

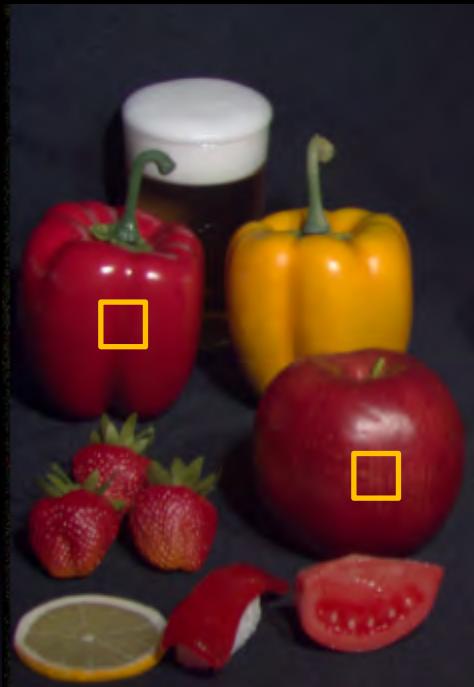
Multisampling Compressive Video Spectroscopy

Daniel S. Jeon Inchang Choi Min H. Kim

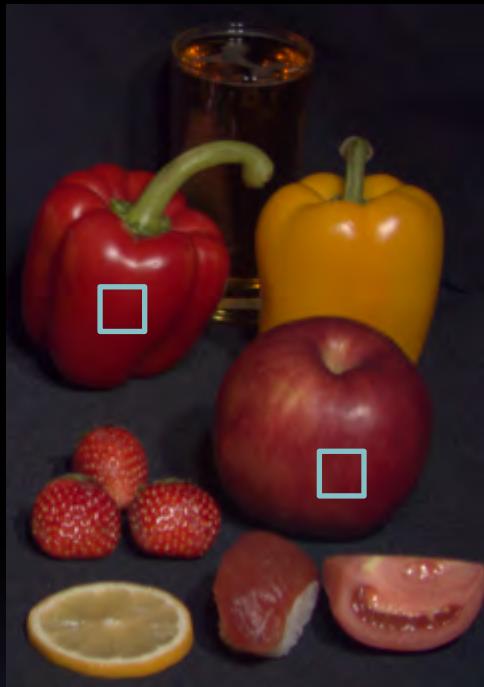
Korea Advanced Institute of Science and Technology (KAIST)

Fake or Real?

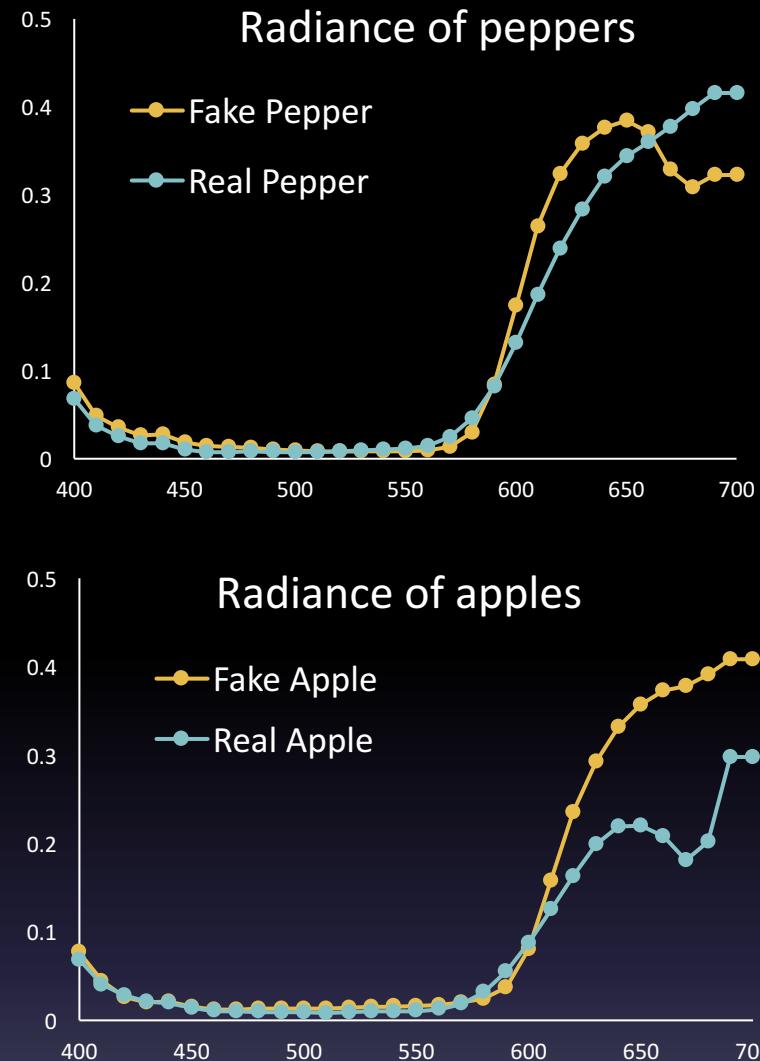
[Yasuma et al. 2008]



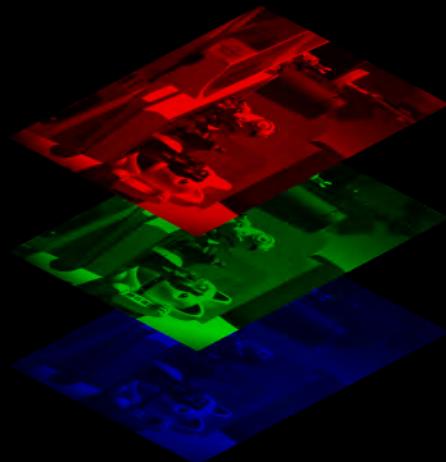
Fake



Real

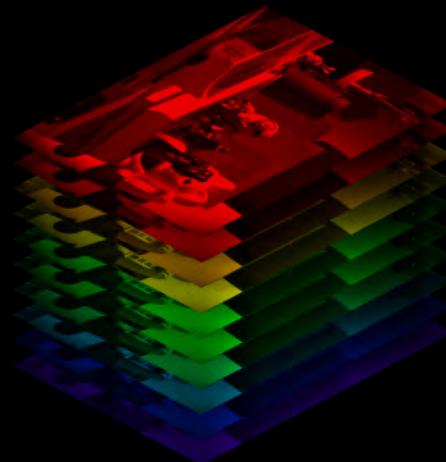


Hyperspectral Imaging



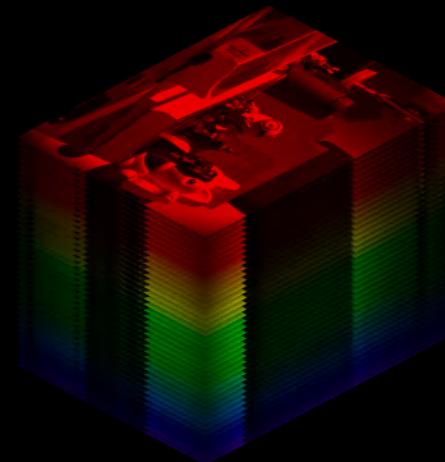
RGB Imaging

3 channels



Multispectral
Imaging

<~30 channels



Hyperspectral
Imaging

≥~30 channels

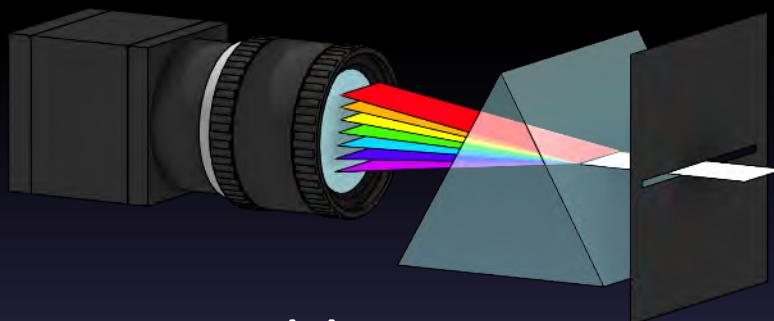
Spectroscopy Imaging



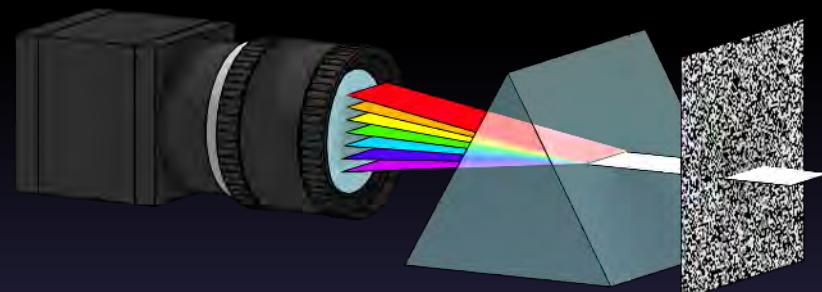
Bandpass filter
[Mansouri et al. 2007]



LCTF (liquid crystal tunable filter)
[Attas et al. 2003]



Pushbroom
[Brusco et al. 2006]

