# DIY hyperspectral imaging via polarization-induced spectral filters

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2022 Pasadena, California





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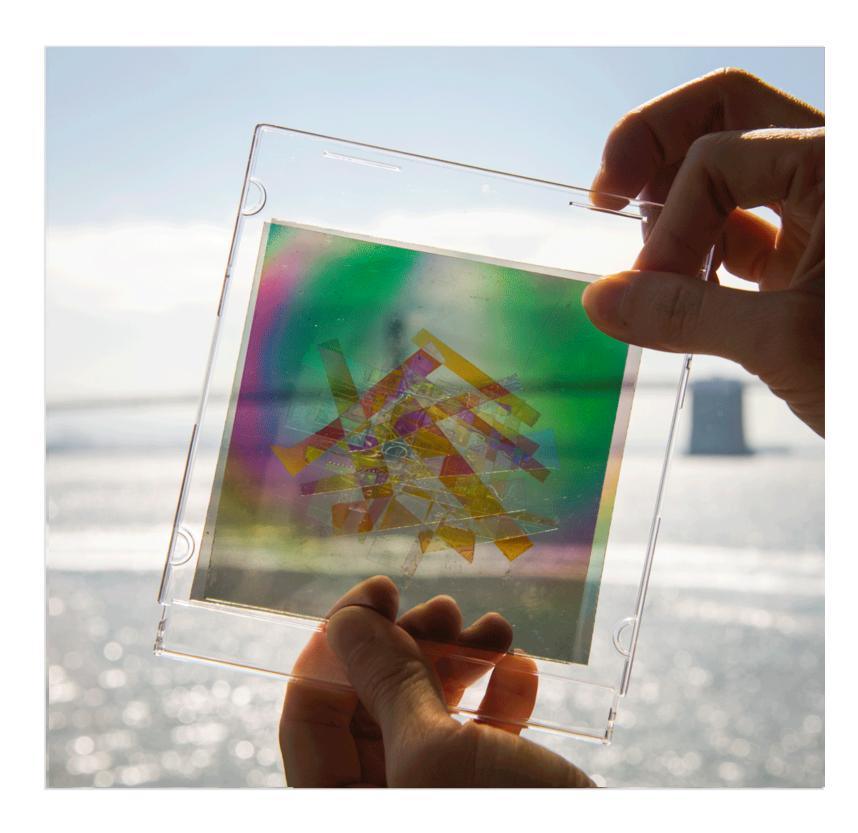
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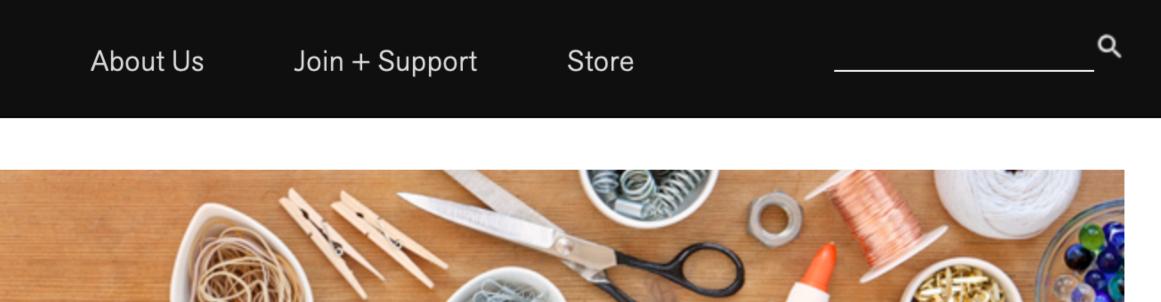
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#### Polarized-Light Mosaic

#### With polarized light, you can make a stained glass window without glass.

Using transparent tape and polarizing material, you can make and project beautifully colored patterns reminiscent of abstract or geometric stained-glass windows. Rotating the polarizer as you view the patterns makes the colors change. With a little creativity, you can also create colorful renditions of objects or scenes.

Grade Bands: 6-8 9-12 Subject: Arts · Physics: Light, Waves · Social Science: Keywords: polarized light tape color NGSS and EP&Cs: <u>PS: PS4</u> · <u>ETS</u>: <u>ETS1</u> · <u>CCCs</u>: <u>Patterns</u>, Cause and Effect, Scale, Proportion, and Quantity, Structure and Function





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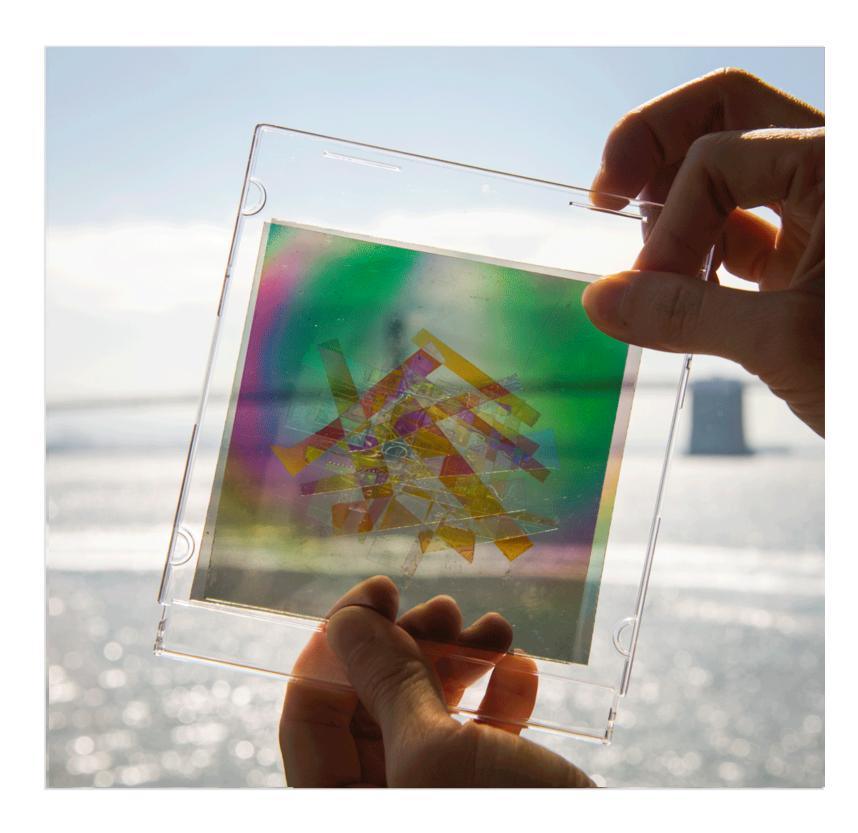
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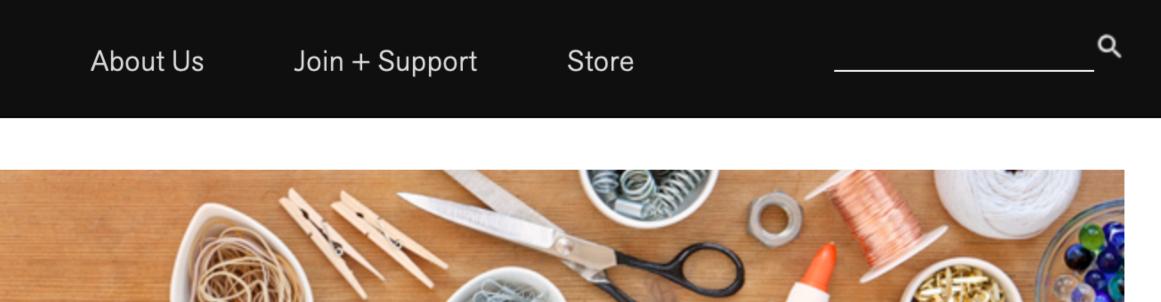
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#### **Our Inspiration**

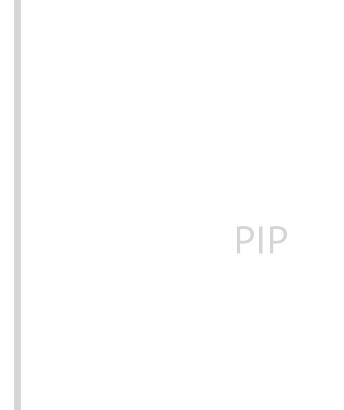
### Use this **polarization-induced color** to create a **hyperspectral camera**.











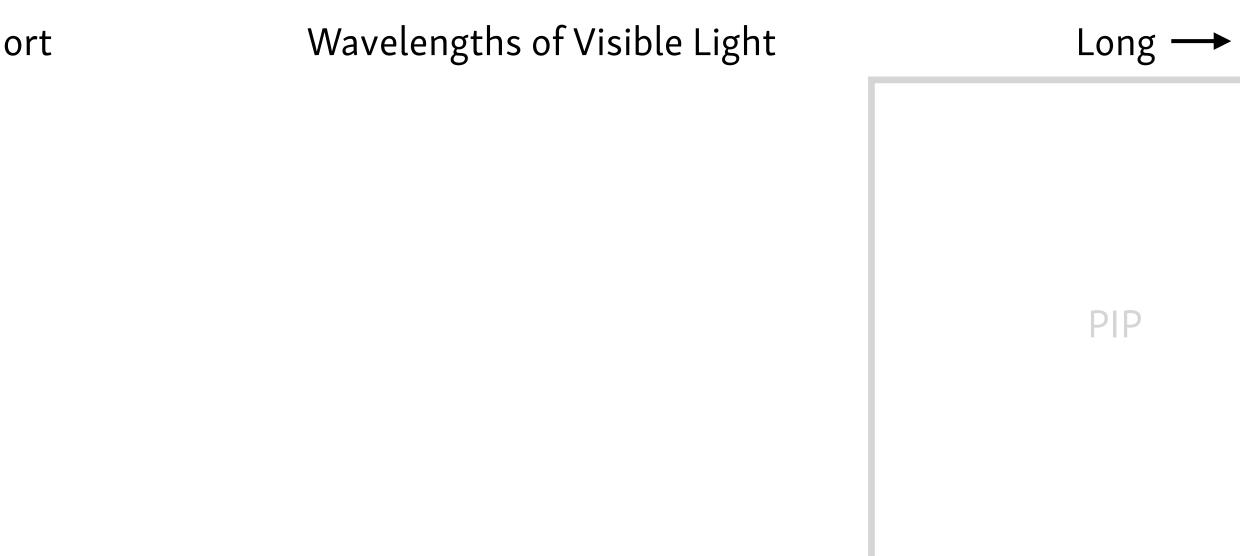




4

#### Reflectance Spectrum







### Hyperspectral Imaging

Ordinary Digital Camera



DIY hyperspectral imaging via polarization-induced spectral filters



Hyperspectral Camera

Ν	G	LAB

# Hyperspectral Imaging

#### Ordinary Digital Camera



5



Hyperspectral Camera

Ν	G	LAB

# Hyperspectral Imaging

#### Ordinary Digital Camera



DIY hyperspectral imaging via polarization-induced spectral filters

5



#### Hyperspectral Camera



Ν	G	LAB



#### VISUAL COMPUTIN



Ν	G	LAB



#### VISUAL COMPUTIN

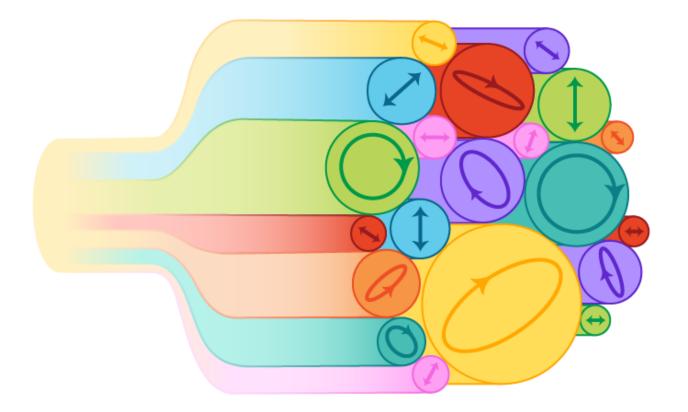


Ν	G	LAB

7 DIY hyperspectral imaging via polarization-induced spectral filters

#### DARTMOUTH VISUAL COMPUTIN

Ν	G	LAB

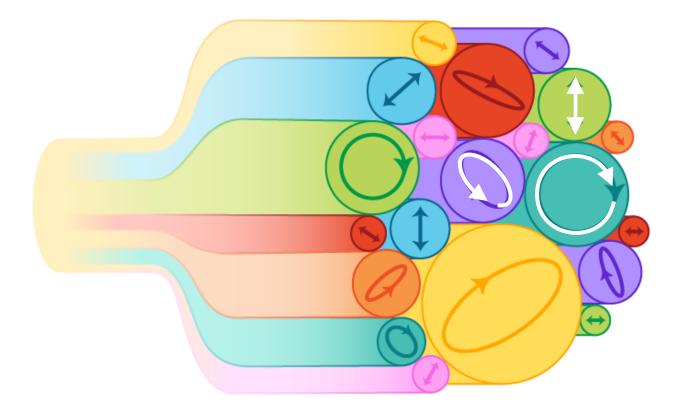


### Incoming light is composed of many wavelengths and polarization states

7 DIY hyperspectral imaging via polarization-induced spectral filters

#### VISUAL COMPUTIN

Ν	G	LAB



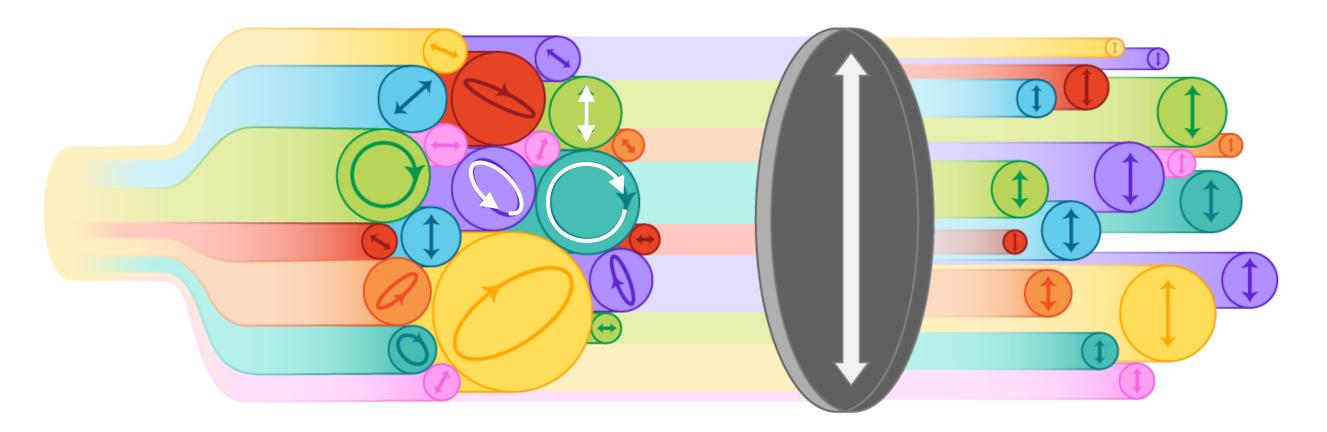
### Incoming light is composed of many wavelengths and polarization states

