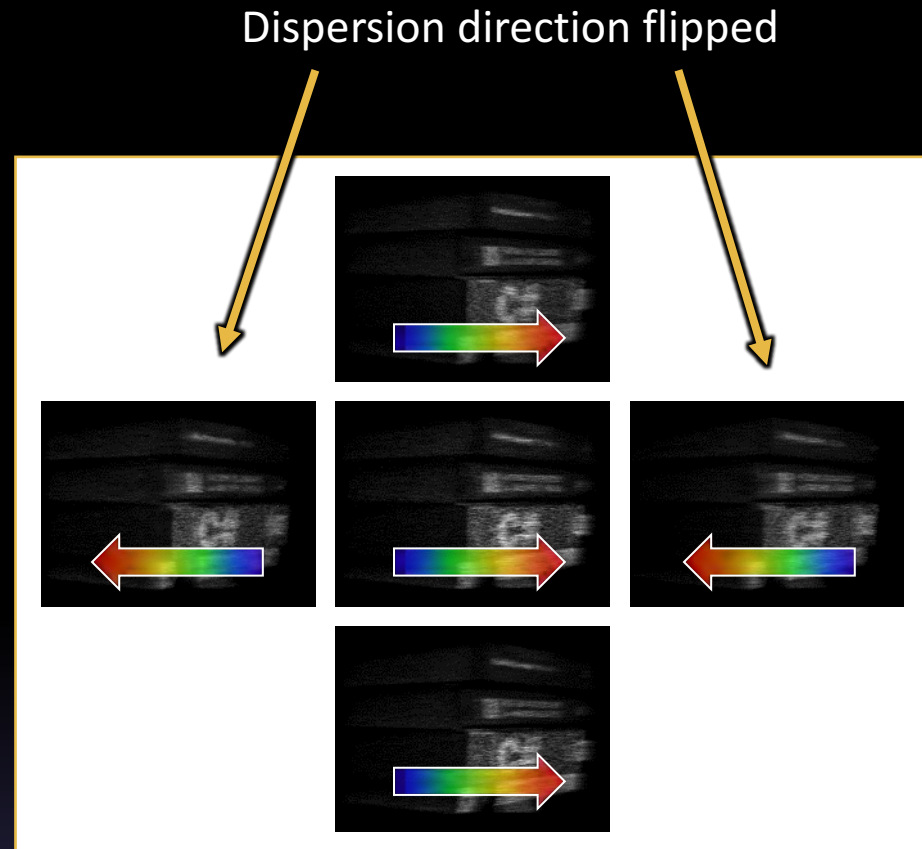
After apply optical flow



Animated 5 views

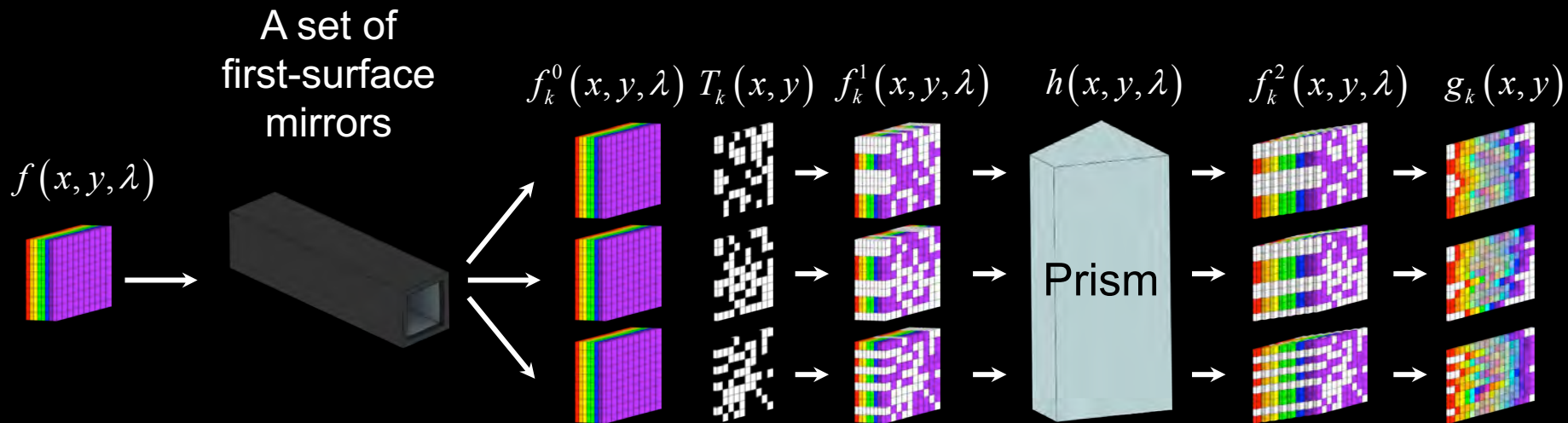


Captured images



Aligned images



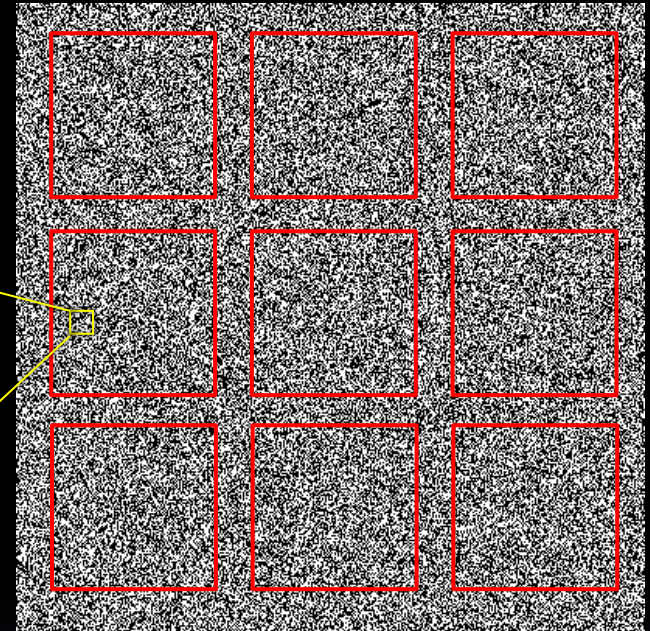
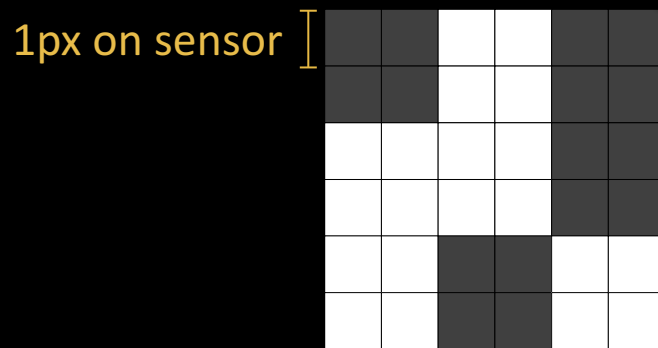


$$g_k(x, y) = \int_{\Lambda} \iint \underbrace{h(x' - \phi_k(\lambda), x, y', y, \lambda)}_{\text{Dispersion}} \underbrace{T_k(x, y)}_{\text{Mask}} \underbrace{f_k^0(x, y, \lambda)}_{\text{Incident}} dx' dy' d\lambda$$