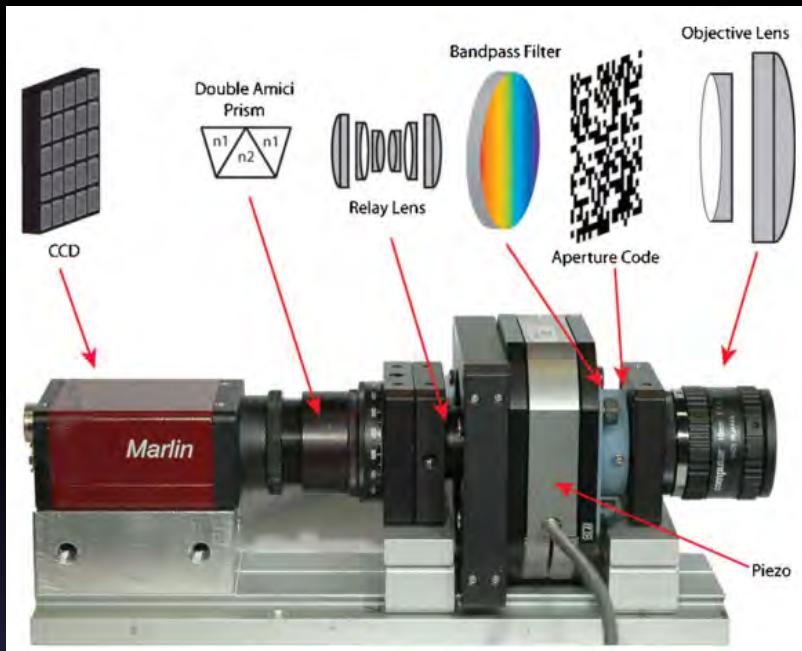


CASSI
[Wagadarikar et al. 2008]

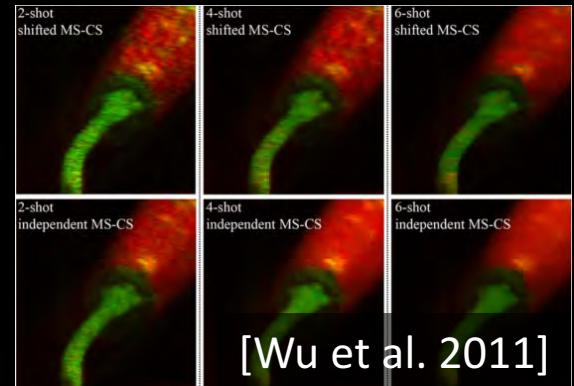
Multisampling CASSI

Mask shifting using piezo
translation stage

[Kittle et al. 2010]

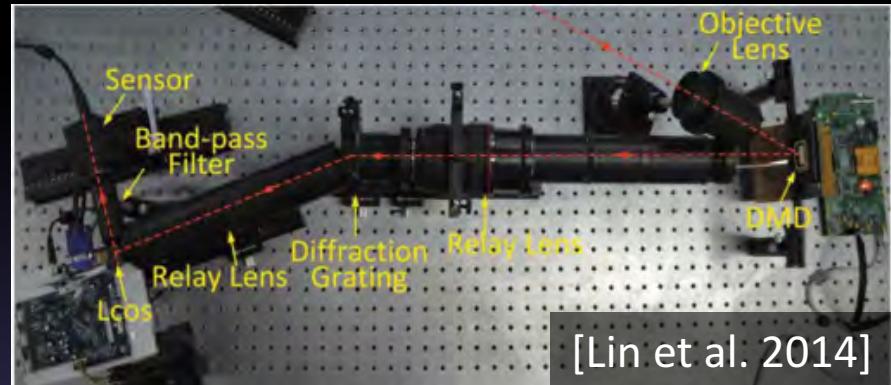


DMD (digital-micromirror-device)



[Wu et al. 2011]

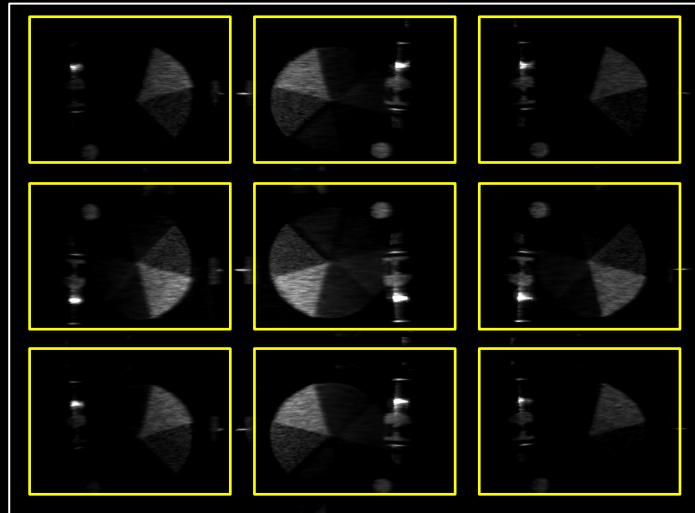
LCoS (liquid crystal on silicon)



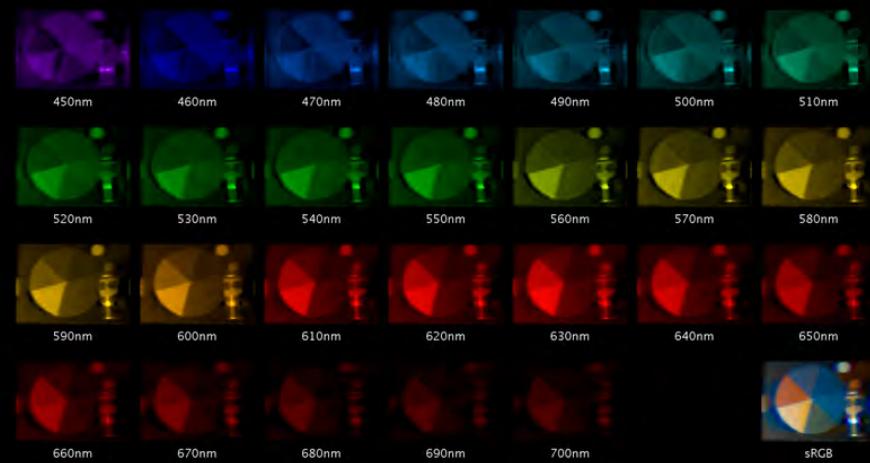
[Lin et al. 2014]

