# Applications of Light Polarization in Vision

Lecture #18



Separating Reflected and Transmitted Scenes







Reconstructing Shape of Transparent Objects











**Removing Specularities** 

Removing Haze and Underwater Scattering Effects

#### Separation of Diffuse and Specular Reflections

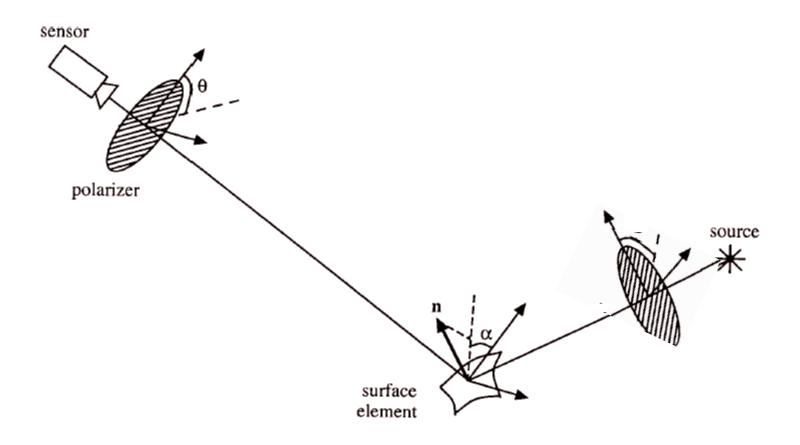
Diffuse surfaces: No (or minimal) Polarization

All light depolarized due to many random scattering events inside object.

Specular Surfaces: Strong Polarization (even though partially polarized)

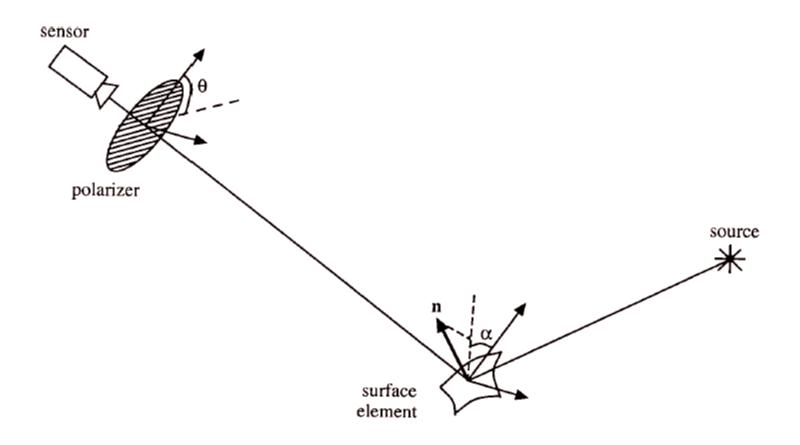
Smooth/Rough Surfaces: The degree of polarization decreases with roughness.

#### Active Illumination



- •Completely remove specular reflections using polarized light when the filters are 90 degrees apart.
- •Commonly used in industrial settings.

#### Passive Illumination



- Most illumination from sources (sun, sky, lamps) is unpolarized.
- Merely using a polarizer will not remove specular reflections completely.

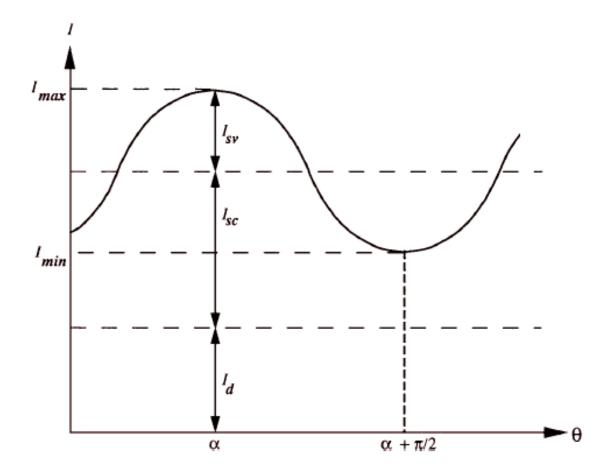
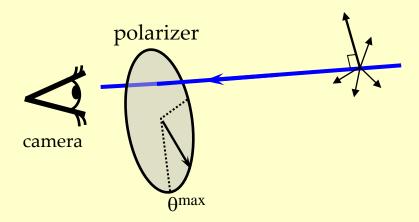