# Coded Aperture

## Coded aperture specs

- Random binary patterns
- corresponds to two-by-two pixels

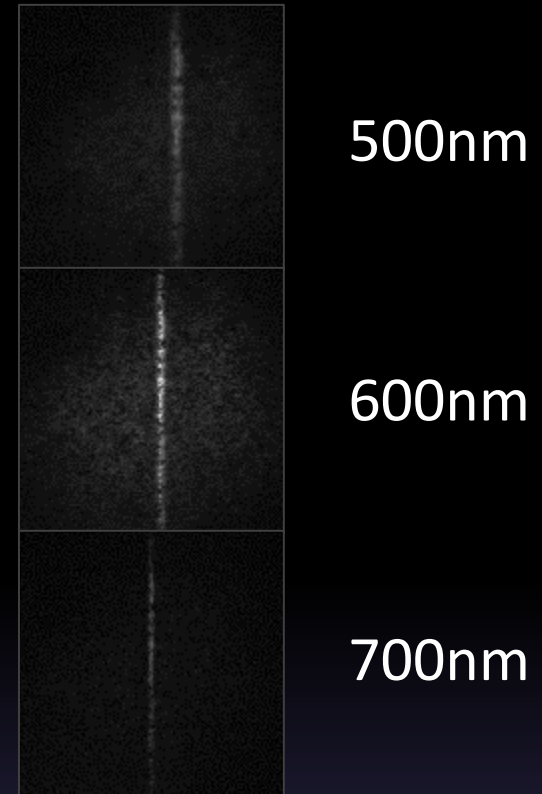
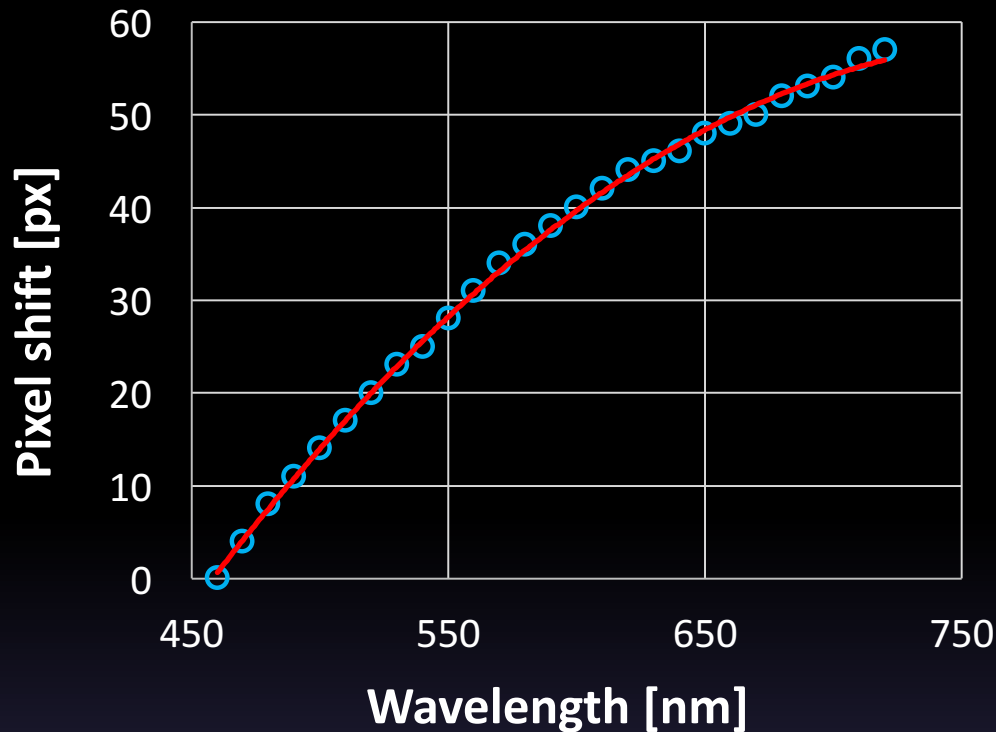


Each 9 view pass through different coded aperture patterns

→ Enable multisampling

$$T_k(x, y) = \sum_{i,j} \mathbf{T}_{ijk} \text{rect} \left( \frac{x}{\Delta} - i, \frac{y}{\Delta} - j \right)$$

## Dispersion calibration



$$\underbrace{f_k^2(x, y, \lambda)}_{\text{Dispersed light}} = \iint \underbrace{h(x' - \phi_k(\lambda), x, y', y, \lambda)}_{\text{Dispersion}} \underbrace{f_k^1(x, y, \lambda)}_{\text{Coded light}} dx' dy'$$