Multisampling CASSI systems require multiple captures

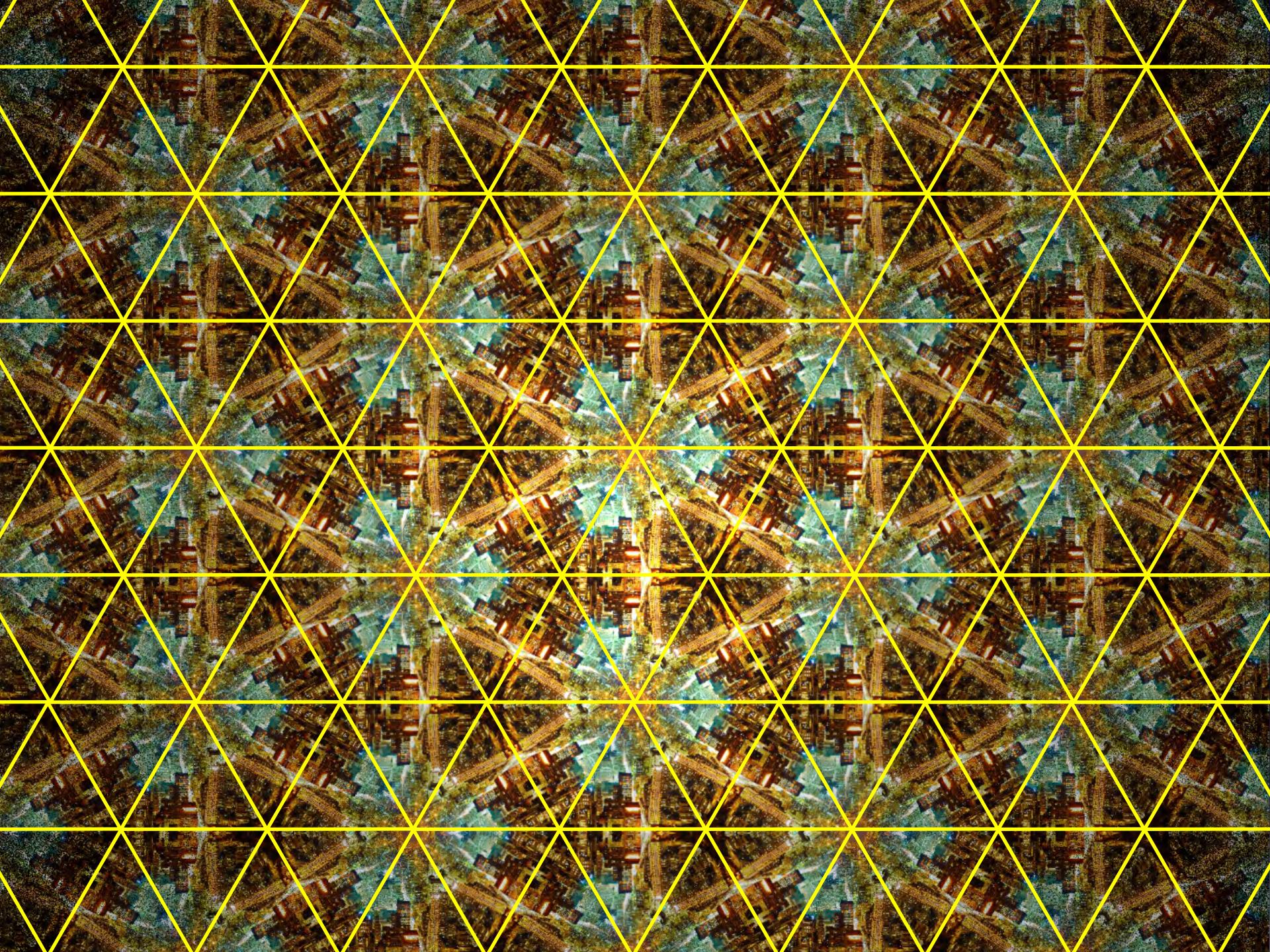
Single coded input



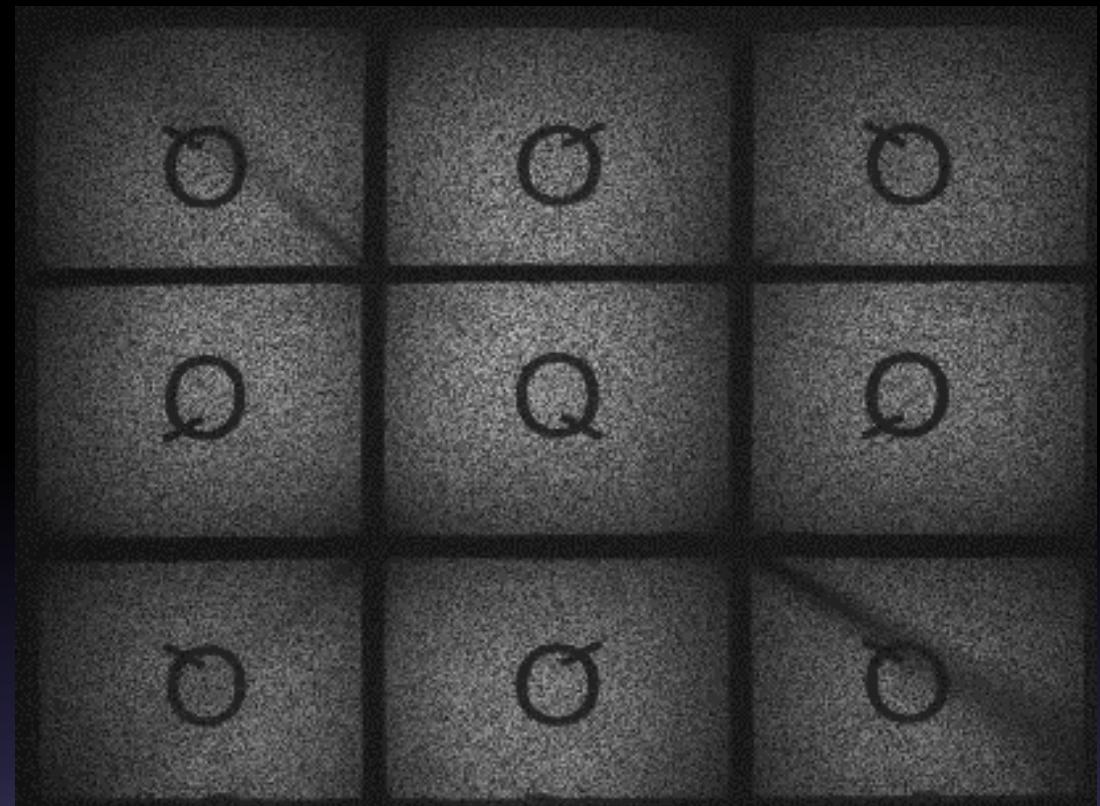
Hyperspectral video



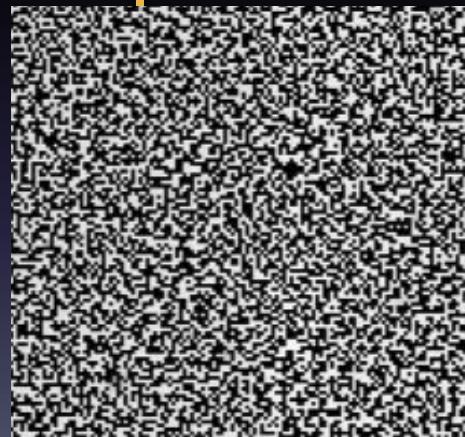
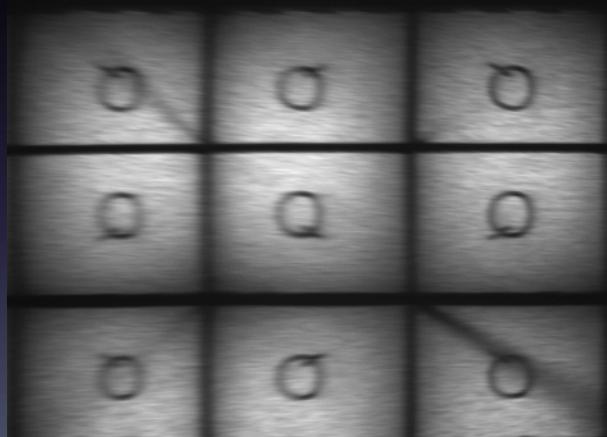
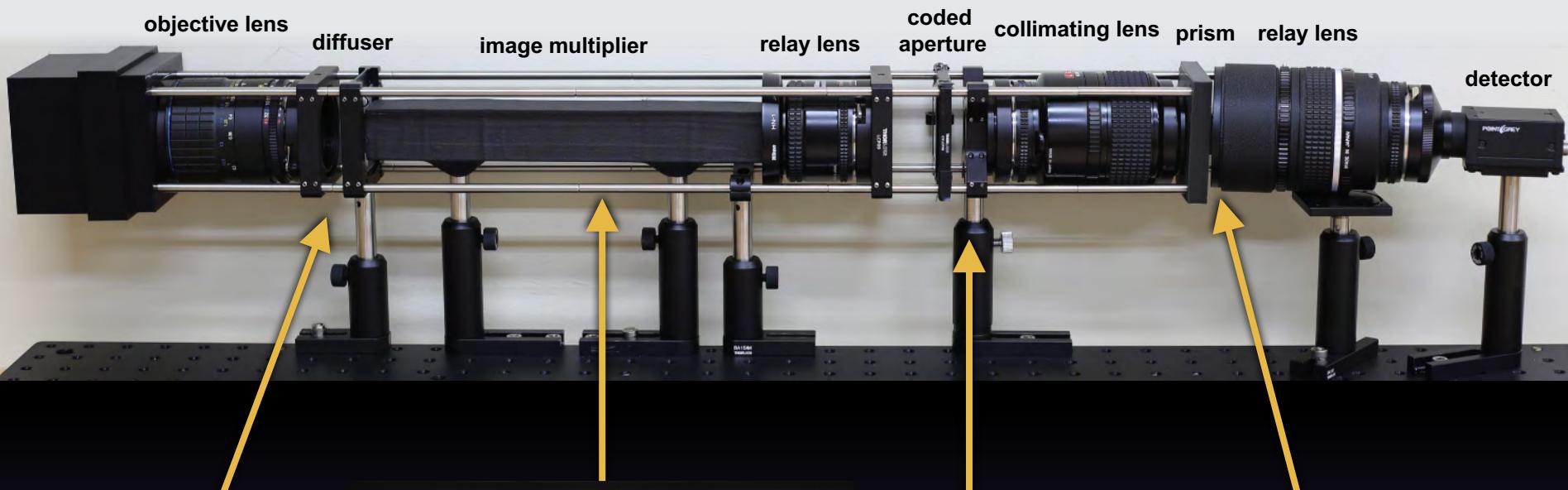
- Multisampling compressive imaging
 - High spectral resolution
 - High spatial resolution
- Single snapshot hyperspectral imaging
 - Video spectroscopy