7 DIY hyperspectral imaging via polarization-induced spectral filters

#### VISUAL COMPUTIN

Ν	G	LAB

#### Linear polarizer



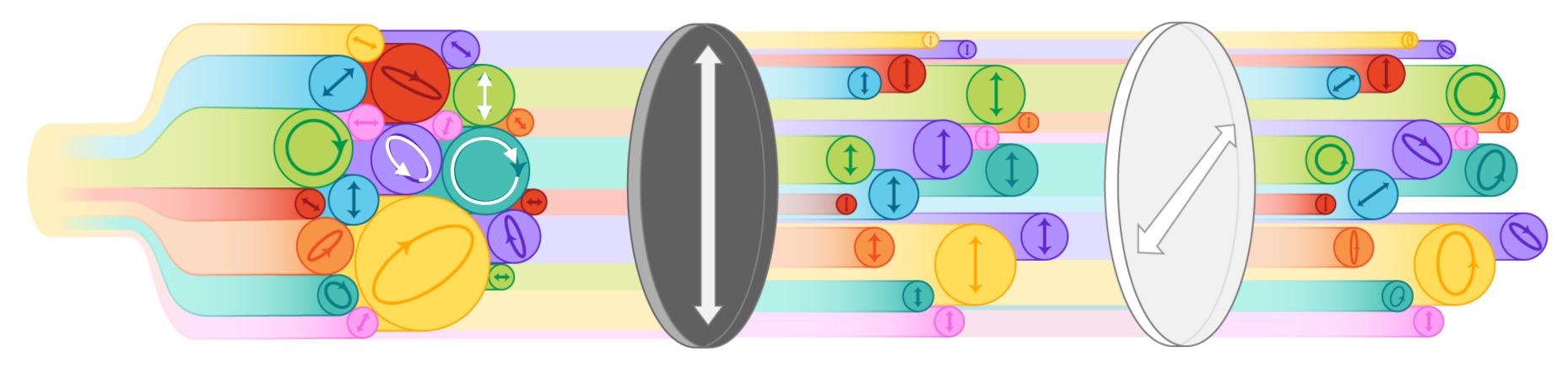
Incoming light is composed of many wavelengths and polarization states

Cuts orthogonal polarization amplitude



Ν	G	LAB

#### Linear polarizer



Incoming light is composed of many wavelengths and polarization states

Cuts orthogonal polarization amplitude

VISUAL COMPUTIN

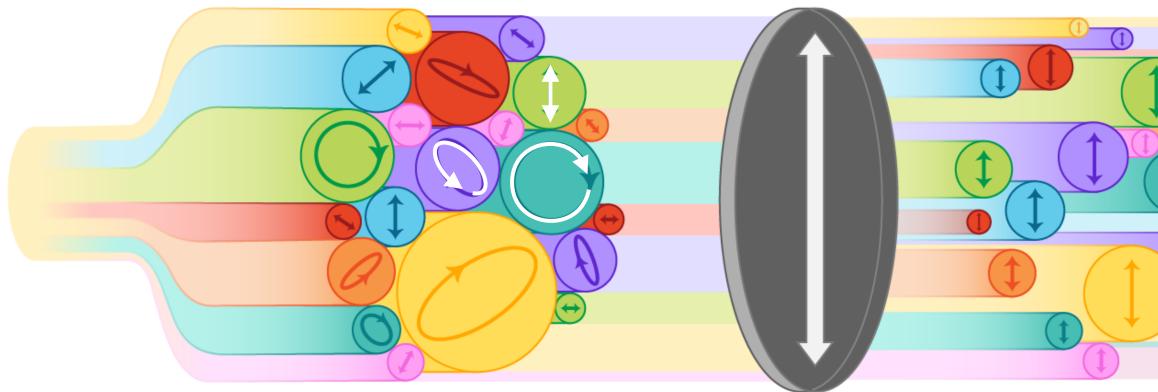
**Birefringent** (optically anisotropic) material

Causes a **wavelength-dependent** 

phase shift (alters polarization state)

Ν	G	LAB

#### Linear polarizer



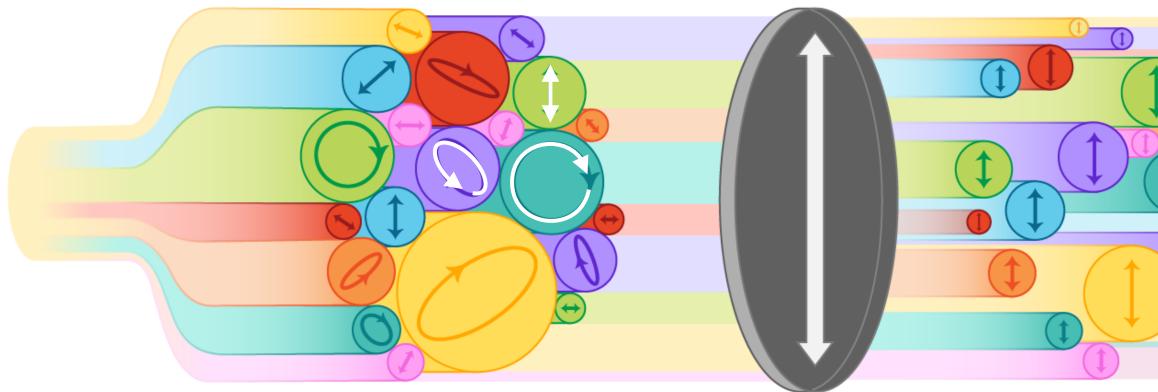
Incoming light is composed of many wavelengths and polarization states

Birefringent (optically anisotropic) Linear polarizer material Causes a **wavelength-dependent** Cuts orthogonal phase shift polarization amplitude (alters polarization state) PIP

VISUAL COMPUTIN

Ν	G	LAB

#### Linear polarizer



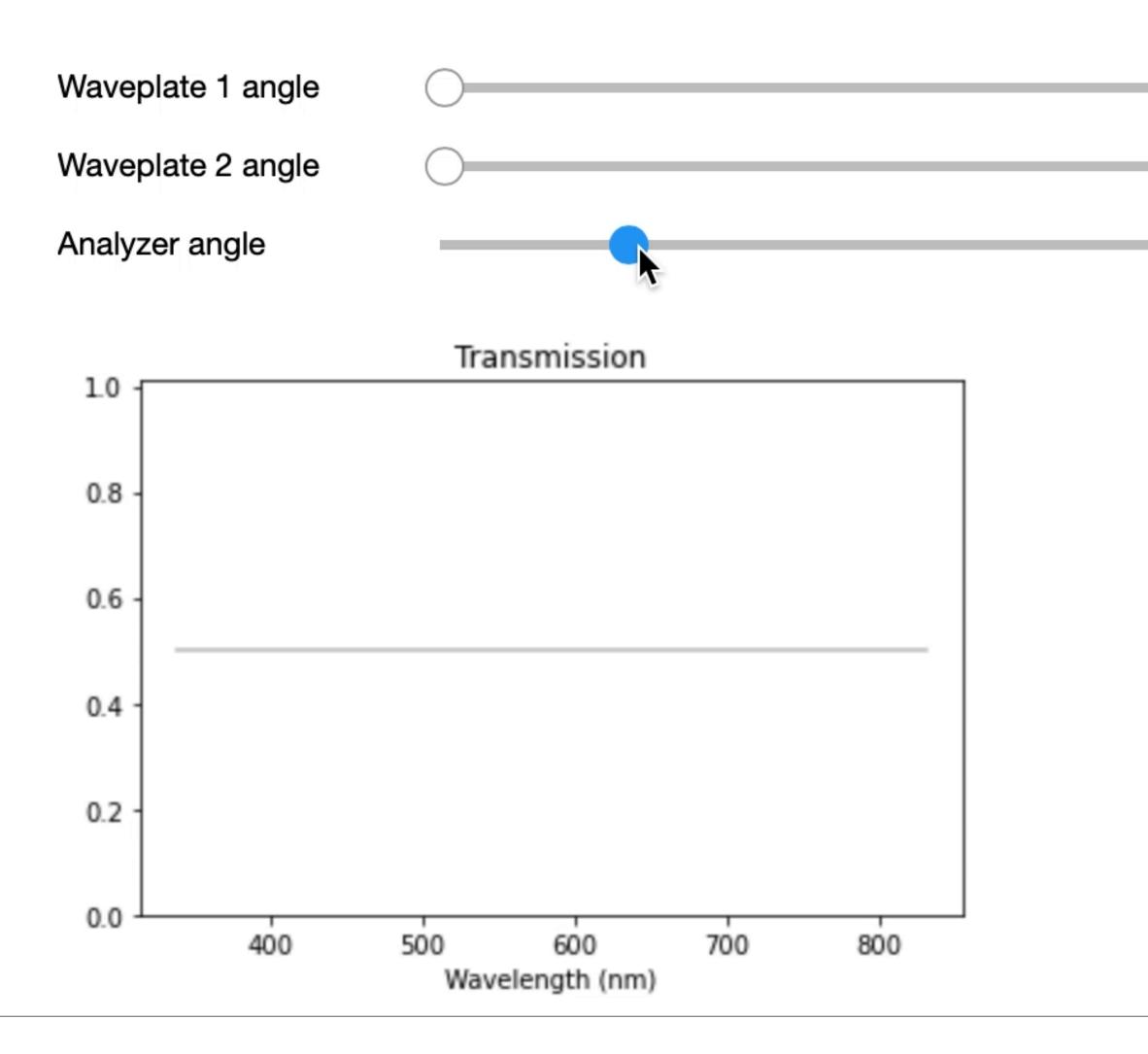
Incoming light is composed of many wavelengths and polarization states

Birefringent (optically anisotropic) Linear polarizer material Causes a **wavelength-dependent** Cuts orthogonal phase shift polarization amplitude (alters polarization state) PIP