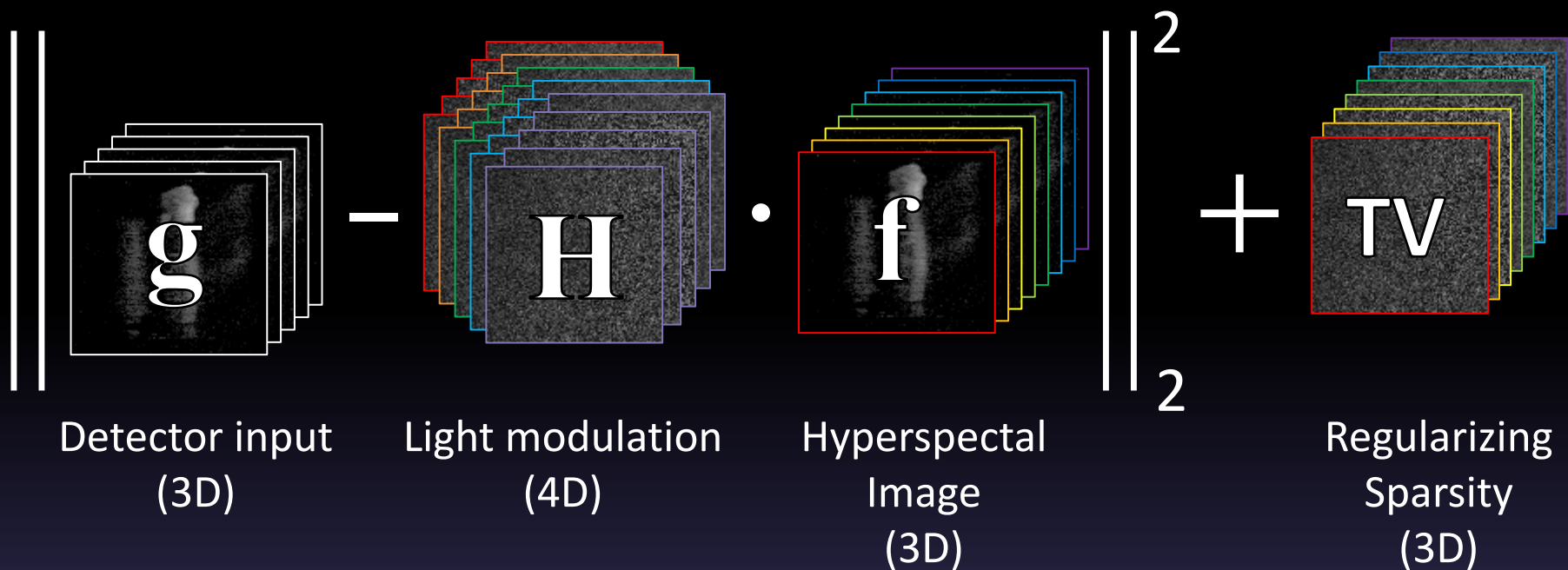
Dispersed light

Dispersion

Coded light

- Minimizing an objective function with total variation

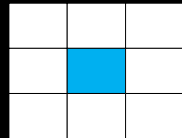
[Bioucas-Dias and Figueiredo 2007]



# View Multiplication



1 view



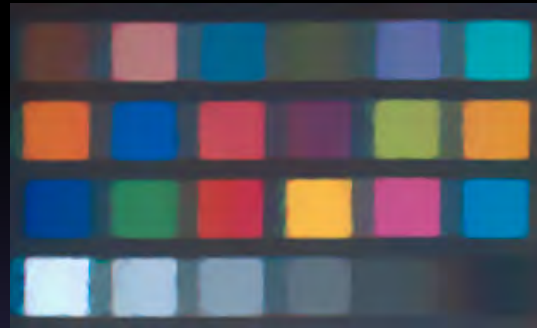
2 views



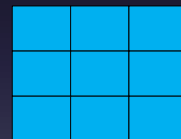
3 views



5 views



9 views



(synthetic images)



reference

5 views **without**  
dispersion inversion



PSNR: 28.20  
SSIM: 0.88

5 views **with**  
dispersion inversion



PSNR: 30.45  
SSIM: 0.91



reference

(synthetic images)