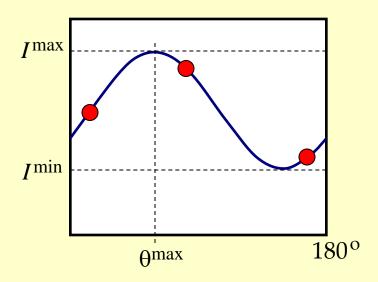
Figure 4. Image brightness plotted as a function of polarization filter angle.

$$I = I_d + I_{sc} + I_{sv} \cos 2(\theta - \alpha)$$

I\_min is not equal to I\_d (diffuse component)

#### Polarization Measurements





Polarization vector determination

3 general measurements suffice

### Determining the Polarization Cosine Curve

$$I = I_d + I_{sc} + I_{sv} \cos 2(\theta - \alpha)$$

For any given filter angle  $\theta_i$  we have:

$$I_i = I_c + I_{\rm sv}\cos 2(\theta_i - \alpha)$$

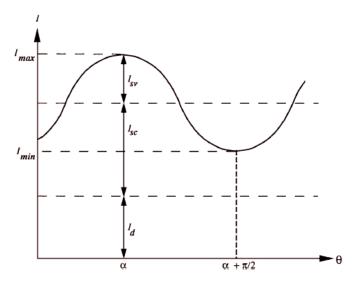


Figure 4. Image brightness plotted as a function of polarization filter angle.

Using Vector Notation:

$$\mathbf{f}_{i} = (1, \cos 2\theta_{i}, \sin 2\theta_{i})$$

$$\mathbf{v} = (I_{c}, I_{sv} \cos 2\alpha, I_{sv} \sin 2\alpha)$$

$$I_{i} = \mathbf{f}_{i} \cdot \mathbf{v}$$

Three measurements suffice to determine the cosine curve.

$$I_{\min} = I_c - I_{\text{sv}}$$
  
 $I_{\max} = I_c + I_{\text{sv}}$ 

## Degree of Polarization

$$\rho = \frac{I_{\text{max}} - I_{\text{min}}}{I_{\text{max}} + I_{\text{min}}}$$

- Varies between 0 and 1.
- If zero, then there is no polarization  $\rightarrow$  Only diffuse component present.
- If one, only specular component present.
- If degree of polarization does not change as polarizer is rotated, then there is no guarantee that specular component is completely removed (I\_sc may still be present).

#### Fresnel Ratio

- •I\_sc and I\_sv depend on refractive index and angle of incidence.
- •I\_sc and I\_sv are related to fresnel coefficients:

$$\frac{I_{\rm sc} + I_{\rm sv}}{I_{\rm sc} - I_{\rm sv}} = \frac{F_{\perp}(\eta, \psi)}{F_{\parallel}(\eta, \psi)} = q$$

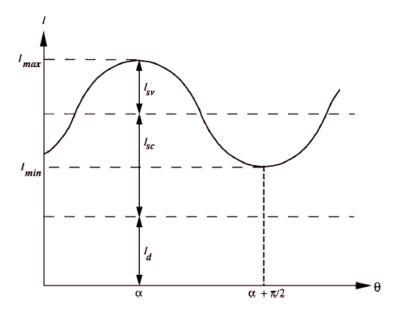
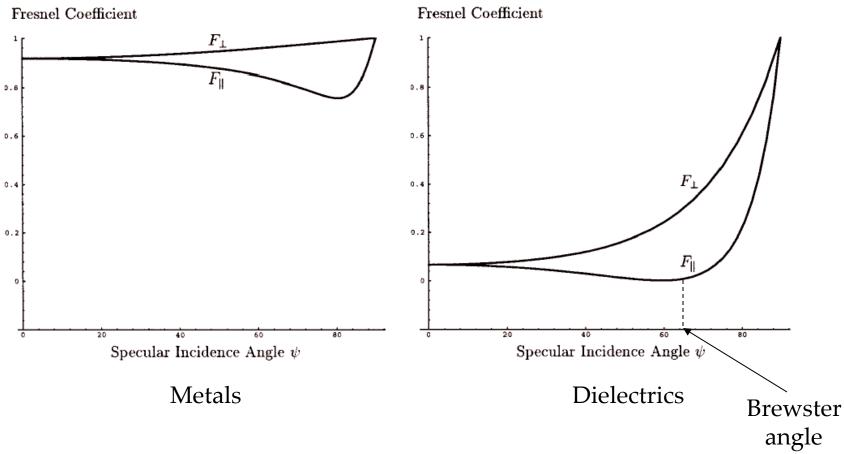


Figure 4. Image brightness plotted as a function of polarization filter angle.