VISUAL COMPUTIN

Ν	G	LA	B

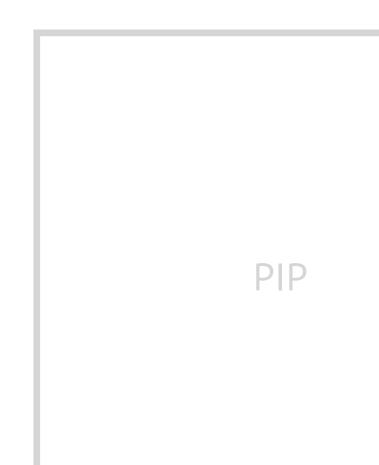




#### 8 DIY hyperspectral imaging via polarization-induced spectral filters

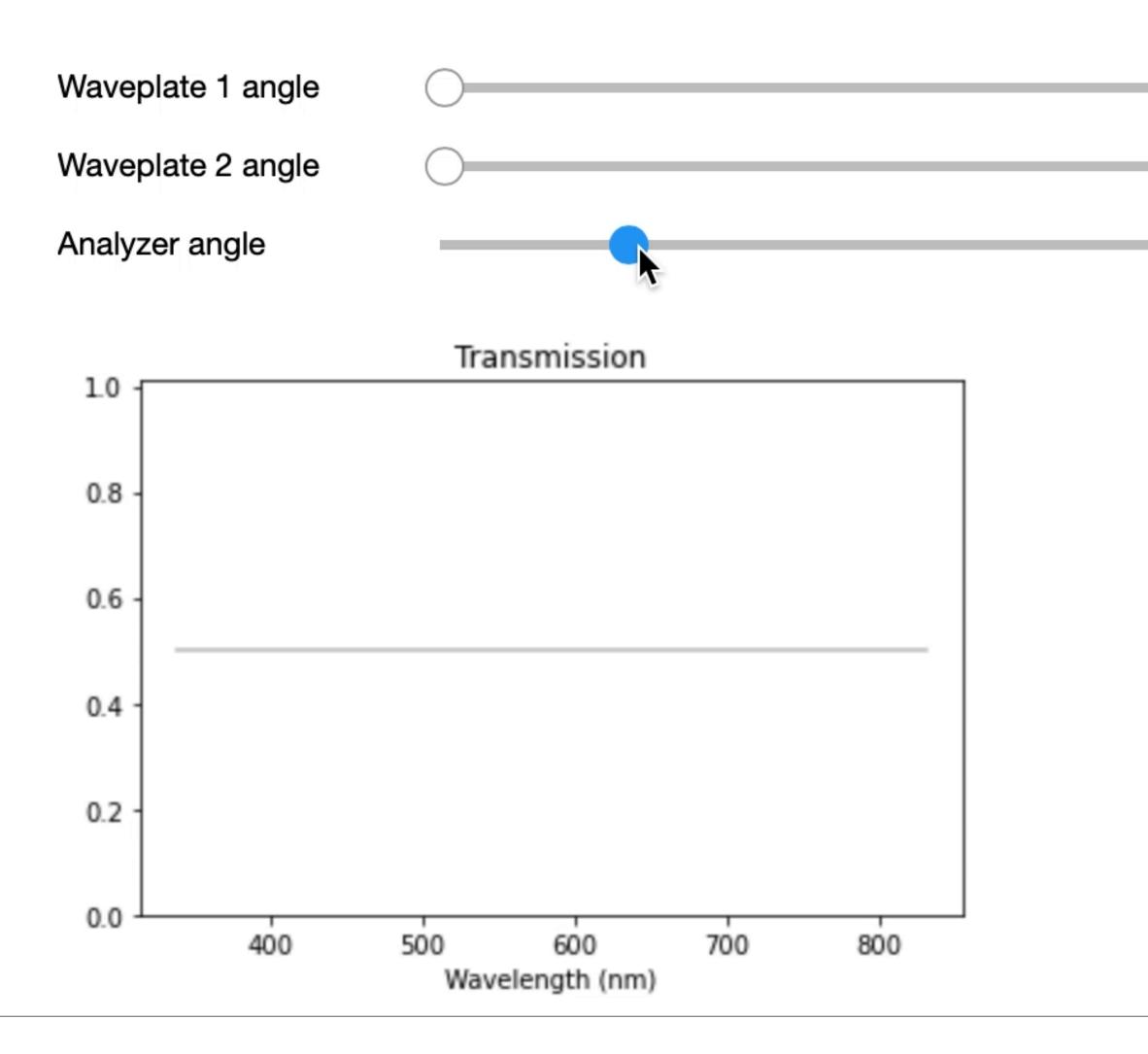
0.00	•	Can calculate transmission spectra
0.00		analytically using <b>Mueller calculu</b>

- Our filters produce a **continuous gamut** of transmission spectra
  - The range of achievable transmission spectra grows as waveplates are added to the filter



NG	LAB

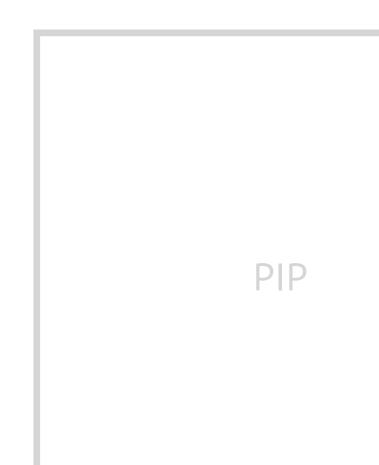
ia JS



#### 8 DIY hyperspectral imaging via polarization-induced spectral filters

0.00	•	Can calculate transmission spectra
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- Our filters produce a **continuous gamut** of transmission spectra
  - The range of achievable transmission spectra grows as waveplates are added to the filter



NG	LAB

ia JS

# Hyperspectral Imaging: Prior Work

#### [Oh et al. 2016]





#### VISUAL COMPUTIN

PIP

[Park et al. 2007] [Han et al. 2010] [Hidaka et al. 2020] [Chi and Ben-Ezra 2007]

Ν	G	LAB

### Hyperspectral Imaging: Prior Work

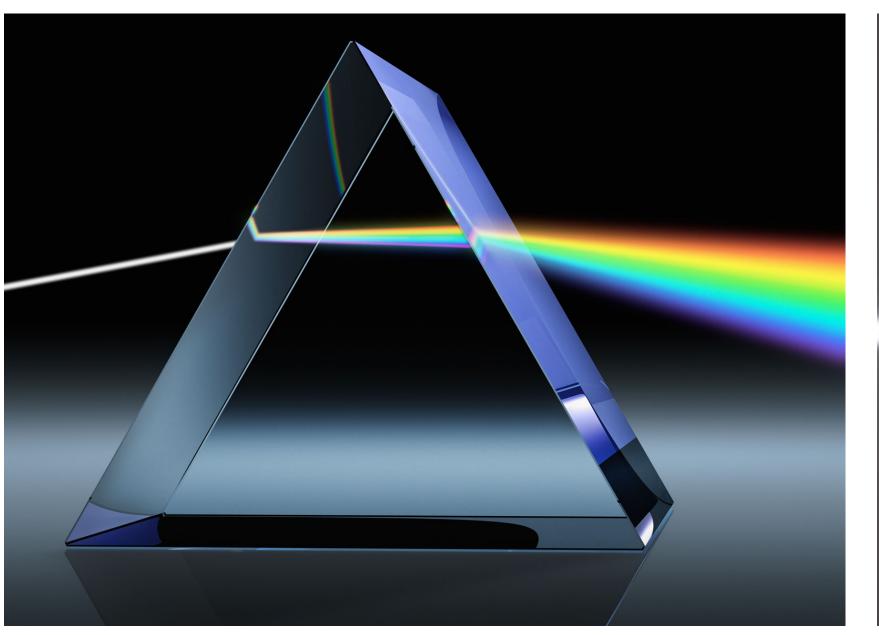
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Ν	G	LAB

# Hyperspectral Imaging: Prior Work

- Use dispersion or diffraction



Dispersion

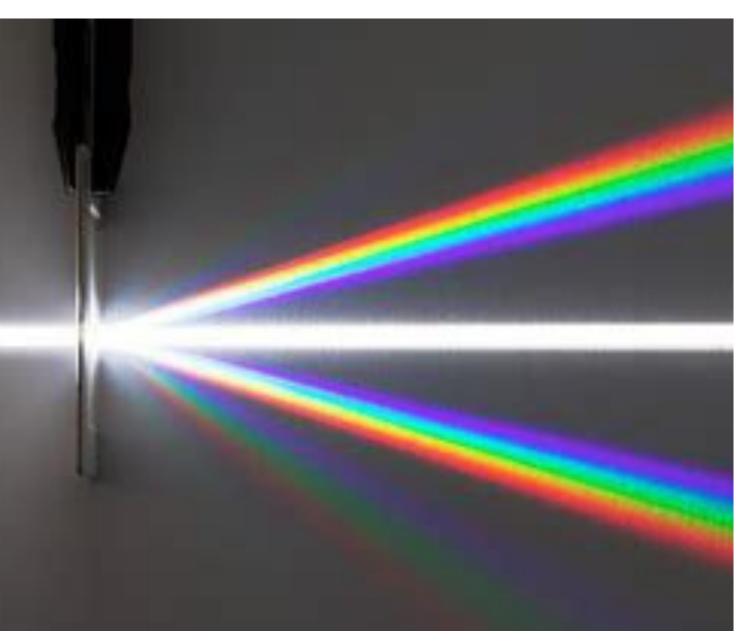
https://www.britannica.com/technology/prism-optics





#### • e.g. CASSI, computed tomography, [Du et al. 2009], [Baek et al. 2017], [Habel et al. 2012], [Jeon et al. 2019] Transform **spectral** into **spatial** information → trade off **spectral resolution** for **spatial resolution**

Diffraction



https://pixels.com/featured/light-dispersed-by-diffraction-grating-giphotostock.html

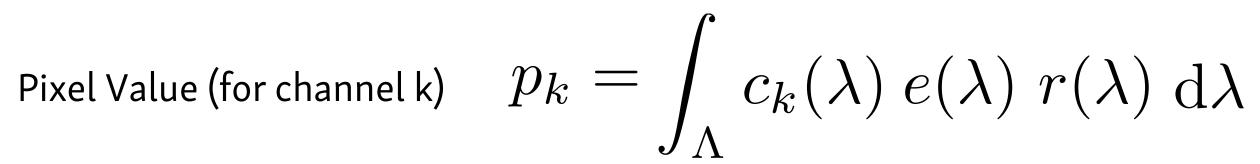
Ν	G	LAB

 $p_k = \int_{\Lambda} c_k(\lambda) \ e(\lambda) \ r(\lambda) \ d\lambda$ 

DIY hyperspectral imaging via polarization-induced spectral filters 11



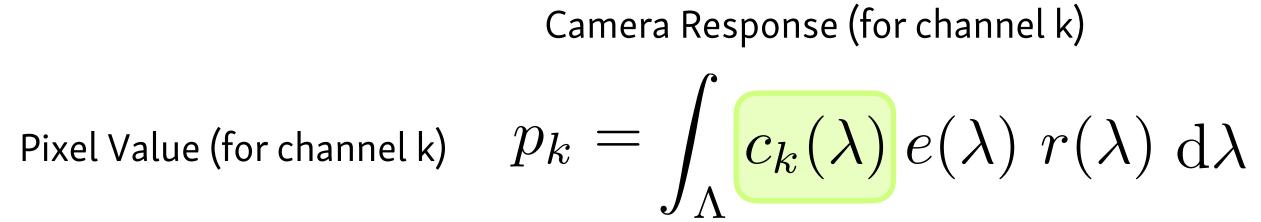
Ν	G	LAB



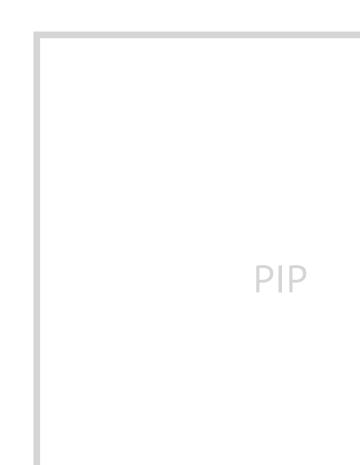
DIY hyperspectral imaging via polarization-induced spectral filters 11



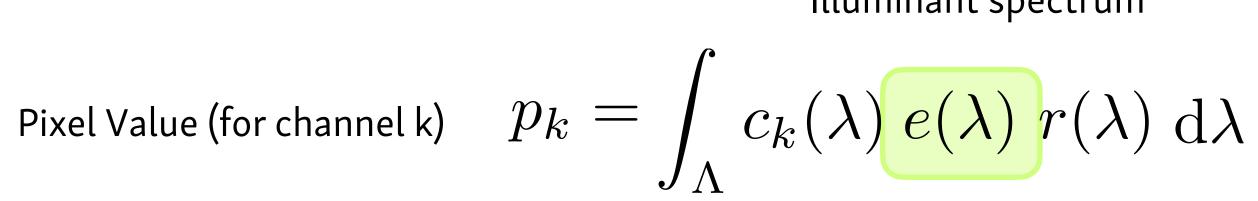
Ν	G	LAB







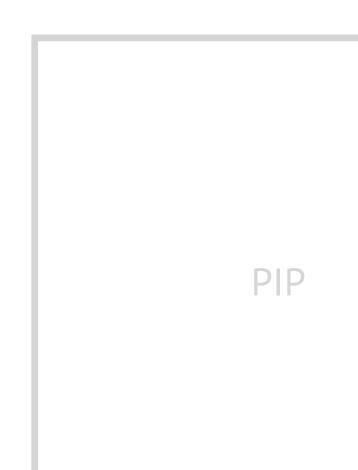
Ν	G	LAB



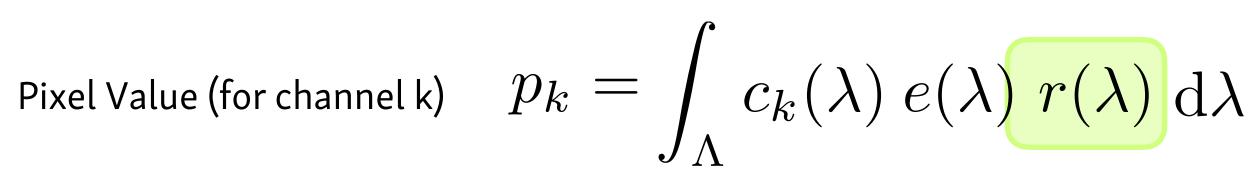
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Illuminant spectrum