# Multiview Tradeoff



1	2	3
4	5	6
7	8	9

1	2	3
4	5	6
7	8	9



PSNR: 27.84  
SSIM: 0.88



PSNR: 23.42  
SSIM: 0.77



PSNR: 31.29  
SSIM: 0.92

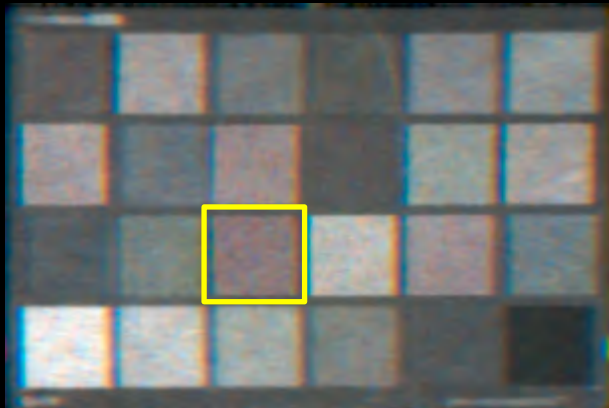


reference

(synthetic images)

# Comparison

## Traditional CASSI

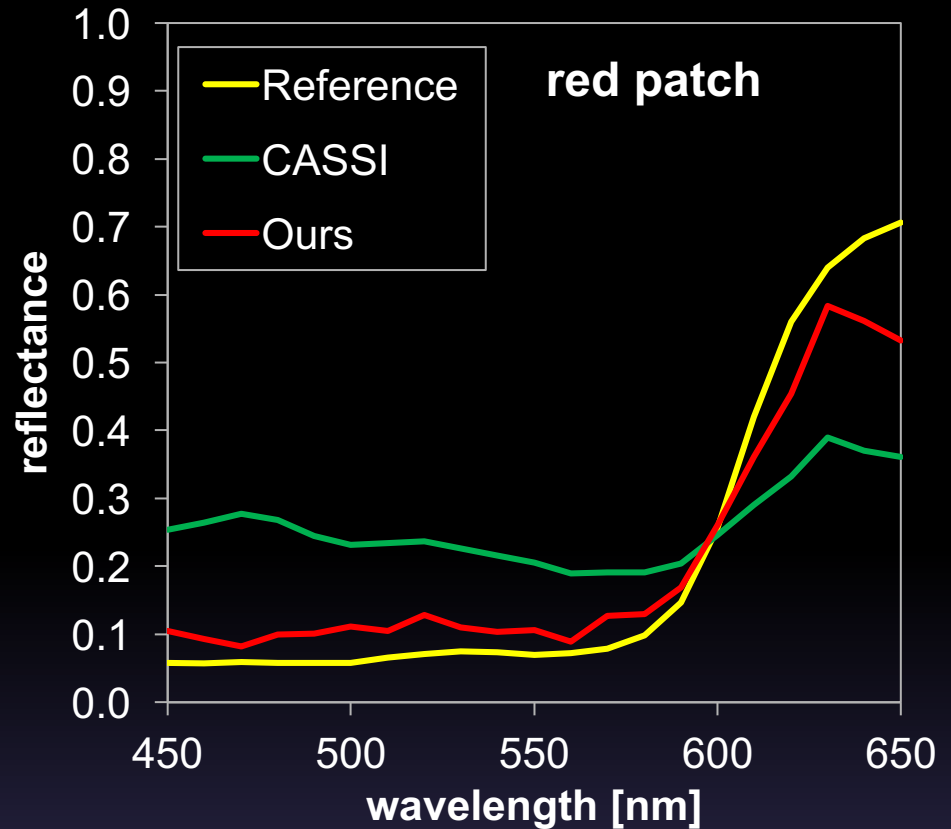


1 full view

## Our multisampling CASSI

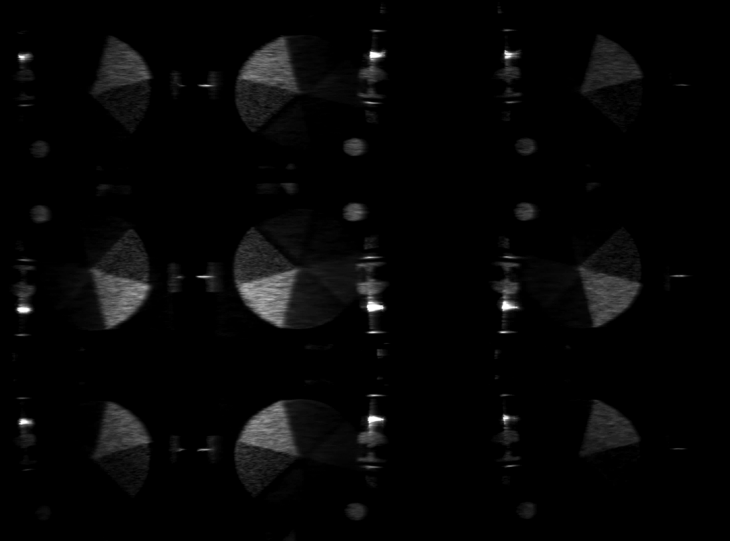


5 views