 $F_{\perp}(\eta, \psi)$  is fresnel coefficient perpendicular to plane of incidence

 $F_{\parallel}(\eta, \psi)$  is fresnel coefficient parallel to plane of incidence

#### Fresnel Ratio



- Hard to separate diffuse and specular parts for metals.
- Easier for dielectrics (good for non-normal incidences).

#### Dichromatic Model for Removing Specularities Completely

- •Specularities are only reduced in intensity using polarization.
- They are removed completely only for the Brewster angle of incidence.
- Nayar et al. use additional color constraints in dichromatic model to remove reflections completely.

Assume a local patch where the highlight and its surrounding area have the same diffuse component.





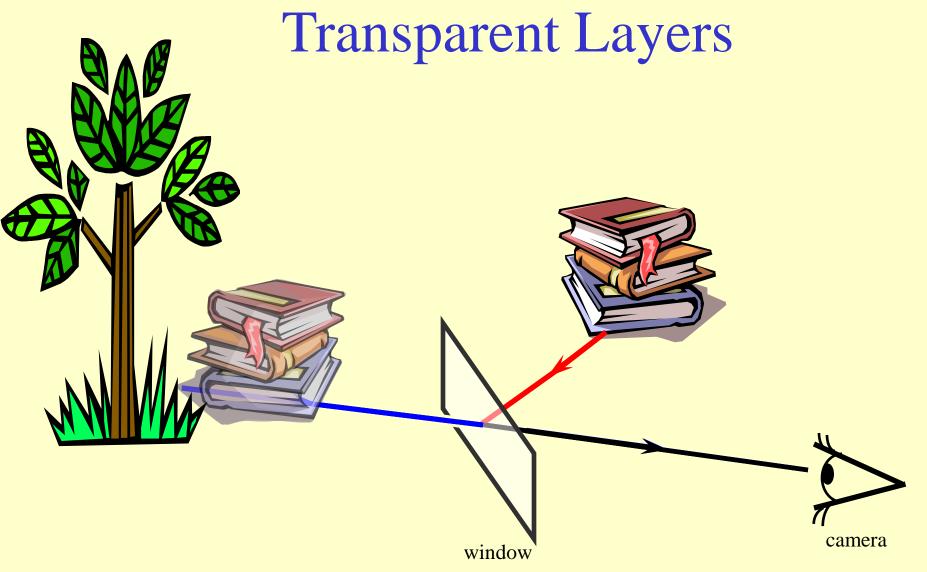


# Semi-Reflections



- Both Reflected and Transmitted light are polarized.
- But they are polarized differently.
- They depend on the orientation of the transparent layer.
- Reflections are removed completely only at Brewster Angle of Incidence.





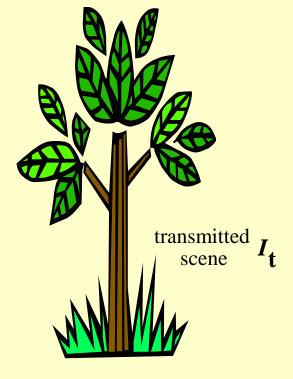


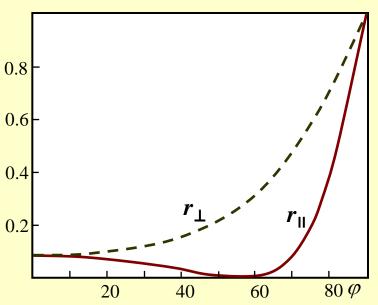
camera

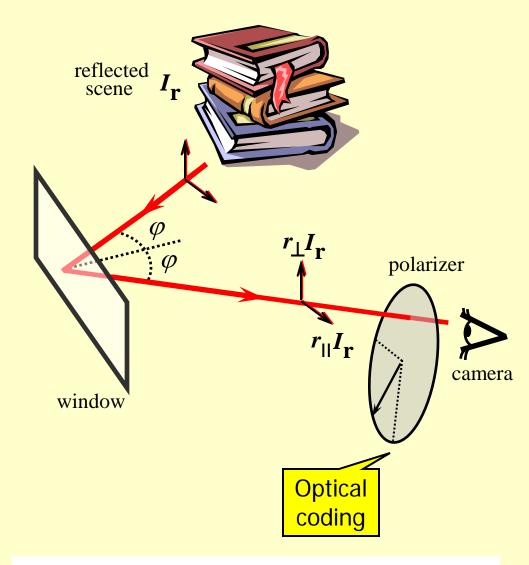
# Semi-Reflections $\frac{\text{transmitted}}{\text{scene}} I_T$ reflected scene