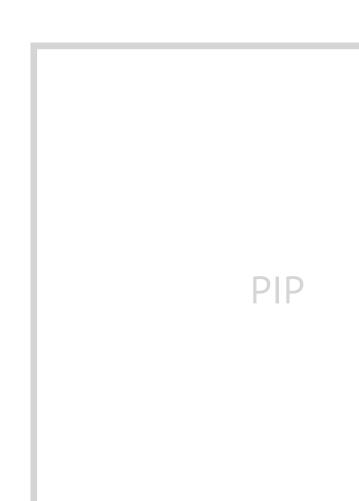
Ν	G	LAB



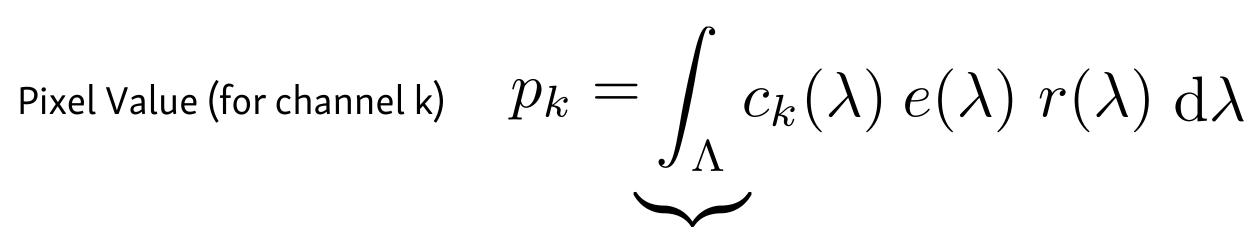
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Reflectance spectrum (unknown)



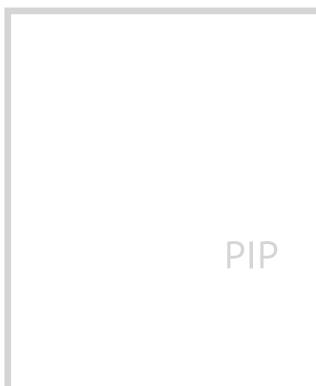
Ν	G	LAB



All Visible Wavelengths

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Ν	G	LAB

$$p_k = \int_{\Lambda} c_k(\lambda) \ t$$

12 DIY hyperspectral imaging via polarization-induced spectral filters



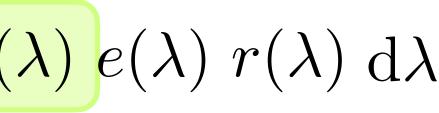
#### $t(\lambda) \ e(\lambda) \ r(\lambda) \ d\lambda$

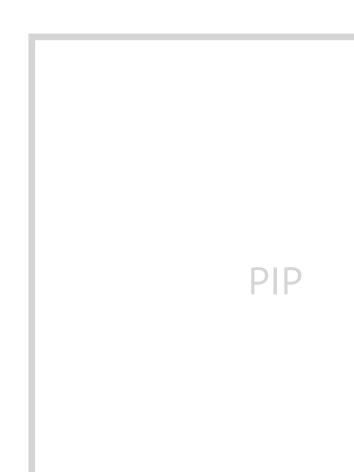
Ν	G	LAB

Filter Transmission Spectrum

 $p_k = \int_{\Lambda} c_k(\lambda) t(\lambda) e(\lambda) r(\lambda) d\lambda$ 







Ν	G	LAB

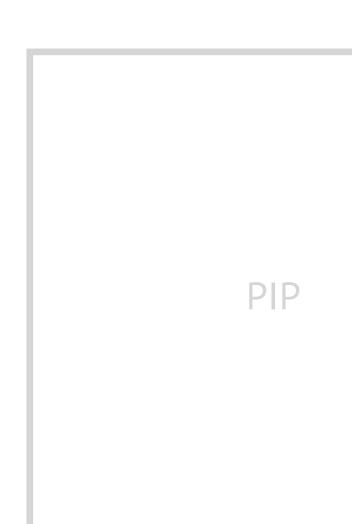
Convert continuous functions to discrete vectors by sampling N wavelengths: (also determines the **spectral resolution** of the system)

$$p_k = \int_{\Lambda} c_k(\lambda) t$$



 $t(\lambda) \ e(\lambda) \ r(\lambda) \ d\lambda$ 

( $\odot$  is component-wise multiplication)



Ν	G	LAB

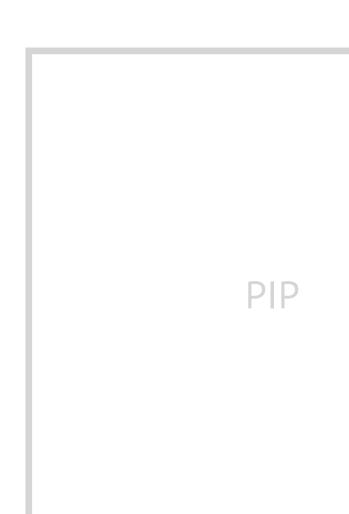
Convert continuous functions to discrete vectors by sampling *N* wavelengths: (also determines the **spectral resolution** of the system)

 $p_k = \mathbf{c}_k \odot \mathbf{t} \odot \mathbf{e} \odot \mathbf{r}$ 

( is component-wise multiplication)

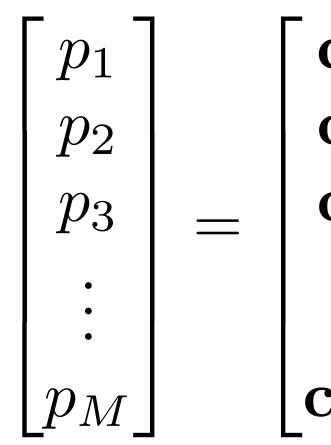
13 DIY hyperspectral imaging via polarization-induced spectral filters





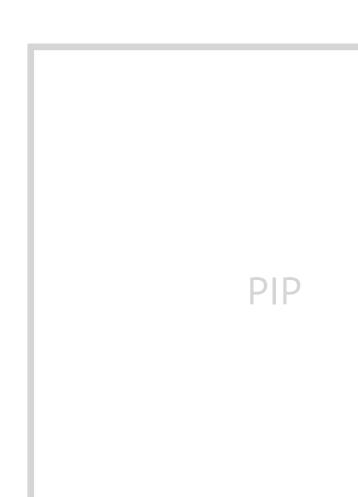
Ν	G	LAB

If we take measurements of the spectrum through a set of M **filters** with **transmission spectra** t<sub>1</sub>, ..., t<sub>M</sub>:



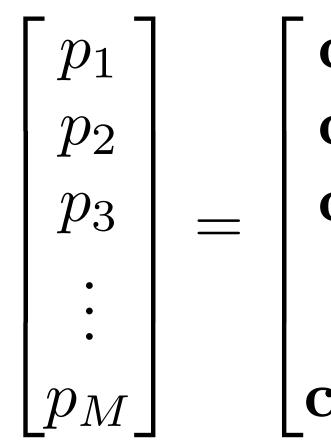


```
\begin{bmatrix} p_1 \\ p_2 \\ p_3 \\ \vdots \\ p_M \end{bmatrix} = \begin{bmatrix} \mathbf{c}_k \odot \mathbf{t}_1 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_2 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_3 \odot \mathbf{e} \\ \vdots \\ \mathbf{c}_k \odot \mathbf{t}_M \odot \mathbf{e} \end{bmatrix} \begin{bmatrix} \mathbf{r} \\ \end{bmatrix}
```



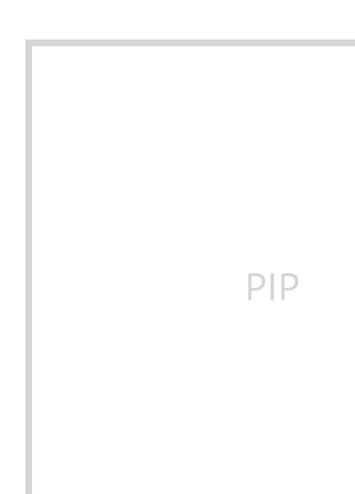
Ν	G	LAB

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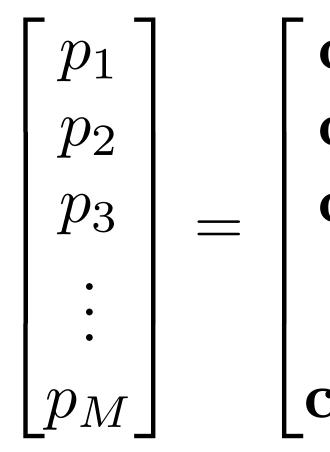


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\begin{bmatrix} p_1 \\ p_2 \\ p_3 \\ \vdots \\ p_M \end{bmatrix} = \begin{bmatrix} \mathbf{c}_k \odot \mathbf{t}_1 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_2 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_3 \odot \mathbf{e} \\ \vdots \\ \mathbf{c}_k \odot \mathbf{t}_M \odot \mathbf{e} \end{bmatrix} \begin{bmatrix} \mathbf{r} \\ \end{bmatrix}
```



Ν	G	LAB

If we take measurements of the spectrum through a set of M **filters** with **transmission spectra** t<sub>1</sub>, ..., t<sub>M</sub>:



Can use a least squares solver with constraints (smoothness, positive, etc.) to solve for **r**!

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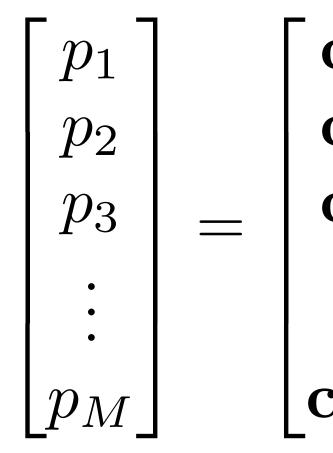


```
\begin{bmatrix} p_1 \\ p_2 \\ p_3 \\ \vdots \\ p_M \end{bmatrix} = \begin{bmatrix} \mathbf{c}_k \odot \mathbf{t}_1 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_2 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_3 \odot \mathbf{e} \\ \vdots \\ \mathbf{c}_k \odot \mathbf{t}_M \odot \mathbf{e} \end{bmatrix} \begin{bmatrix} \mathbf{r} \end{bmatrix}
```

Ν	G	LAB

# Image Model

If we take measurements of the spectrum through a set of M **filters** with **transmission spectra** t<sub>1</sub>, ..., t<sub>M</sub>:



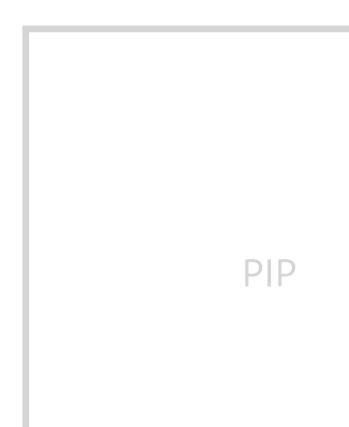
Can use a least squares solver with constraints (smoothness, positive, etc.) to solve for **r**!

The more filters, the more overconstrained the system

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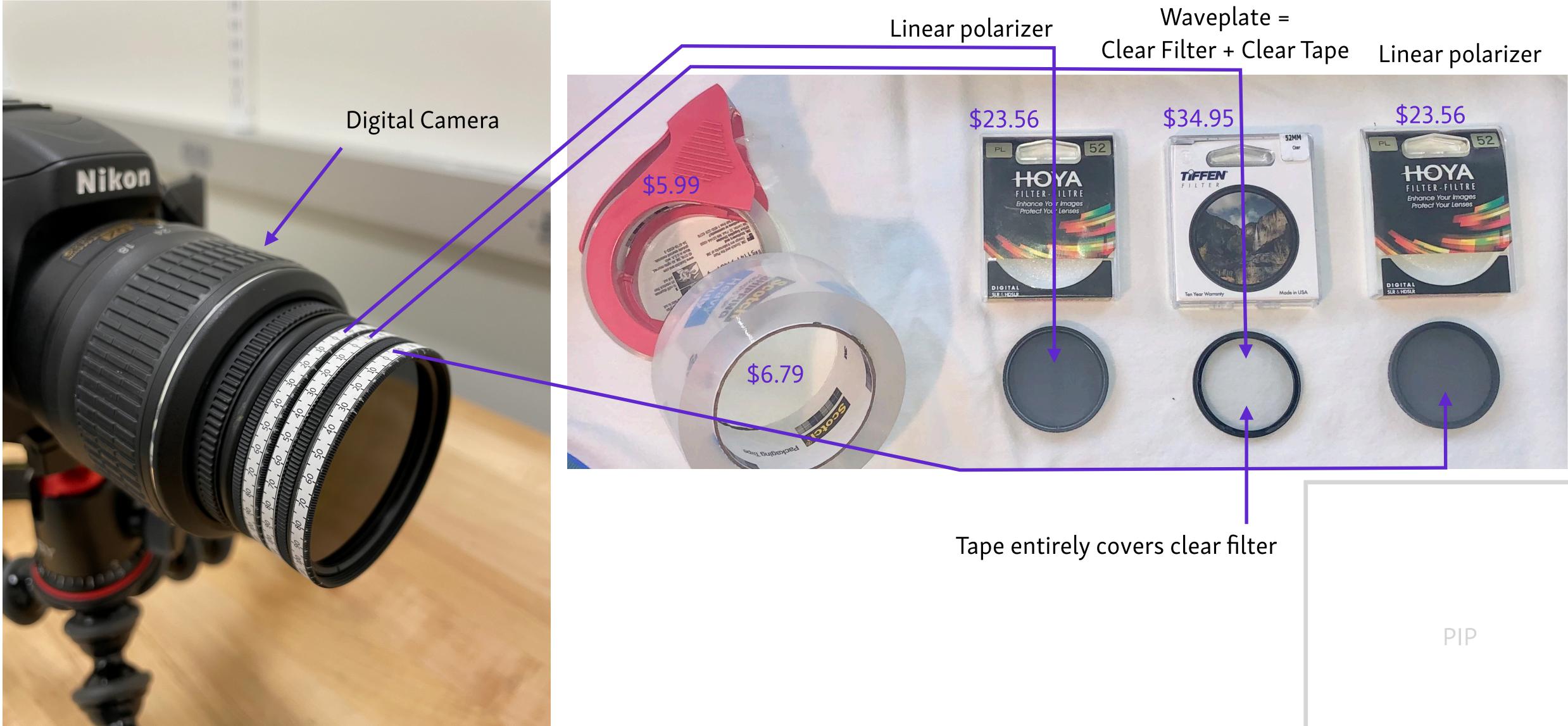