- Coded aperture snapshot spectral camera
- Multisampling
- Kaleidoscope

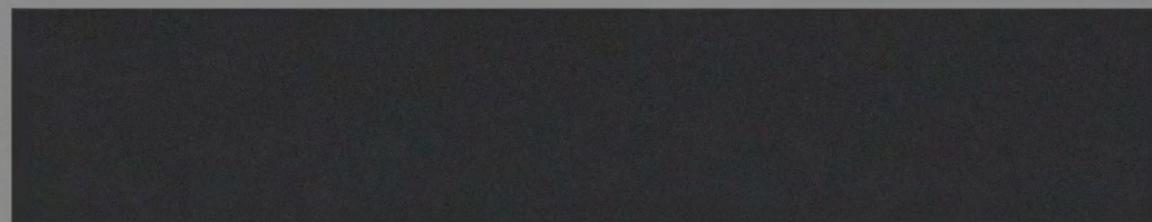


System Setup



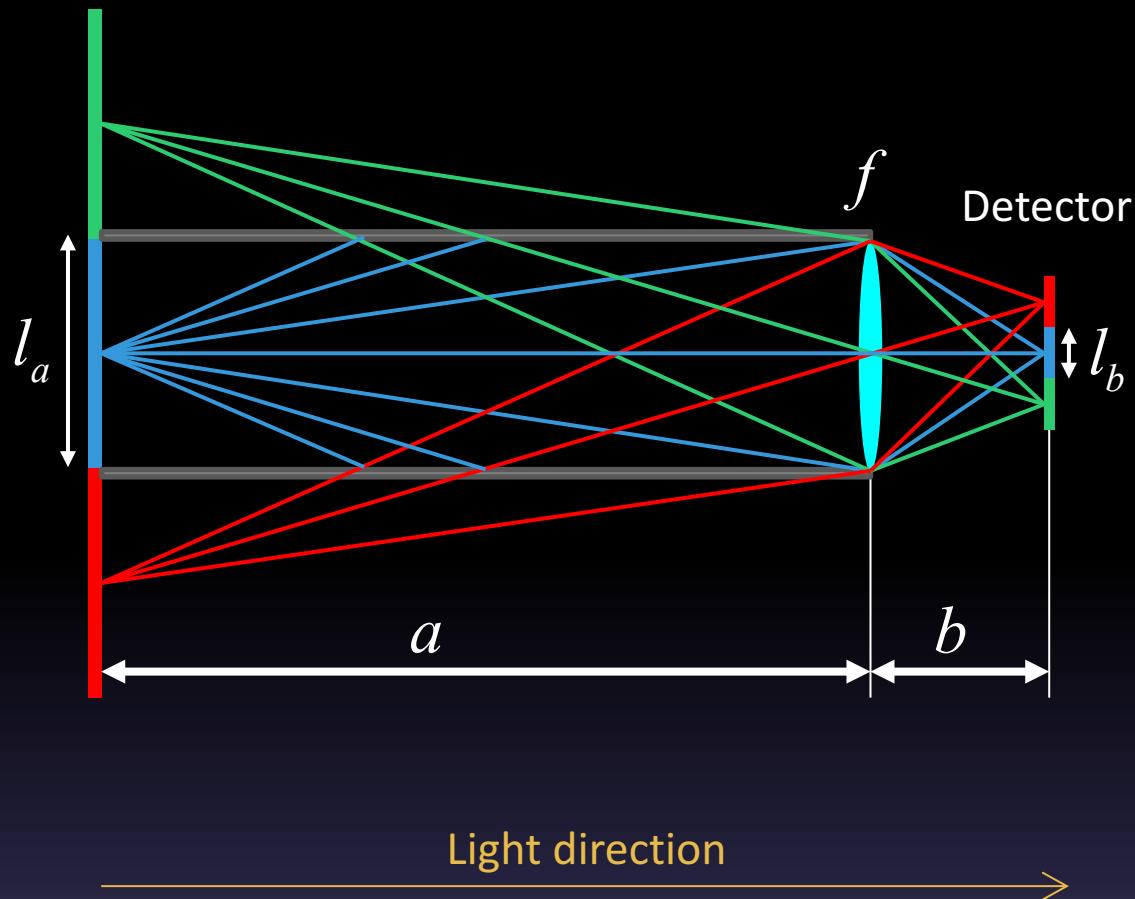
Examine Kaleidoscope

KAIST



View Multiplication

Diffuser

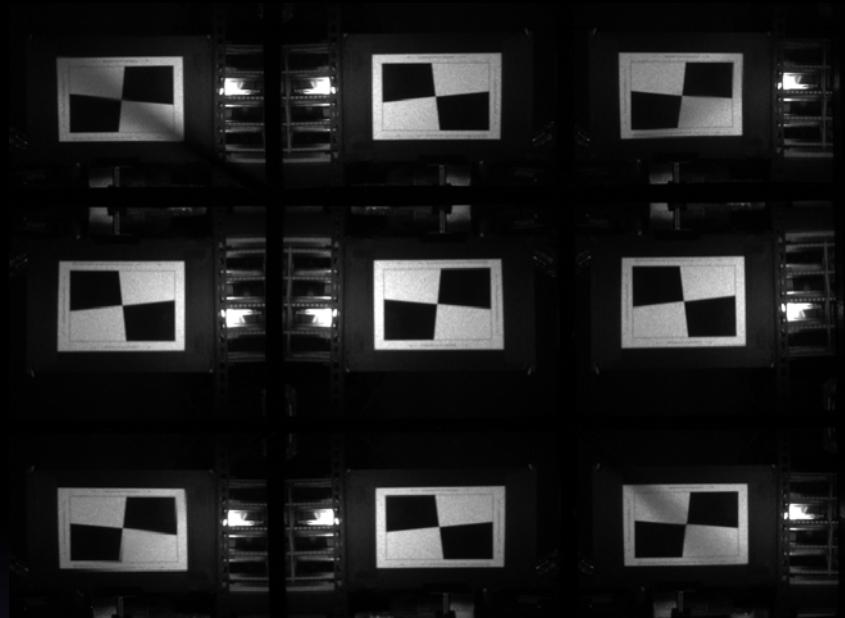


m : magnification

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

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

Effect of Diffuser

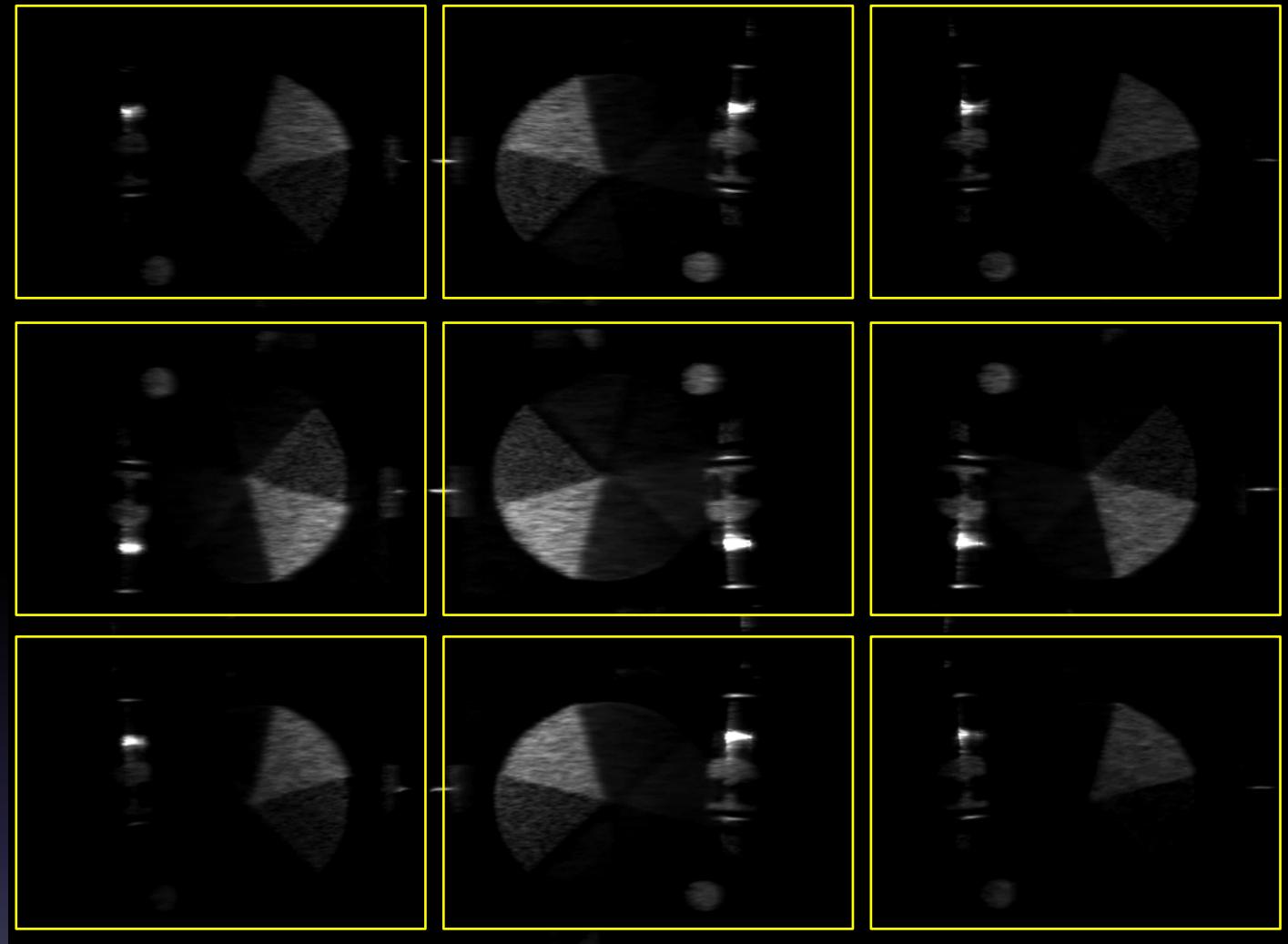


With diffuser

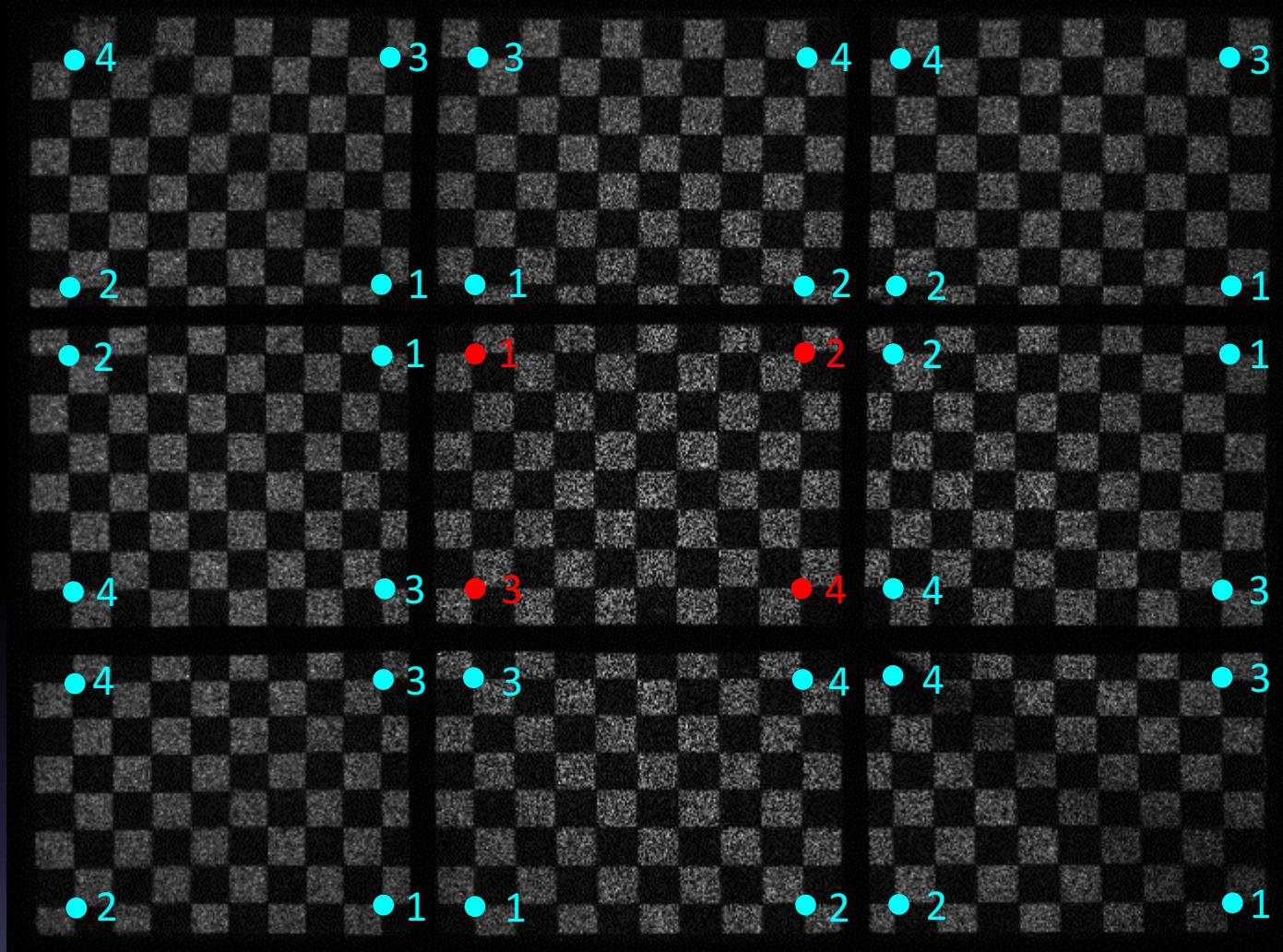


Without diffuser

Raw Input Video

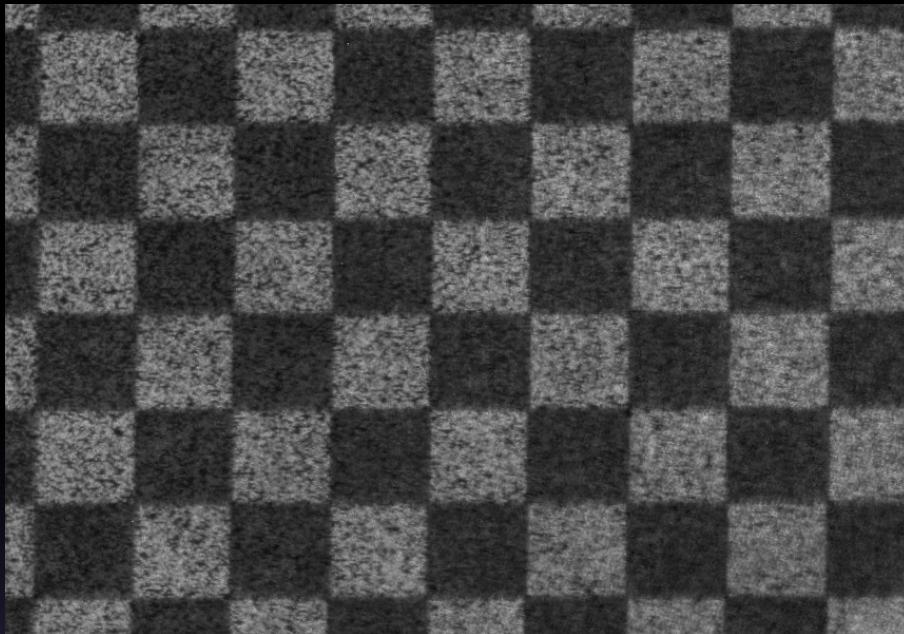


Geometric Calibration - Homography

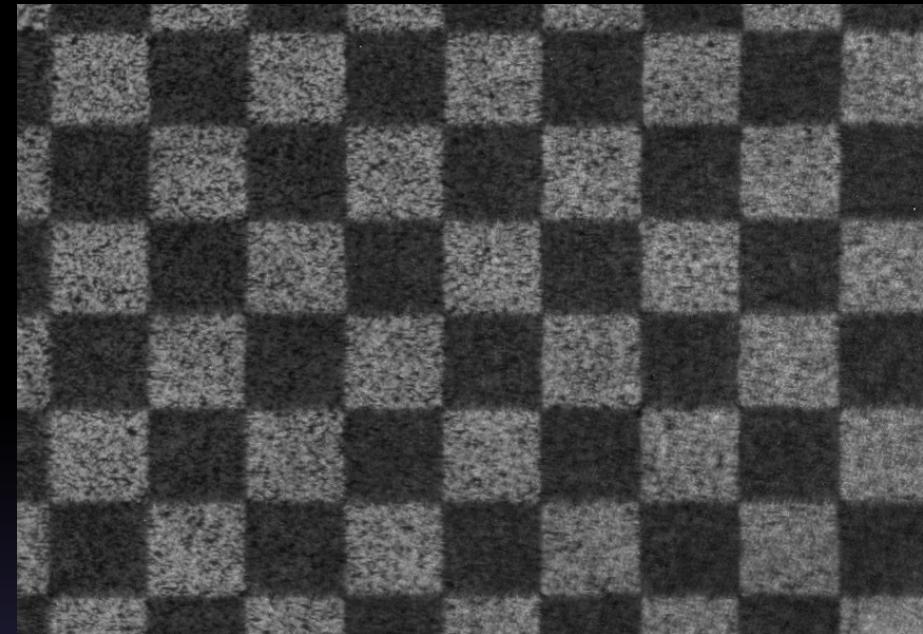


Geometric Calibration - Optical Flow