window



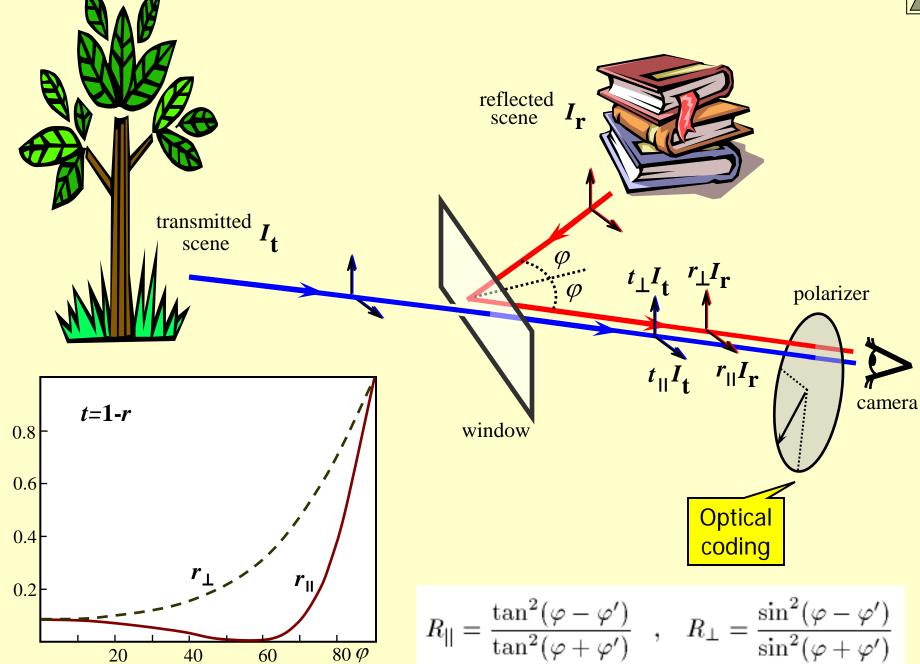






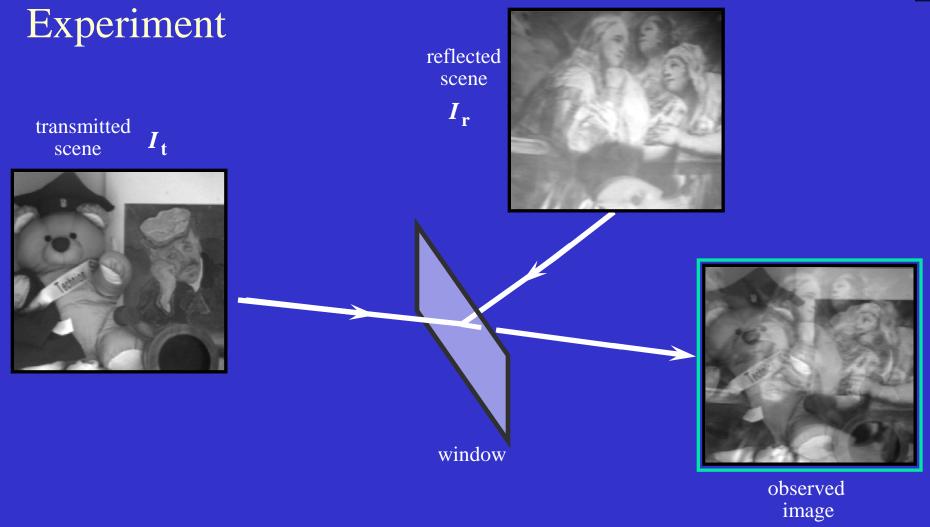
$$R_{||} = \frac{\tan^2(\varphi - \varphi')}{\tan^2(\varphi + \varphi')}$$
,  $R_{\perp} = \frac{\sin^2(\varphi - \varphi')}{\sin^2(\varphi + \varphi')}$ 