```
\begin{bmatrix} p_1 \\ p_2 \\ p_3 \\ \vdots \\ p_M \end{bmatrix} = \begin{bmatrix} \mathbf{c}_k \odot \mathbf{t}_1 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_2 \odot \mathbf{e} \\ \mathbf{c}_k \odot \mathbf{t}_3 \odot \mathbf{e} \\ \vdots \\ \mathbf{c}_k \odot \mathbf{t}_M \odot \mathbf{e} \end{bmatrix} \begin{bmatrix} \mathbf{r} \\ \end{bmatrix}
```



Ν	G	LAB

# **Physical Capture Setup**

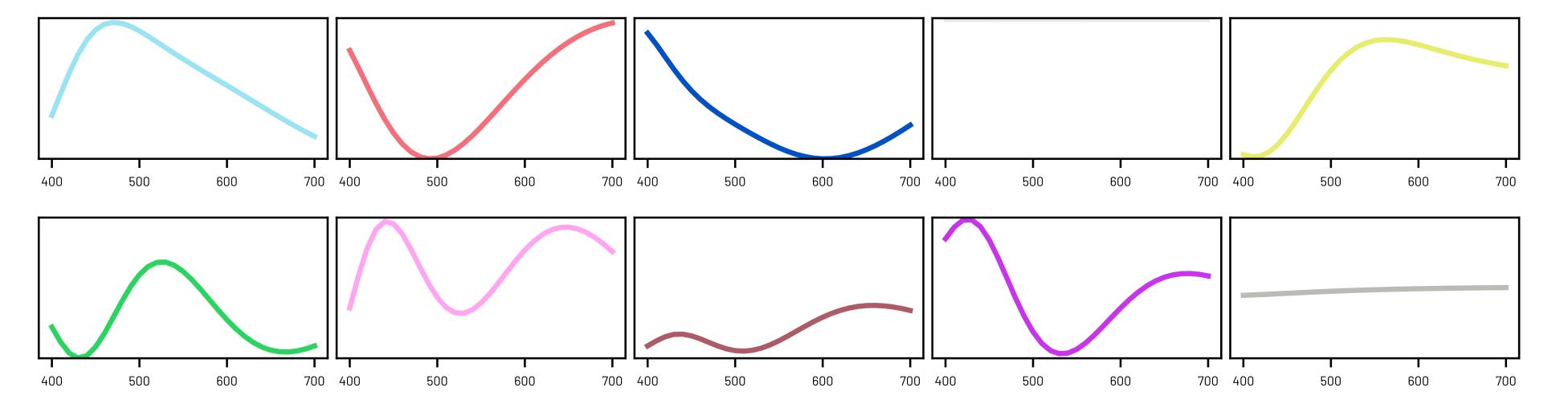


#### DIY hyperspectral imaging via polarization-induced spectral filters 15



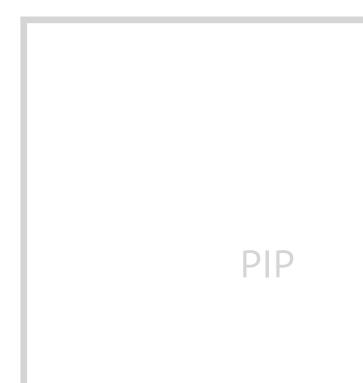
Ν	G	L	4	B

# **Physical Capture Process**



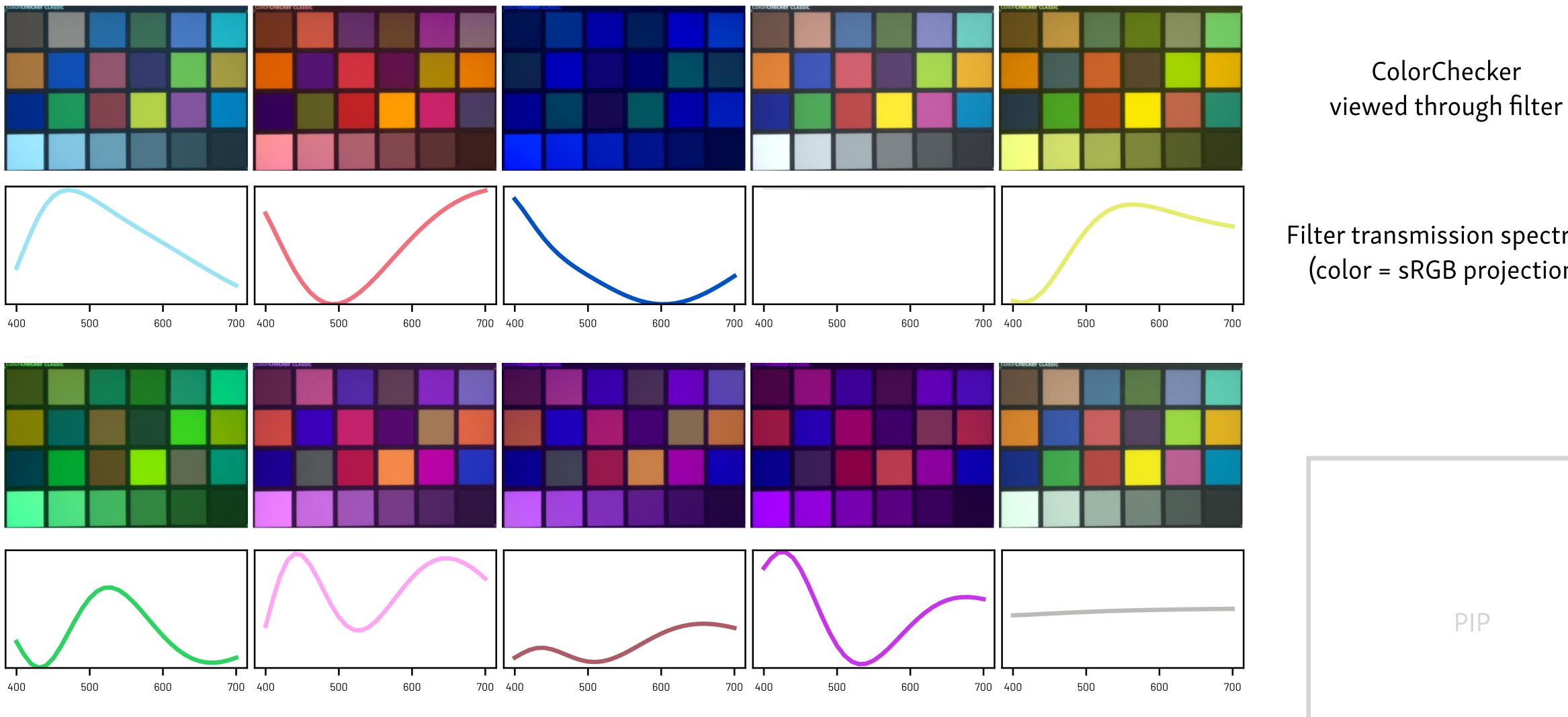
DARTMOUTH VISUAL COMPUTIN

Filter transmission spectrum (color = sRGB projection)



Ν	G	LAB	

# **Physical Capture Process**



DIY hyperspectral imaging via polarization-induced spectral filters

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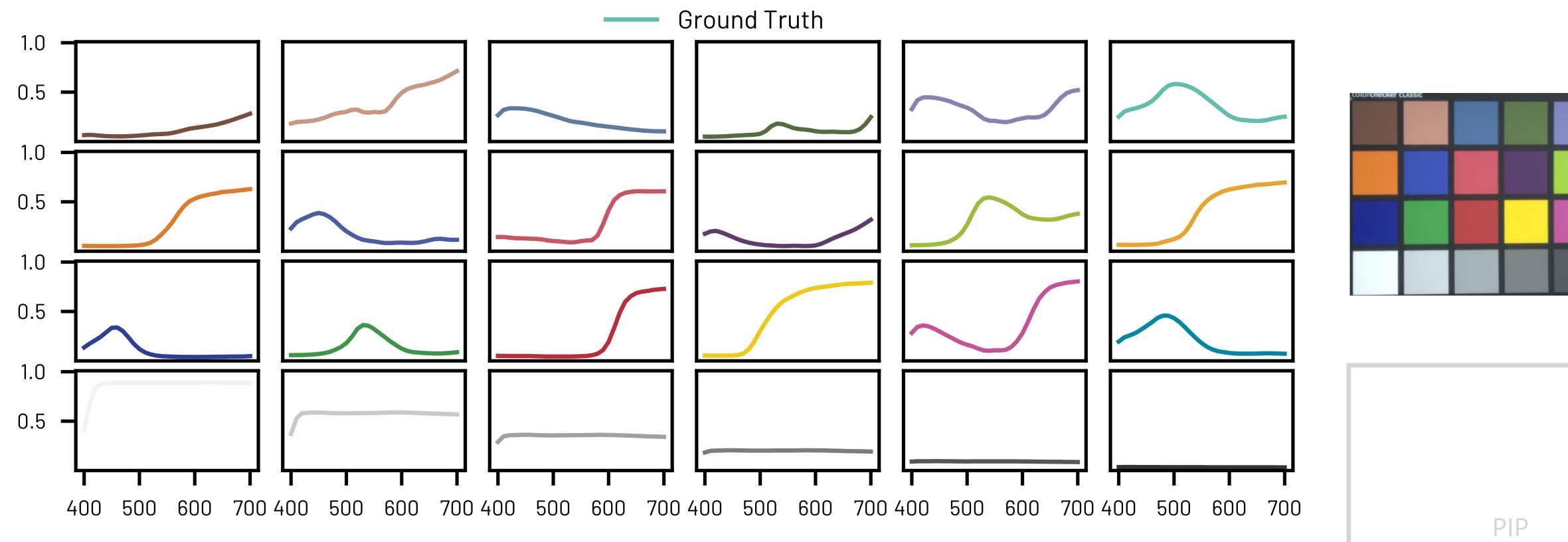
#### DARTMOUTH VISUAL COMPUTIN

# ColorChecker

Filter transmission spectrum (color = sRGB projection)

NG	LAB

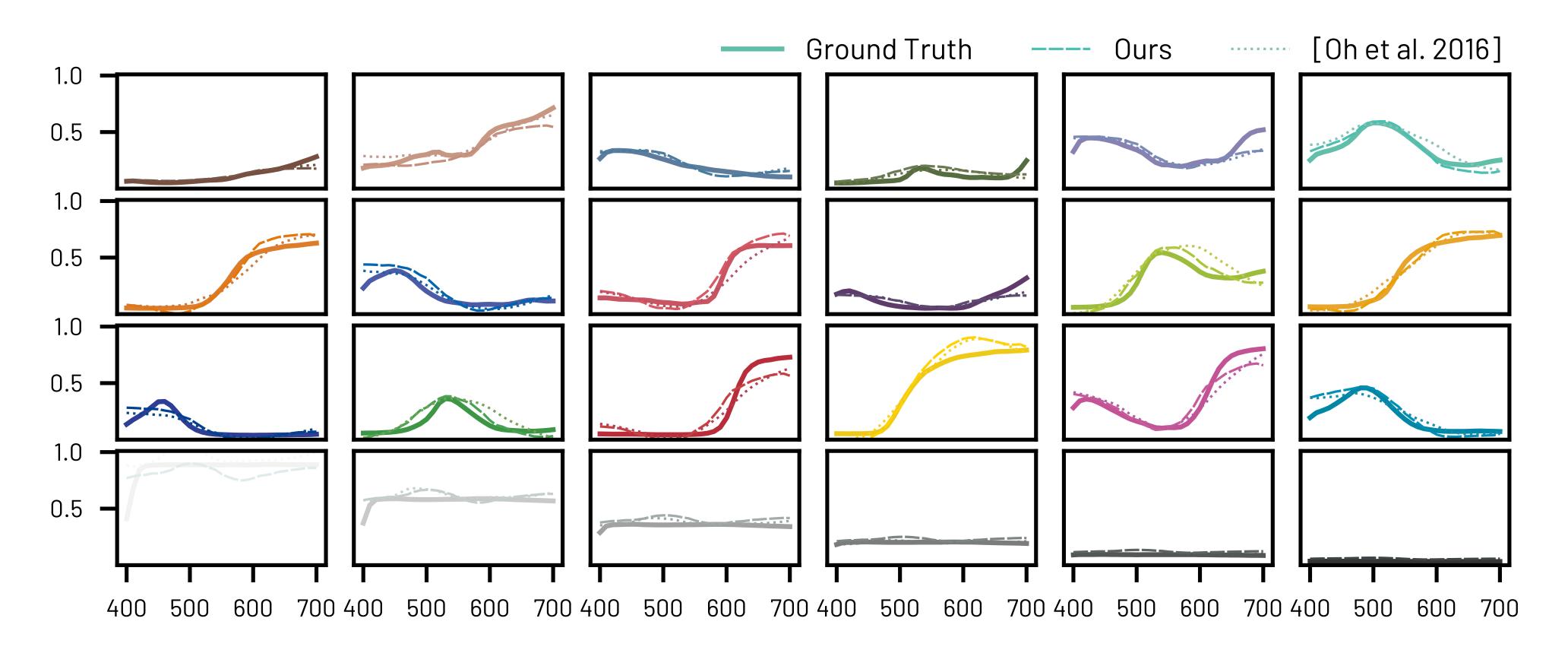




18 DIY hyperspectral imaging via polarization-induced spectral filters

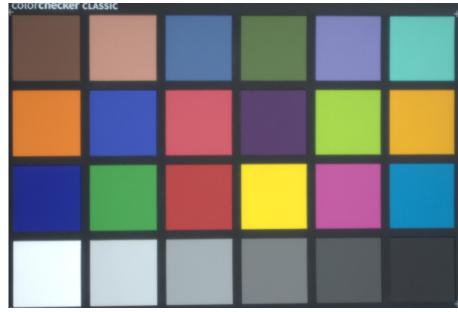
Ν	G	LAB	





**19** DIY hyperspectral imaging via polarization-induced spectral filters

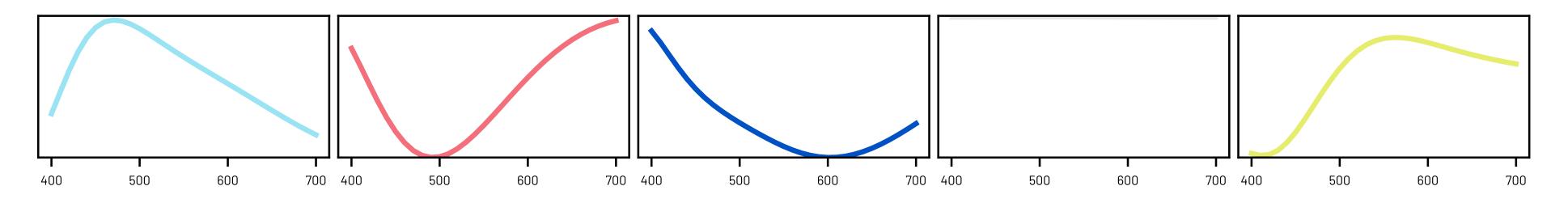
#### DARTMOUTH VISUAL COMPUTIN



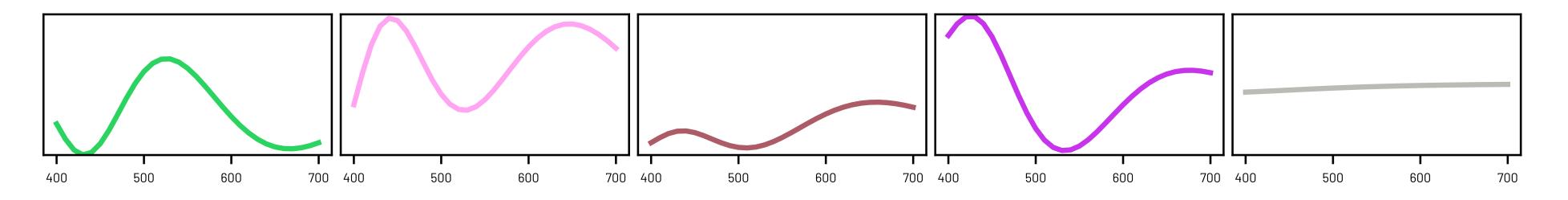
PIP

Ν	G	LAB	







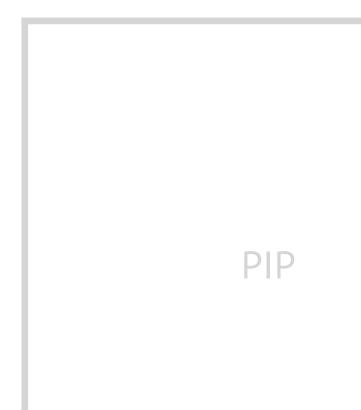


20 DIY hyperspectral imaging via polarization-induced spectral filters