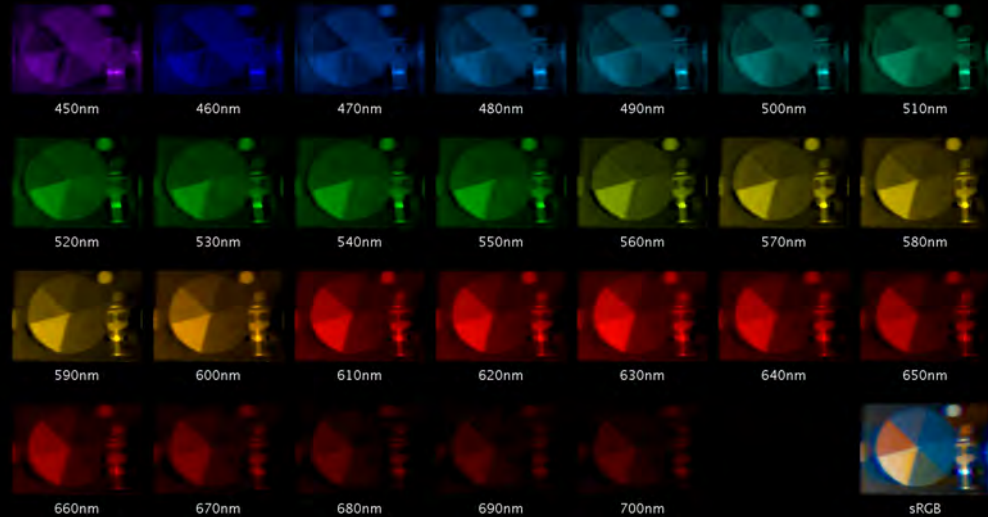
## Input



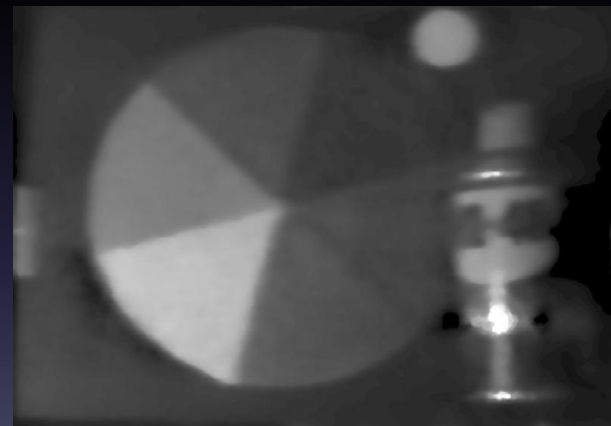
## sRGB video



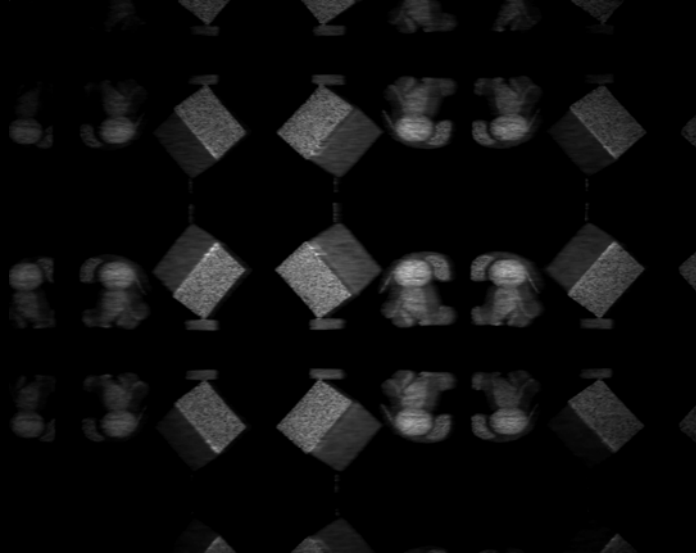
## Reconstructed hyperspectral video



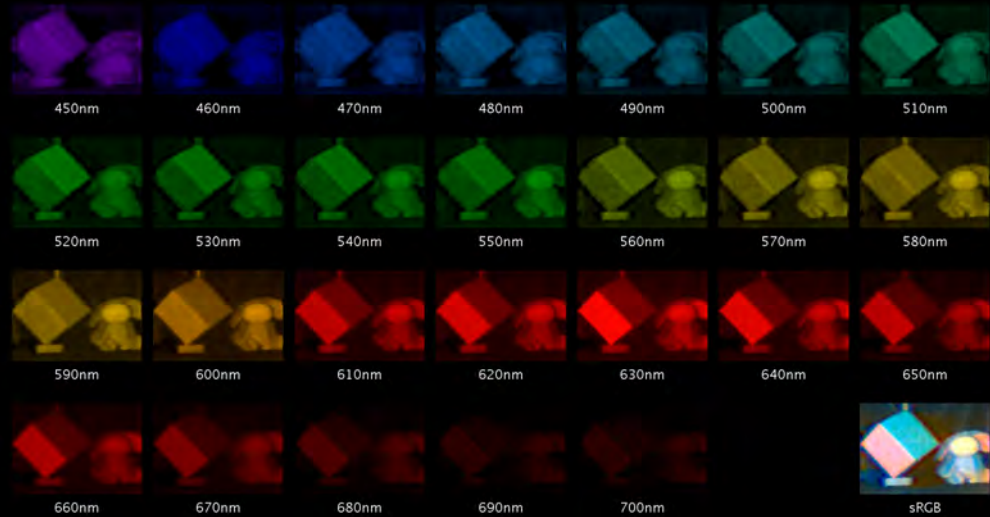
## Wavelength at 600nm



## Input



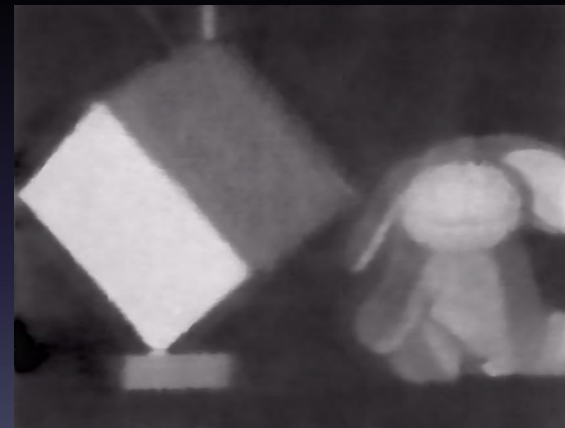
## Reconstructed hyperspectral video



## sRGB video



## Wavelength at 600nm

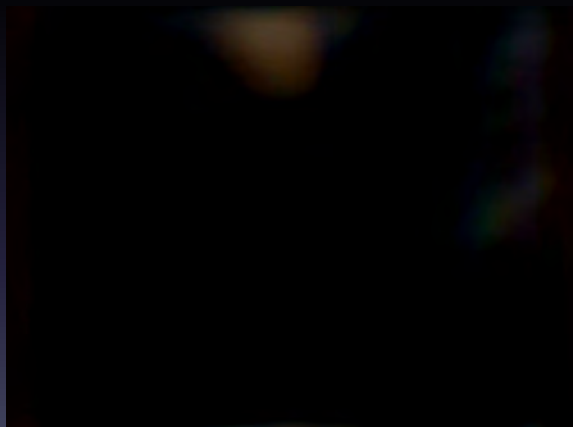