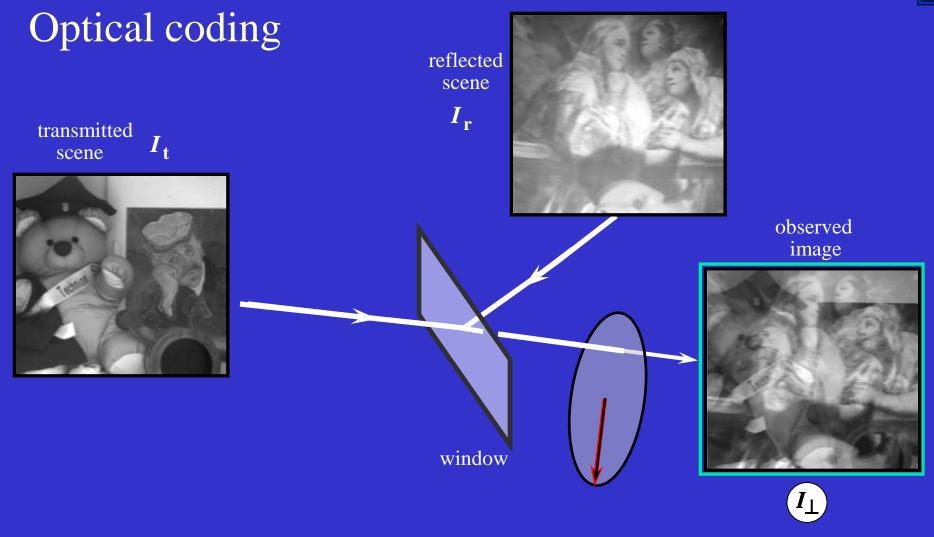


Yoav Schechner, Joseph Shamir, Nahum Kiryati '99





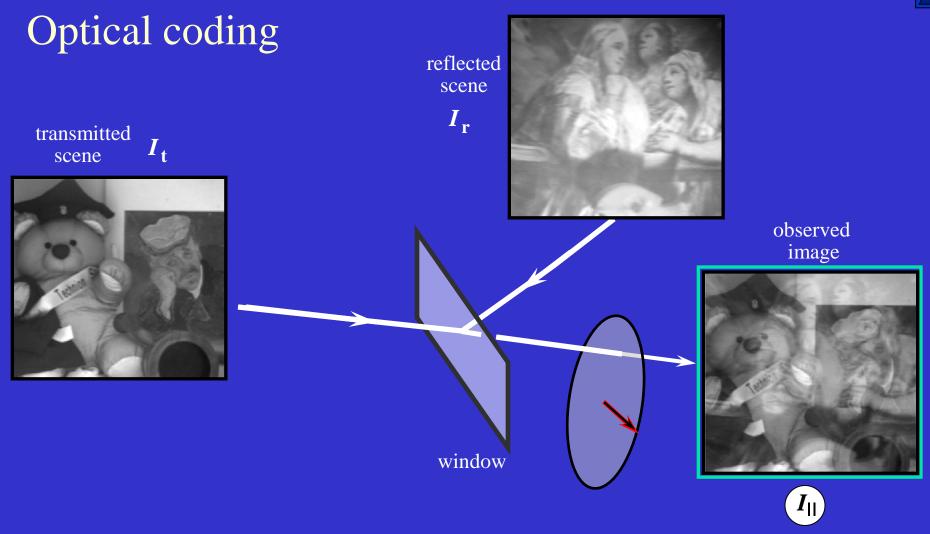




$$I_{\perp} = [r_{\perp}I_{\mathbf{r}} + t_{\perp}I_{\mathbf{t}}]/2$$







$$I_{\parallel} = [r_{\parallel}I_{\mathbf{r}} + t_{\parallel}I_{\mathbf{t}}]/2$$