#### VISUAL COMPUTIN

Pear scene viewed through filter

Filter transmission spectrum (color = sRGB projection)



NG	LAB

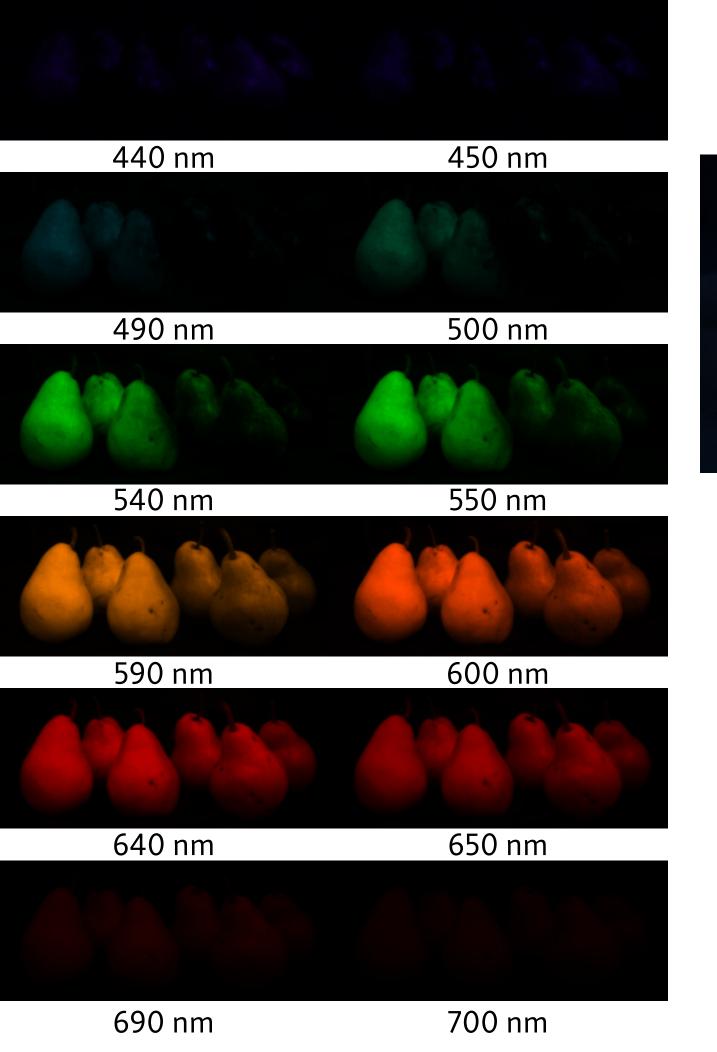


#### Recovered reflectance spectra

410 nm	420 nm	430 nm
460 nm	470 nm	480 nm
510 nm	520 nm	530 nm
560 nm	570 nm	580 nm
610 nm	620 nm	630 nm
660 nm	670 nm	680 nm

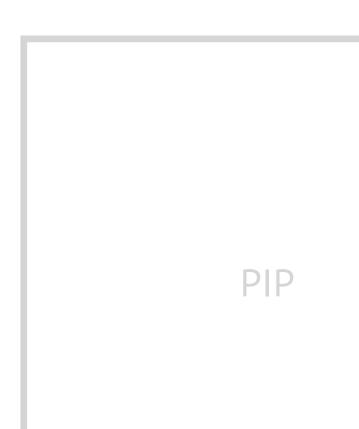
21 DIY hyperspectral imaging via polarization-induced spectral filters

#### DARTMOUTH VISUAL COMPUTIN



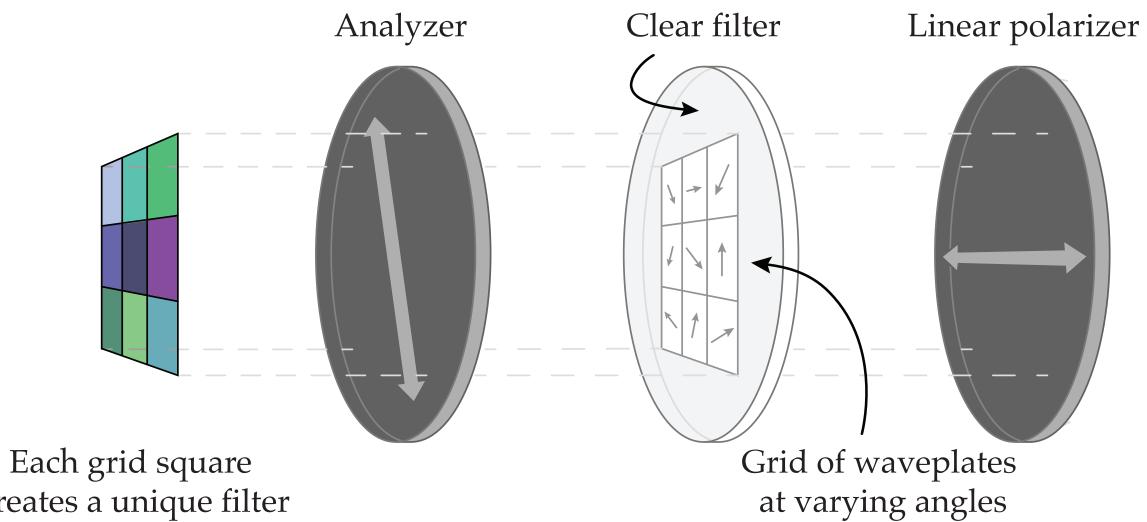


#### Original scene



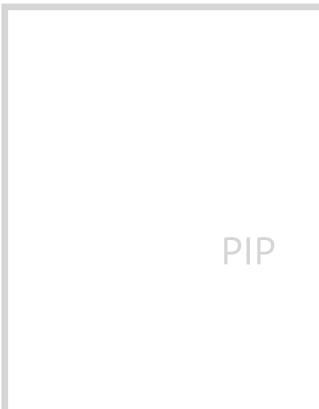
N	G	LA	B

#### Filter Mosaic: Single-Shot Strategy



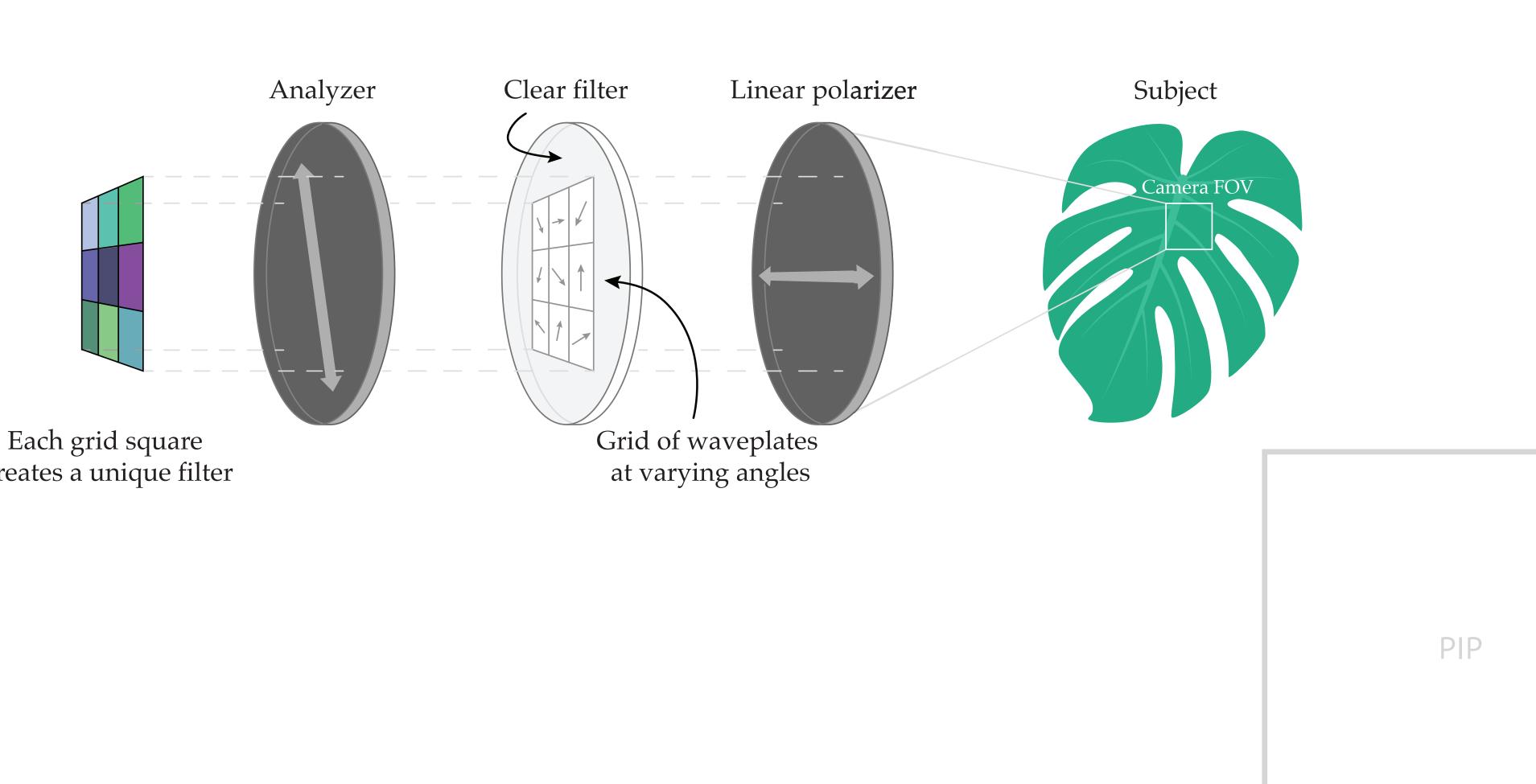
creates a unique filter

#### DARTMOUTH VISUAL COMPUTIN



Ν	G	LAB

#### Filter Mosaic: Single-Shot Strategy

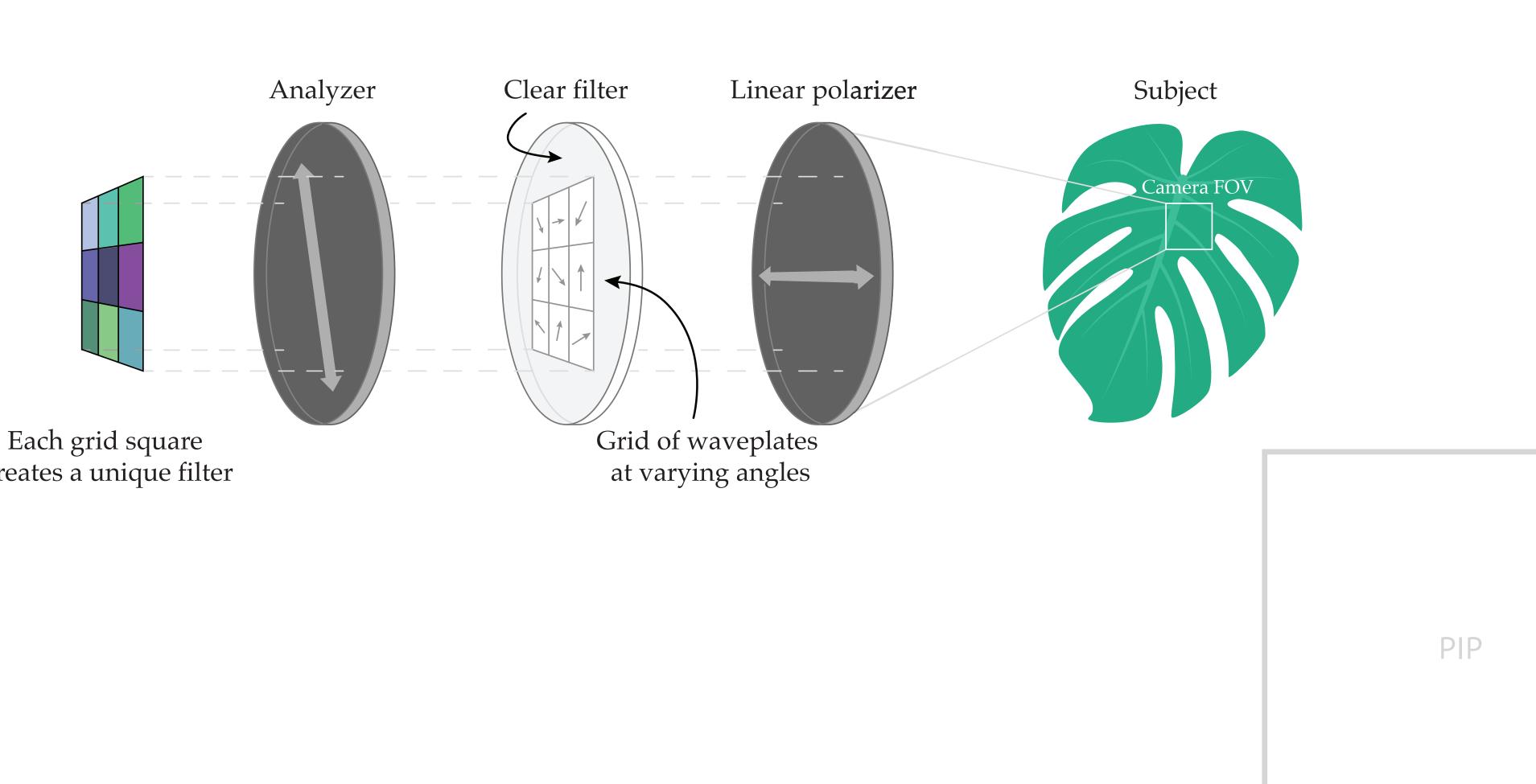


creates a unique filter



Ν	G	LAB

#### Filter Mosaic: Single-Shot Strategy

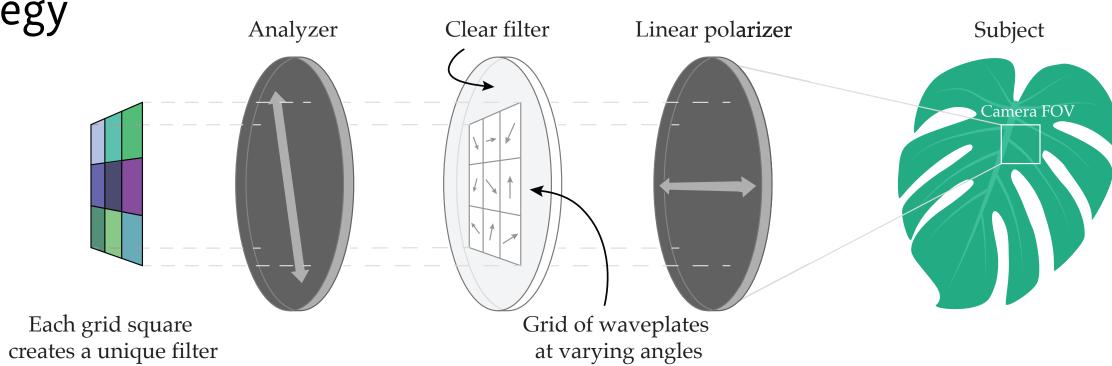


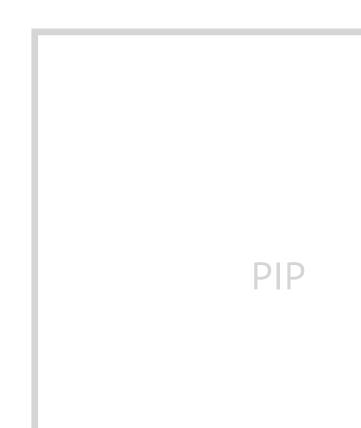
creates a unique filter



Ν	G	LAB

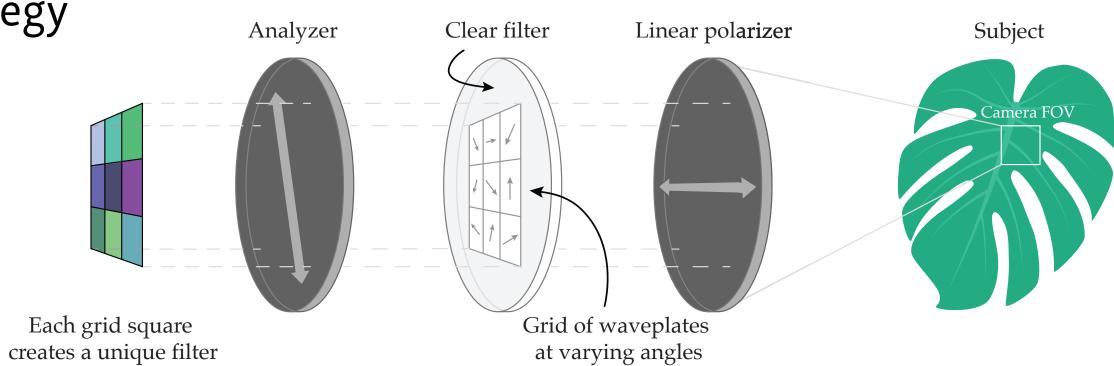
#### Filter Mosaic: Single-Shot Strategy





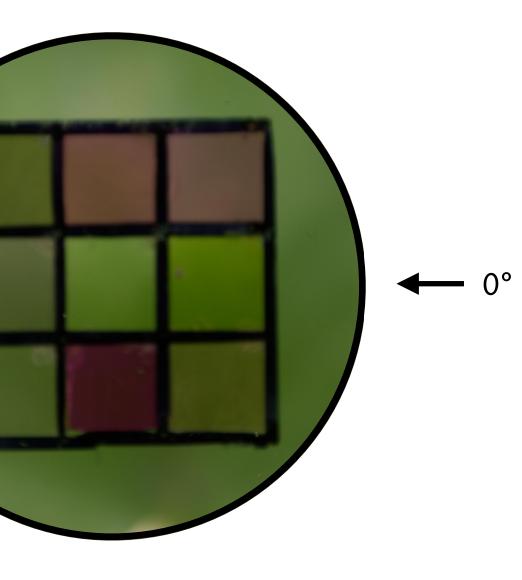
Ν	G	LAB

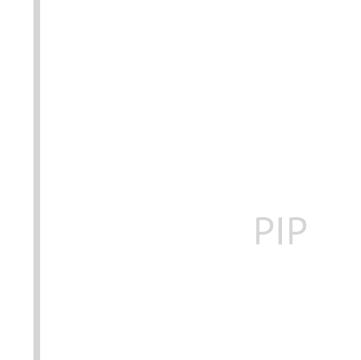
#### Filter Mosaic: Single-Shot Strategy



Analyzer rotating from 0° to 180°

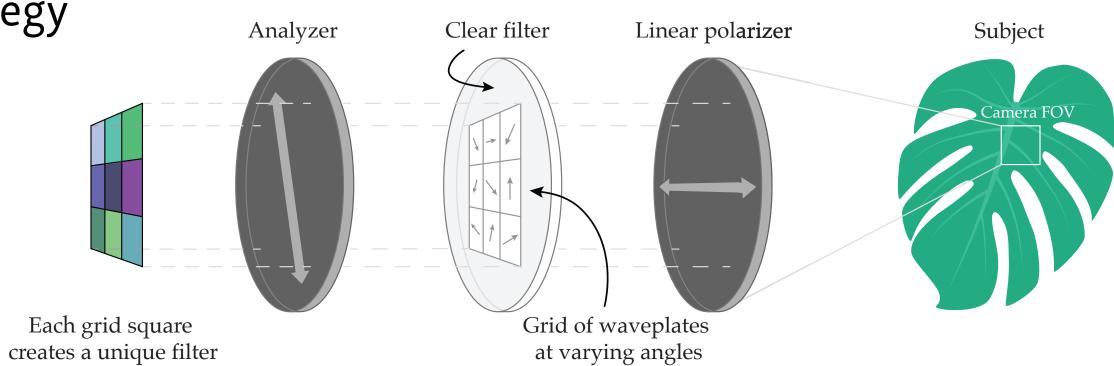




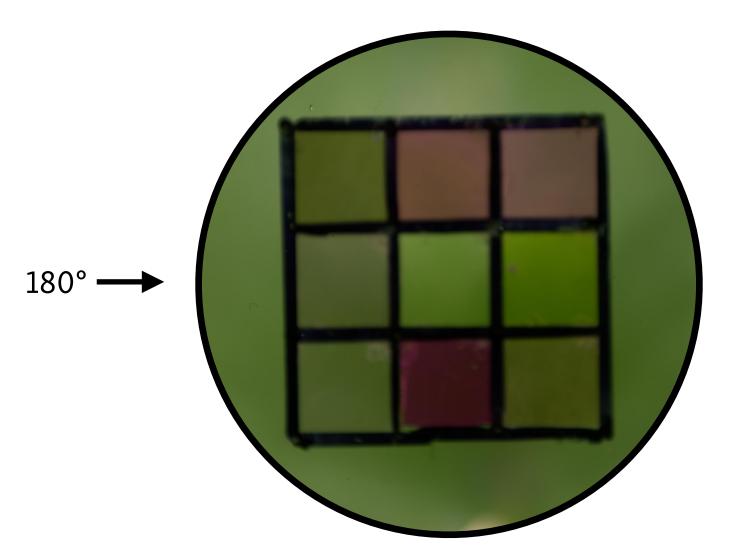


Ν	G	LAB

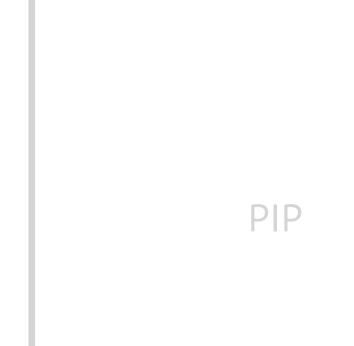
#### Filter Mosaic: Single-Shot Strategy



Analyzer rotating from 0° to 180°