Input

Reconstructed hyperspectral video



sRGB video

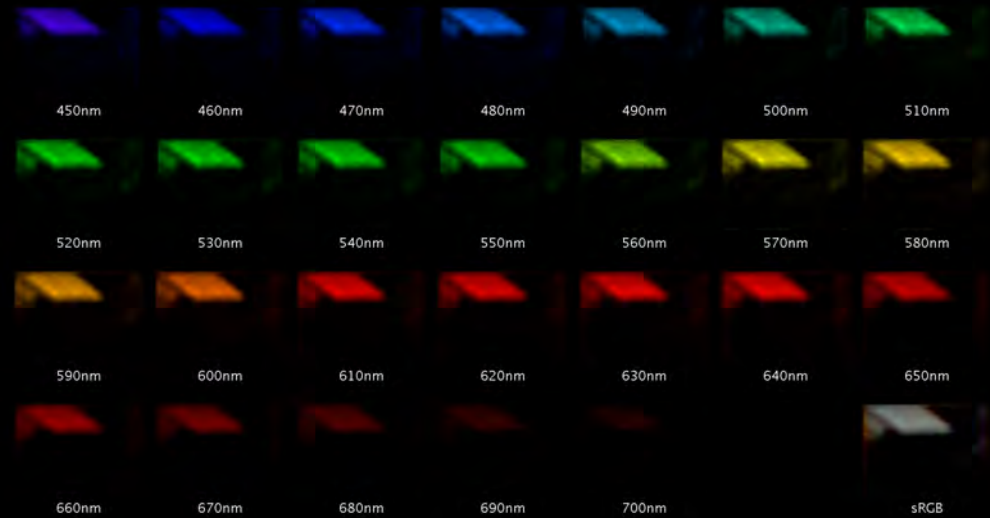


Wavelength at 600nm

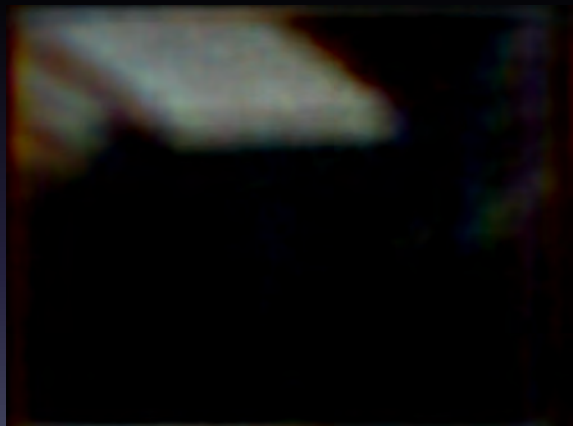


Input

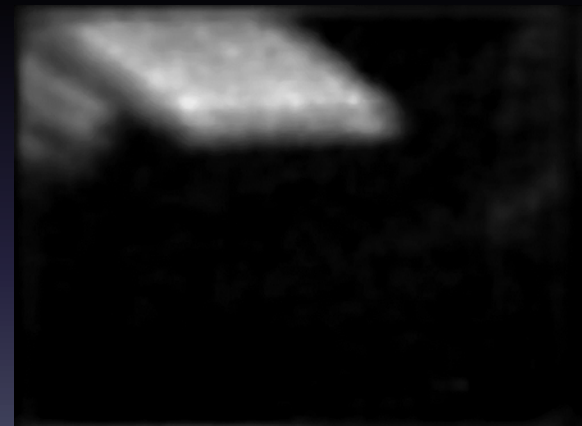
Reconstructed hyperspectral video



sRGB video



Wavelength at 600nm



- Tradeoff between spatial and spectral resolution
  - Significantly enhance spectral resolution
  - Sacrifice sensor resolution
- Misalignment of copied views gives a critical reconstruction problem
- Alternatives for TV-L1 optimization

- Single snapshot-based design
- Hyperspectral video acquisition
- High spectral resolution
- By coupling multisampling and compressive imaging

- Korea National Research Foundation (NRF) grants (2013R1A1A1010165 and 2013-M3A6A6073718)
- Korea ICT R&D program of MSIP/IITP (10041313)

# Thank you