## Digital decoding

2 Linear equations

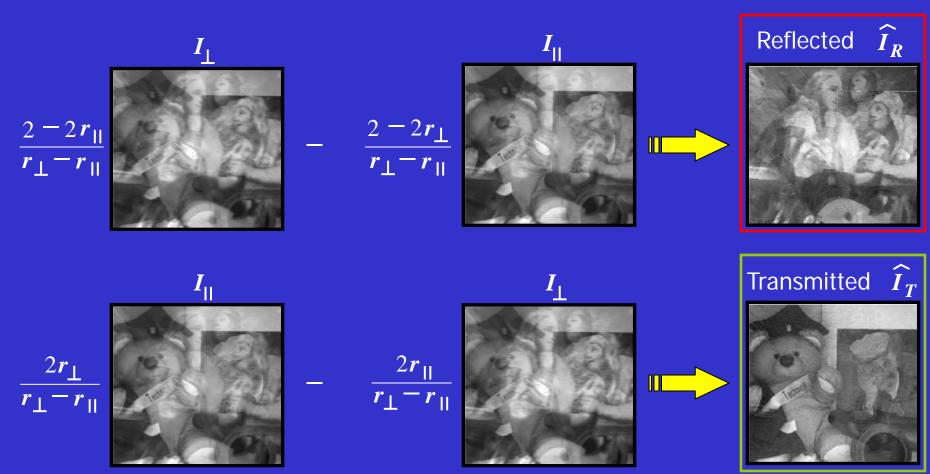
$$I_{||} = [r_{||}I_{r} + t_{||}I_{t}]/2$$
  $I_{\perp} = [r_{\perp}I_{r} + t_{\perp}I_{t}]/2$ 

$$I_{\perp} = [r_{\perp} I_{\mathbf{r}} + t_{\perp} I_{\mathbf{t}}]/2$$

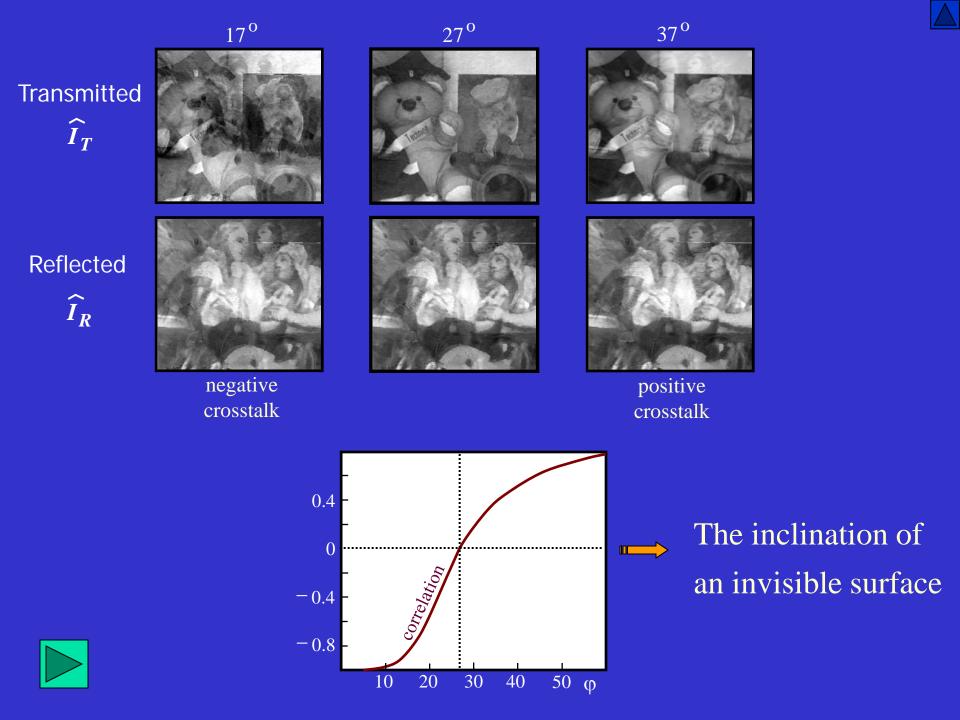
Solve for 2 unknowns:  $\hat{I}_R$ ,  $\hat{I}_T$ 