Before apply optical flow



After apply optical flow



Animated 5 views

Geometric Calibration - Dispersion Direction

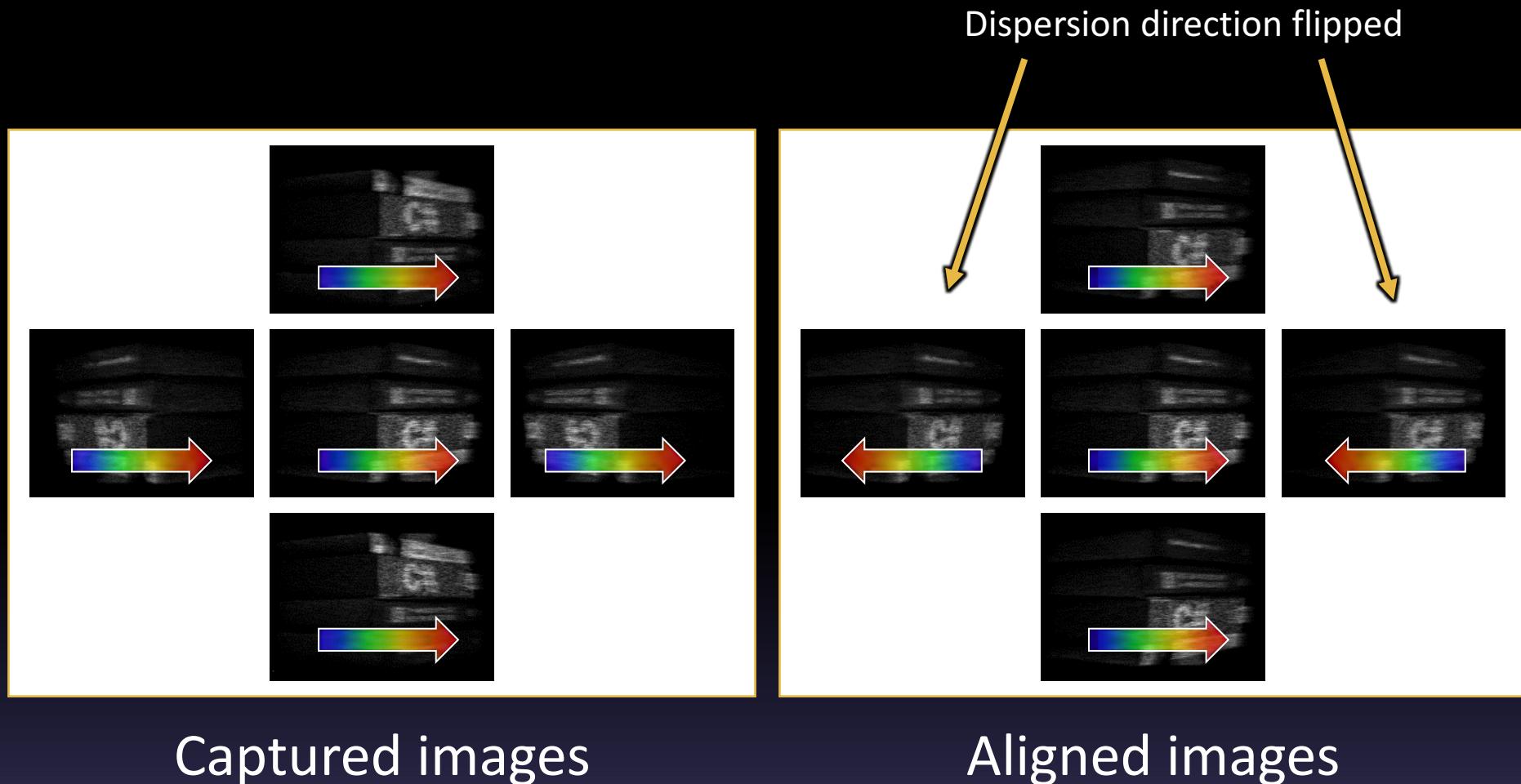
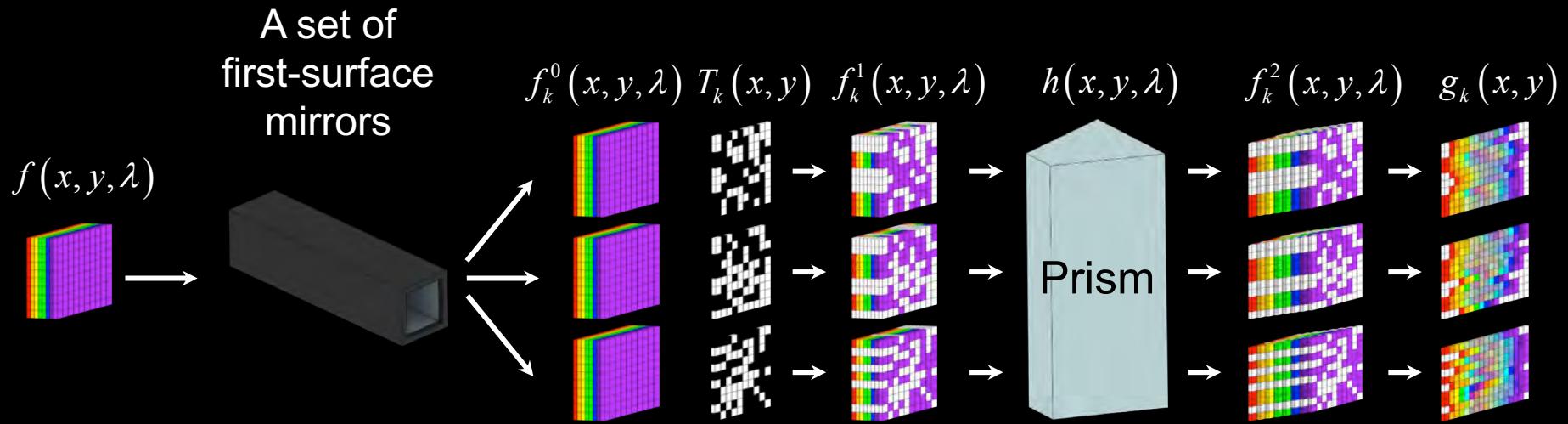


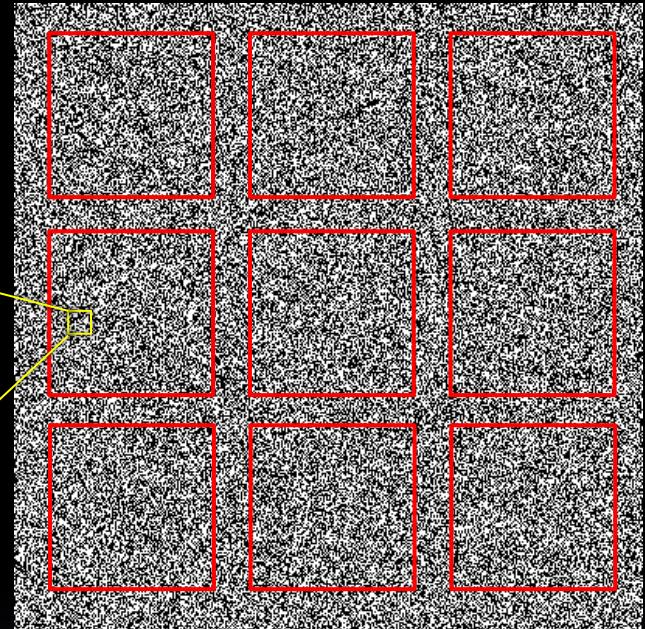
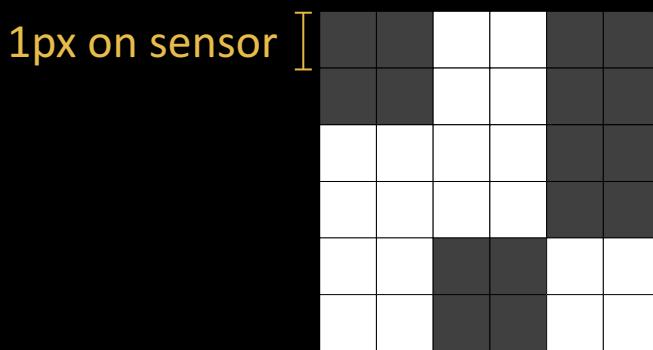
Image Reconstruction



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

Coded aperture specs

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

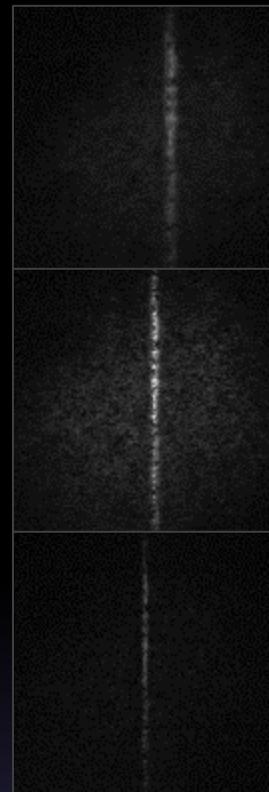
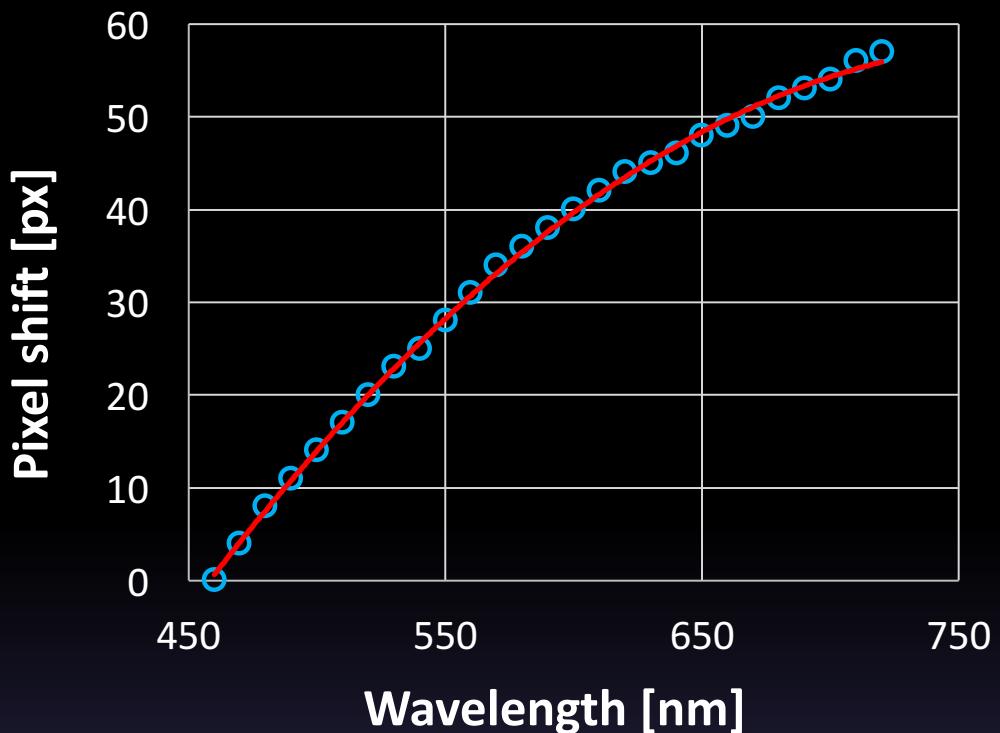


Each 9 view pass through different coded aperture patterns
→ Enable multisampling

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

Prism Dispersion

Dispersion calibration



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

Reconstruction

- Minimizing an objective function with total variation

[Bioucas-Dias and Figueiredo 2007]

$$\left\| \mathbf{g} - \mathbf{H} \cdot \mathbf{f} \right\|_2^2 + \text{TV}$$

The diagram illustrates the optimization process for reconstruction. It shows the components of the objective function:

- Detector input (3D)**: Represented by a stack of grayscale images labeled \mathbf{g} .
- Light modulation (4D)**: Represented by a stack of colored images labeled \mathbf{H} .
- Hyperspectral Image (3D)**: Represented by a stack of images labeled \mathbf{f} .
- Regularizing Sparsity (3D)**: Represented by a stack of images labeled TV .