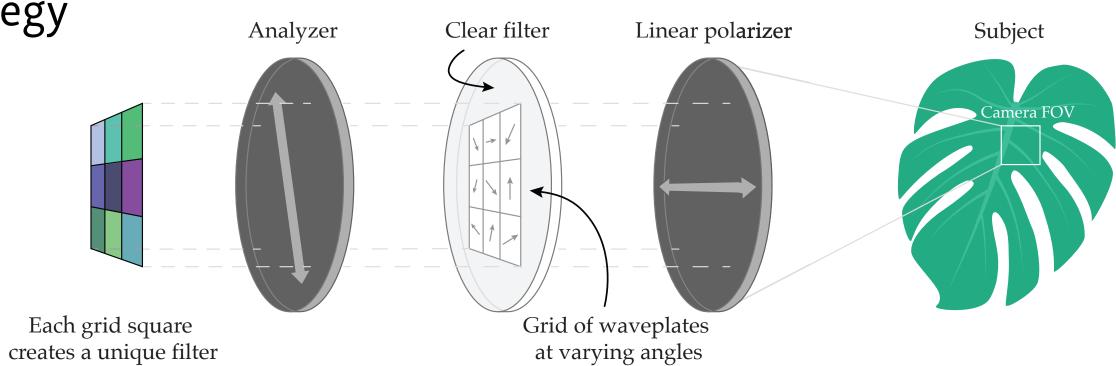


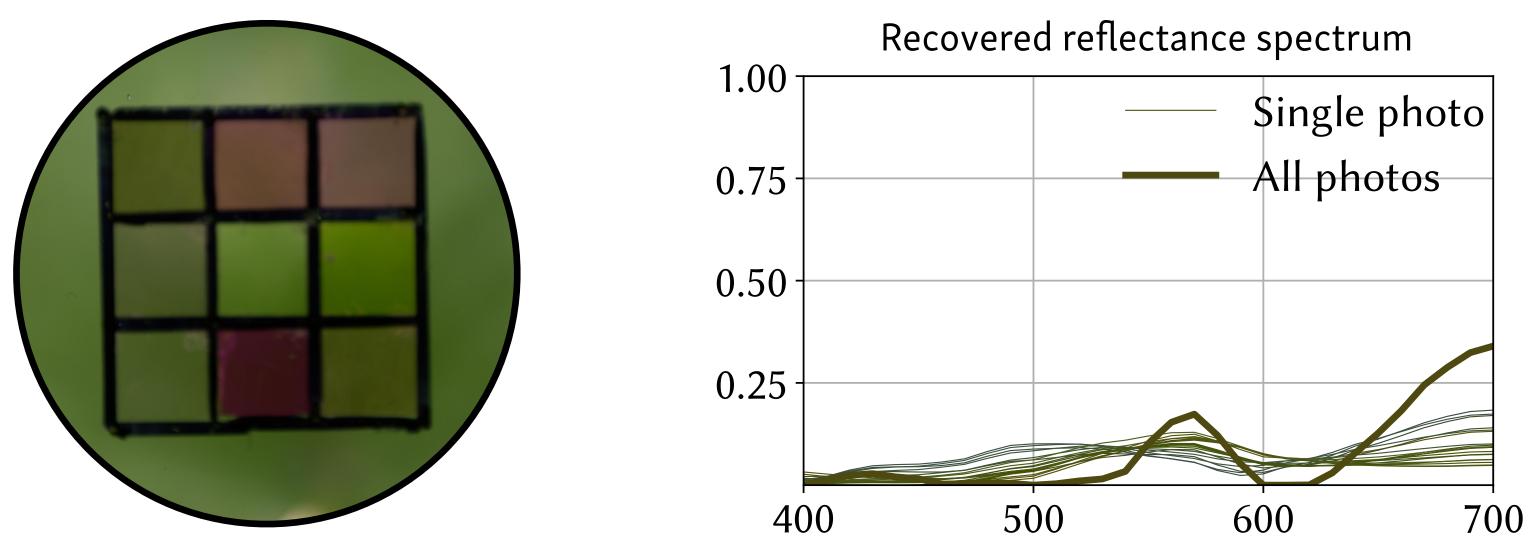
24 DIY hyperspectral imaging via polarization-induced spectral filters



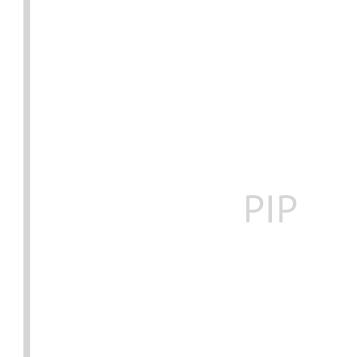
Ν	G	LAB

#### Filter Mosaic: Single-Shot Strategy





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#### DARTMOUTH VISUAL COMPUTING

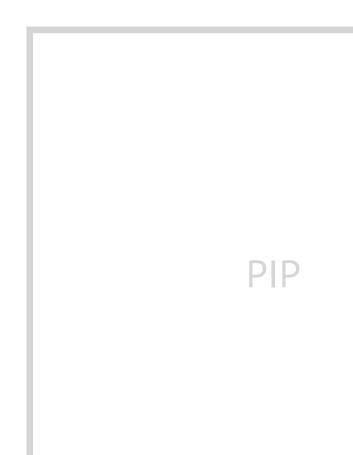
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#### We create broadband spectral filters with a continuous spectral gamut using polarization and birefringence.



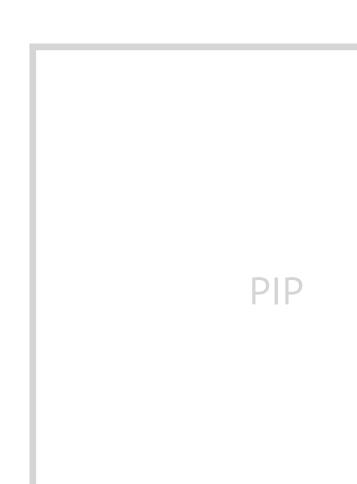


Ν	G	LAB



- 1. We create broadband spectral filters with a **continuous spectral gamut** using polarization and birefringence.
- 2. We take measurements of an unknown spectrum using these spectral filters.

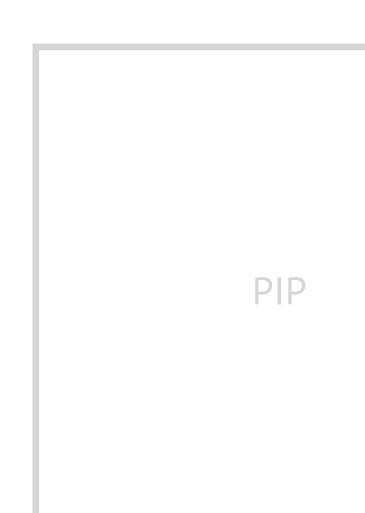




Ν	G	LAB

- 1. We create broadband spectral filters with a **continuous spectral gamut** using **polarization** and **birefringence**.
- 2. We take measurements of an unknown spectrum using these spectral filters.
- We solve for the unknown spectrum by **solving a linear system** given the 3. known camera responses and filter transmissions.

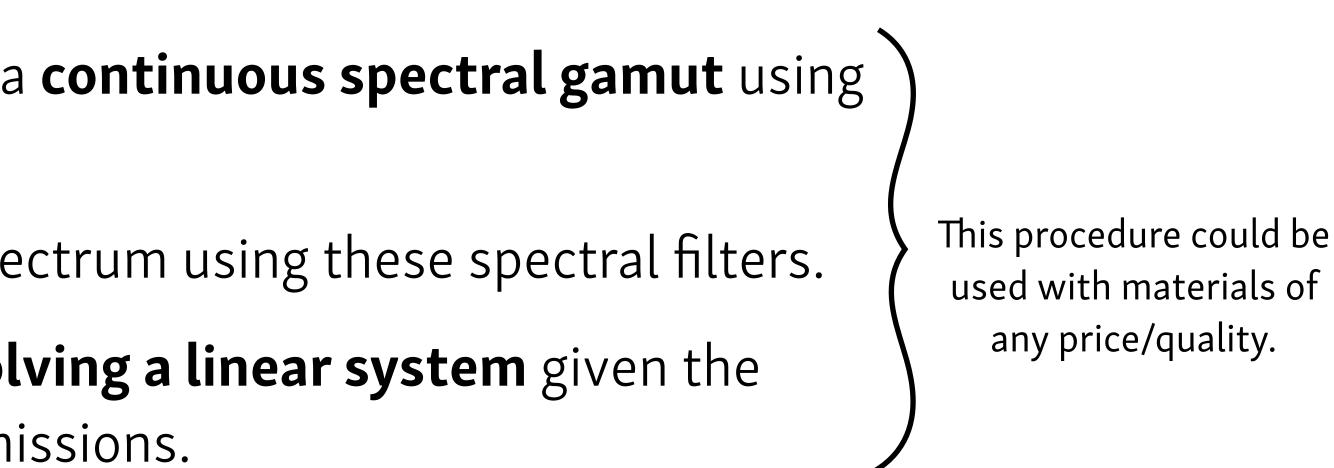


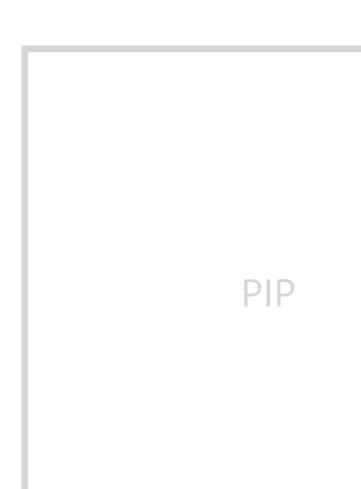


Ν	G	LAB

- 1. We create broadband spectral filters with a **continuous spectral gamut** using **polarization** and **birefringence**.
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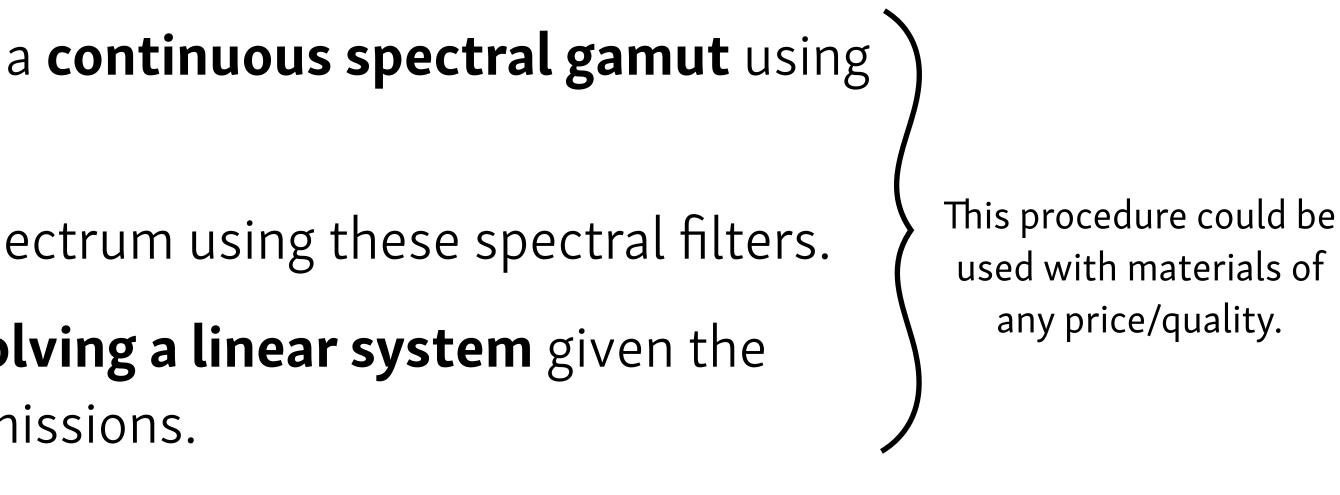




Ν	G	LA	B