$$\widehat{I}_R$$
,  $\widehat{I}_T$ 

Window at 27 o



Yoav Schechner, Joseph Shamir, Nahum Kiryati '99





# Imaging through Haze







#### Recover:

- Object + haze layers
- Scene structure
- Info about the aerosols

#### Previous work

Pure image processing

Grewe & Brooks '98, Kopeika '98 Oakley & Satherley '98

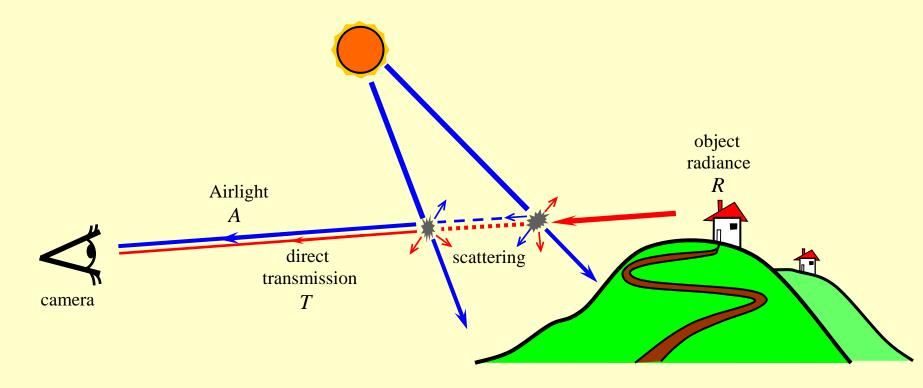
Physics based

Nayar & Narasimhan '99

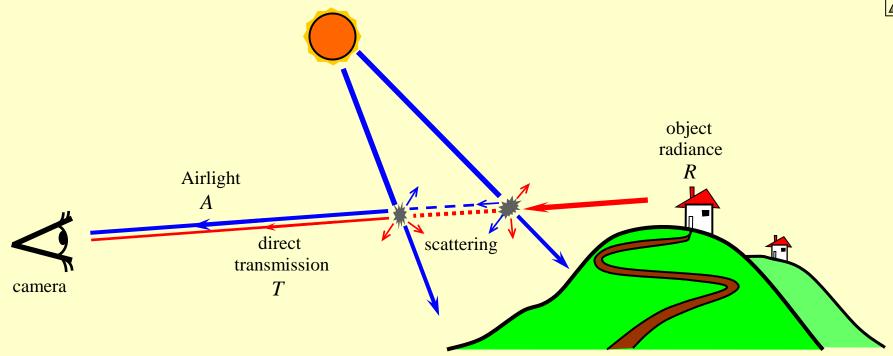
Polarization filtering
Shurcliff & Ballard '64

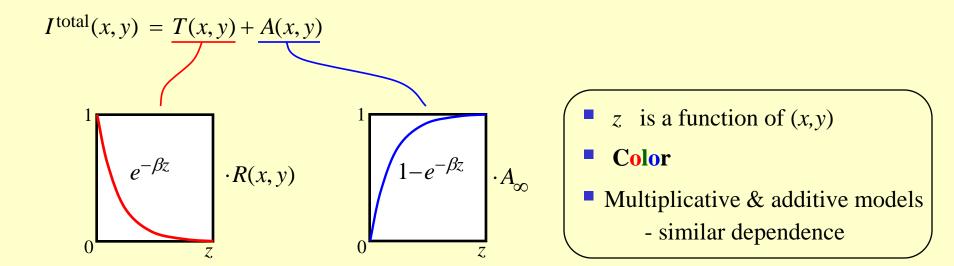


# Imaging through Haze



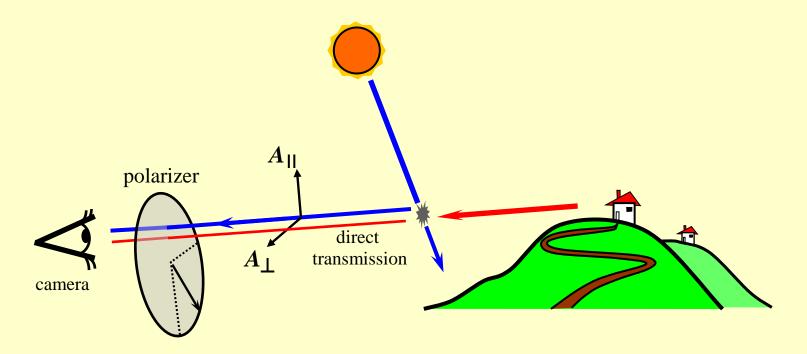






#### Polarization and Haze





• Plane of rays determines airlight components  $A_{\perp} \ge A_{\parallel \parallel}$ 