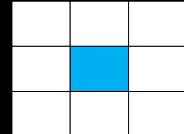
The equation consists of four terms separated by plus signs ($+$):

- $\left\| \mathbf{g} - \mathbf{H} \cdot \mathbf{f} \right\|_2^2$: The difference between the detector input \mathbf{g} and the product of light modulation \mathbf{H} and hyperspectral image \mathbf{f} , squared.
- TV : Total Variation regularization term.

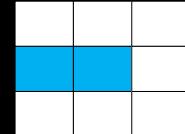
View Multiplication



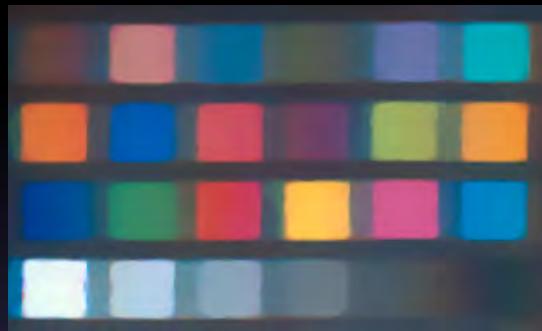
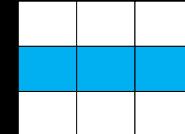
1 view



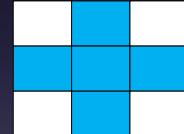
2 views



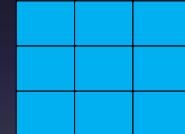
3 views



5 views



9 views



reference

(synthetic images)

Dispersion Direction

5 views without
dispersion inversion



5 views with
dispersion inversion



PSNR: 28.20
SSIM: 0.88

PSNR: 30.45
SSIM: 0.91

reference



(synthetic images)

Multiview Tradeoff

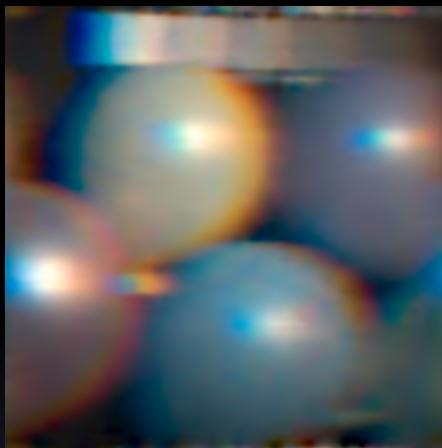
1
(full)

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

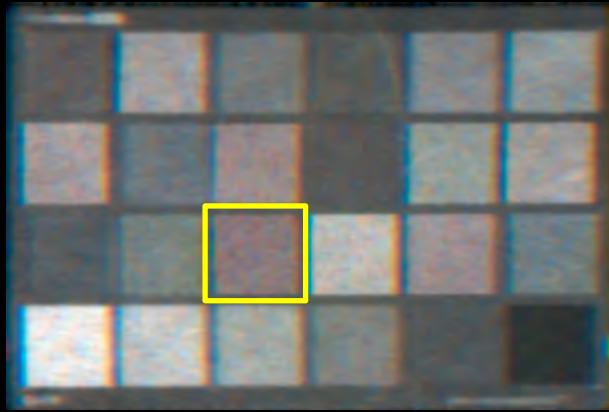


reference

(synthetic images)