- 1. We create broadband spectral filters with a **continuous spectral gamut** using **polarization** and **birefringence**.
- 2. We take measurements of an unknown spectrum using these spectral filters.
- We solve for the unknown spectrum by **solving a linear system** given the 3. known camera responses and filter transmissions.
- 4. We construct a low-cost prototype of this design using an ordinary **digital** camera, linearly polarized filters meant for casual photography, and clear **packing tape** as a birefringent material.





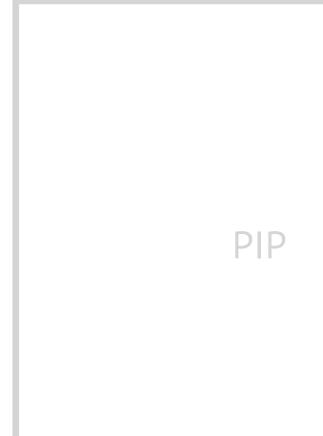


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# **Future Work**

- Smarter choice of filter set from continuous space
- Remove assumptions with more complex physically based rendering
  - e.g. incident light is unpolarized, incident light enters normal to filter plane
- Realize theoretical system design with higher cost/quality materials or even liquid crystals
  - Liquid crystals have variable birefringence controlled by electric currents could be dynamically driven
  - e.g. concurrent work [Sankaranarayanan et al. 2021]





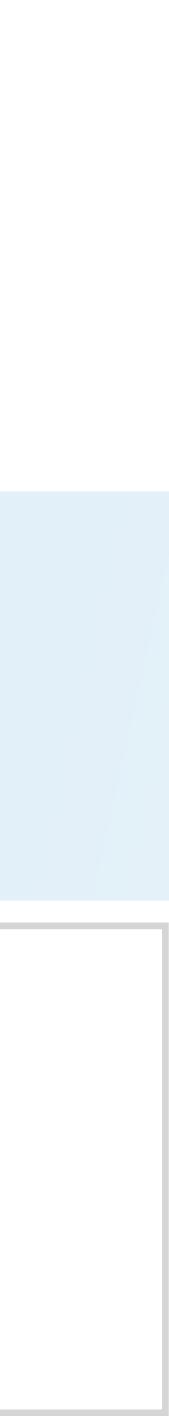
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# Visit: dartgo.org/hyperspectral

# for a **tutorial** on how to build your own hyperspectral camera!

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# References

- Slide 2 screenshot: <u>https://www.exploratorium.edu/snacks/polarized-light-mosaic</u>
- Slide 3 images:
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