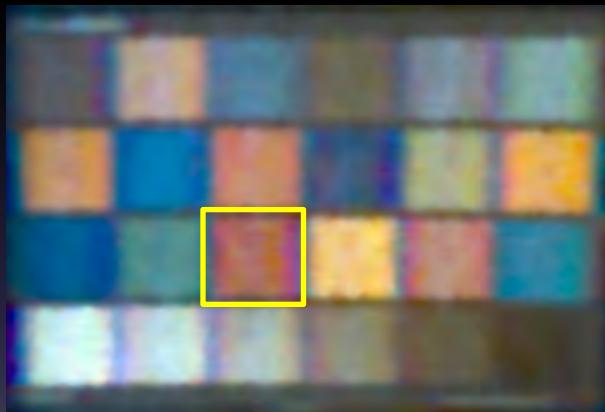
Comparison

Traditional CASSI

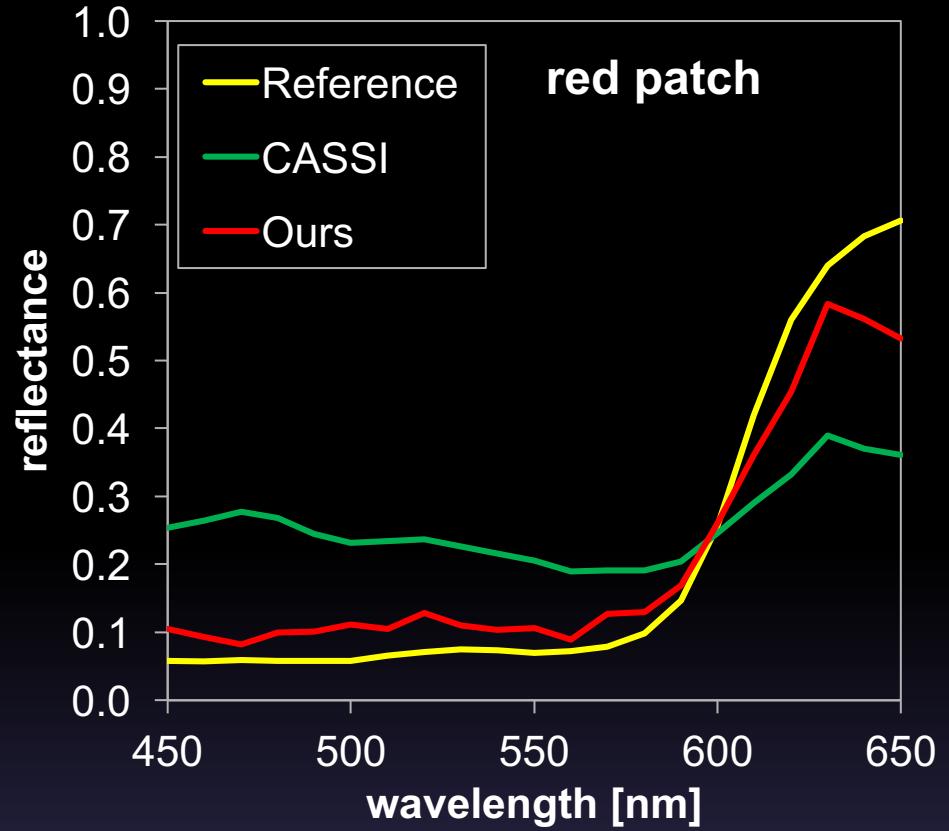


1 full view

Our multisampling CASSI

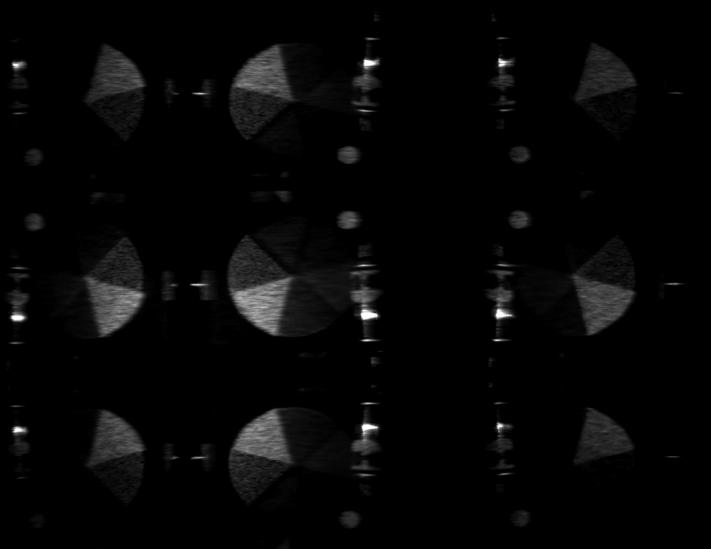


5 views

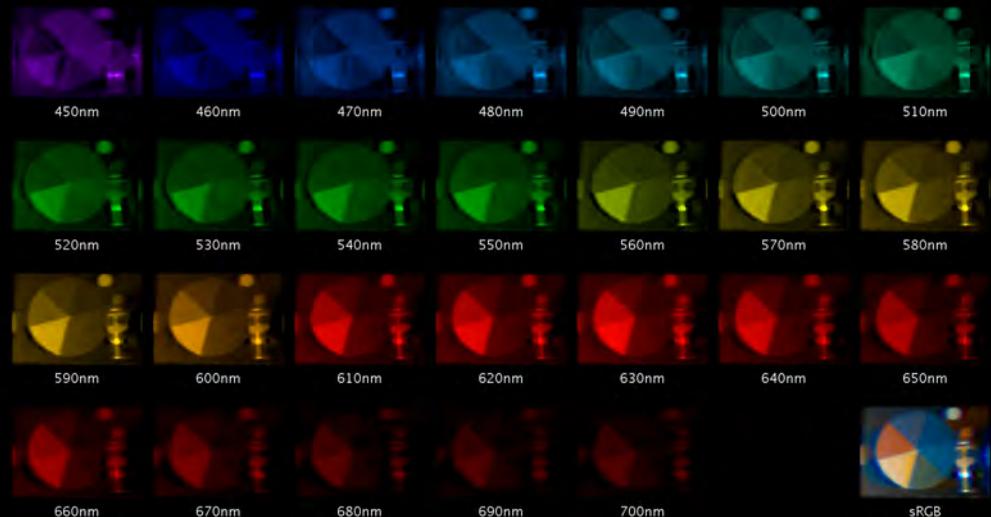


Results

Input



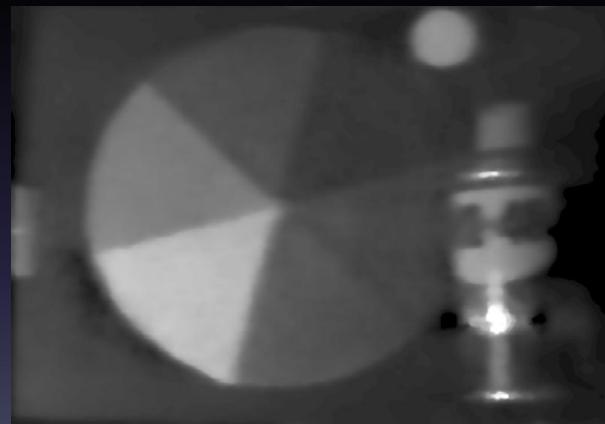
Reconstructed hyperspectral video



sRGB video

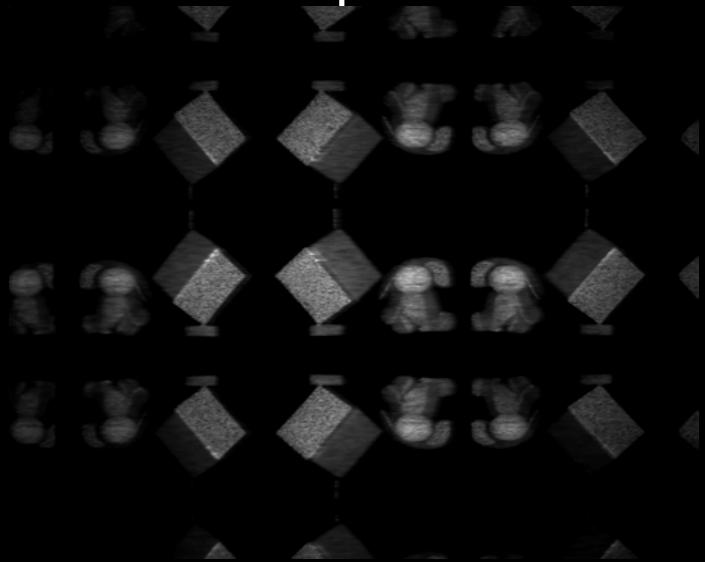


Wavelength at 600nm



Results

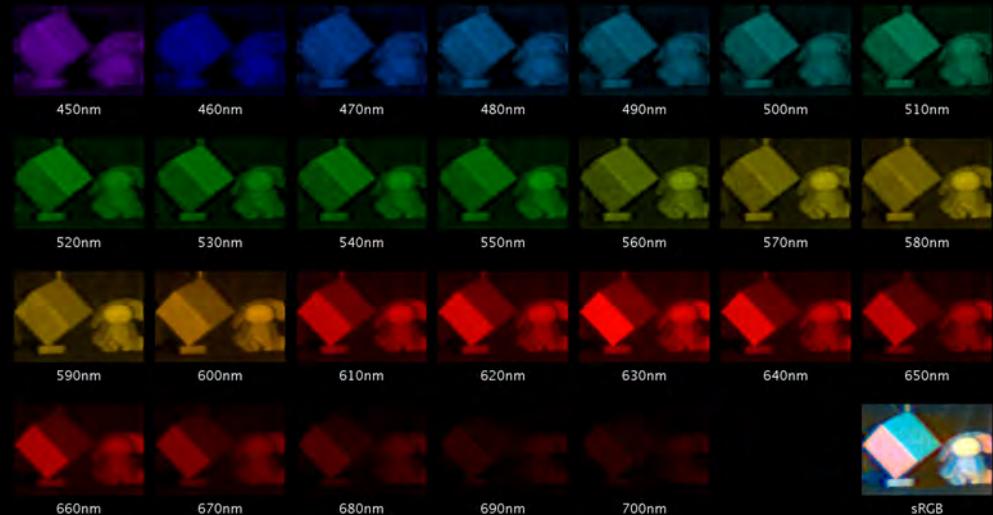
Input



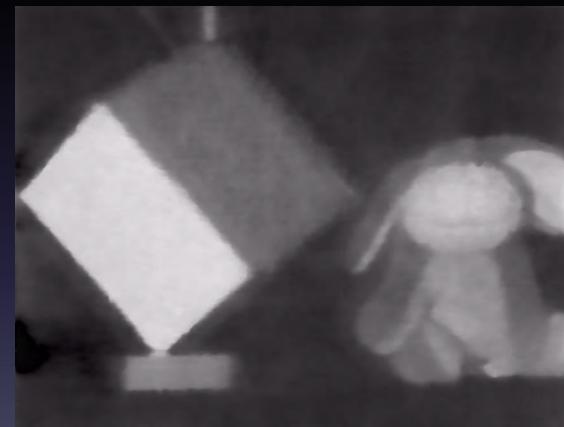
sRGB video



Reconstructed hyperspectral video



Wavelength at 600nm



Results

Input



Reconstructed hyperspectral video



sRGB video

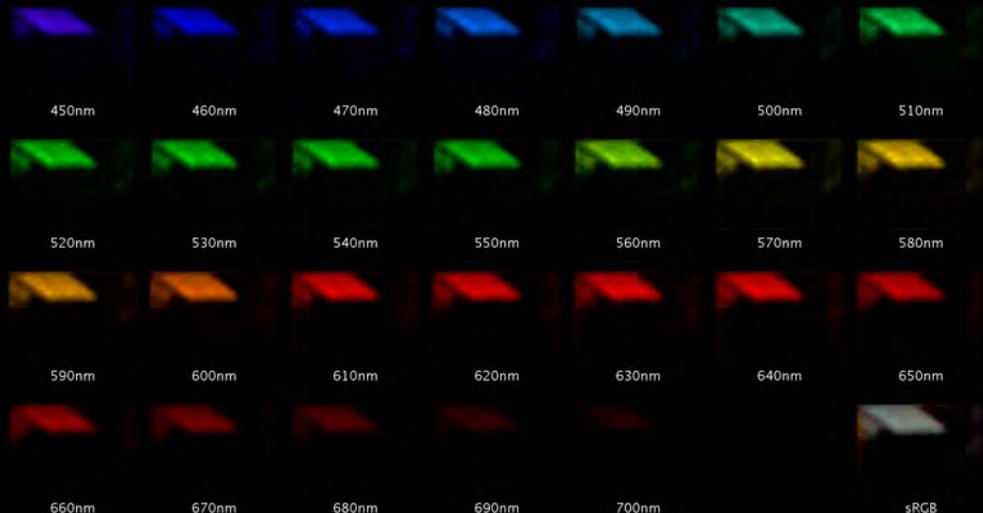
Wavelength at 600nm

Results

Input

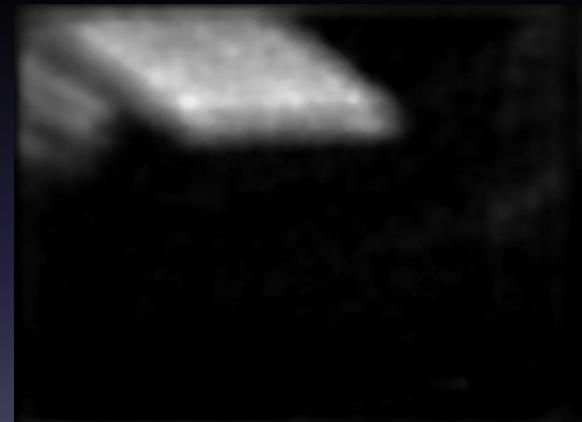


Reconstructed hyperspectral video



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

Acknowledgements



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

Thank you