Airlight degree of polarization

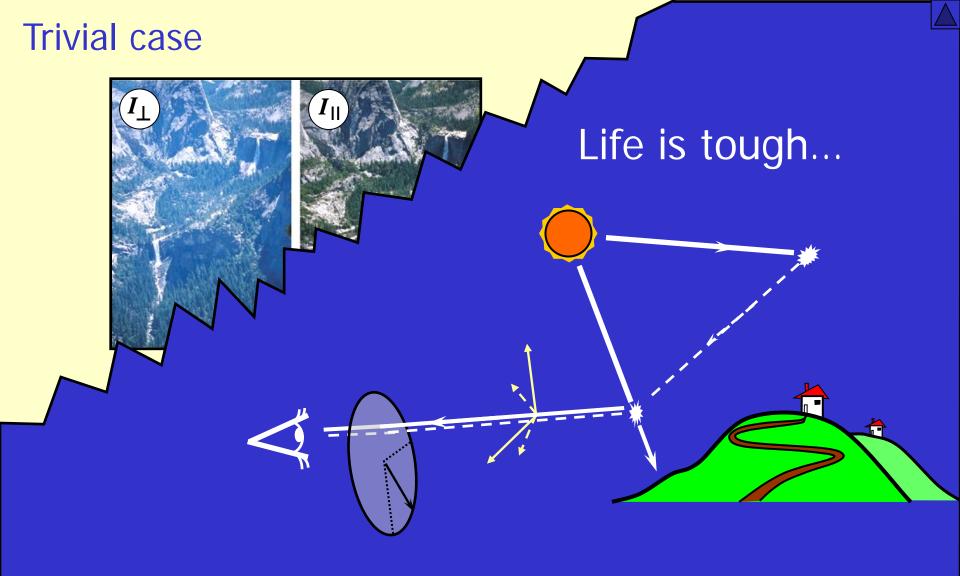
$$p = \frac{A_{\perp} - A_{\parallel}}{A_{\perp} + A_{\parallel}}$$

$$A_{\parallel} = 0 \quad \text{polarized} \quad p = 1$$

$$A_{\parallel} = A_{\perp} \quad \text{unpolarized} \quad p = 0$$

$$A_{\parallel} = 0$$
 polarized  $p = 1$ 

Along the *line of sight*, polarization state is distance invariant Assume: The object is unpolarized  $\longrightarrow$  T/2 @ all orientations

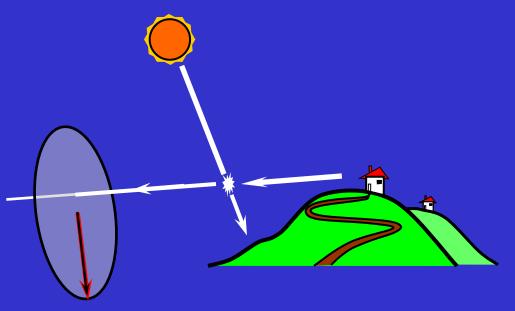


... still, there is a dominant polarization

# Experiment







Best polarized image

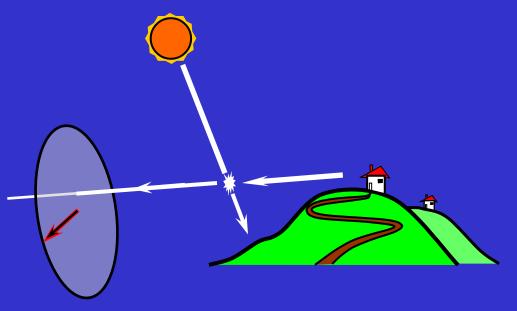
$$I_{||} = T/2 + A_{||}$$



# Experiment







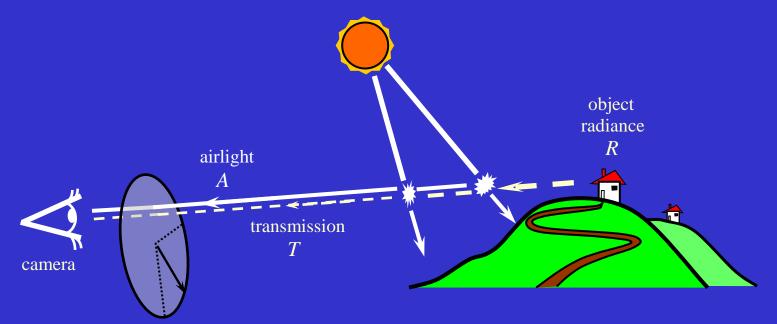
Worst polarized image

$$I_{\perp}$$
 =  $T/2 + A_{\perp}$ 





#### Model



#### 2 input images:

$$I_{\parallel} = T/2 + A_{\parallel}$$

$$I_{\perp} = T/2 + A_{\perp}$$

transmission  $T = Re^{-\beta z}$ 

airlight 
$$A = A_{\infty} \left(1 - e^{-\beta z}\right)$$

polarization degree 
$$p = \frac{A_{\perp} - A_{\parallel}}{A_{\perp} + A_{\parallel}}$$

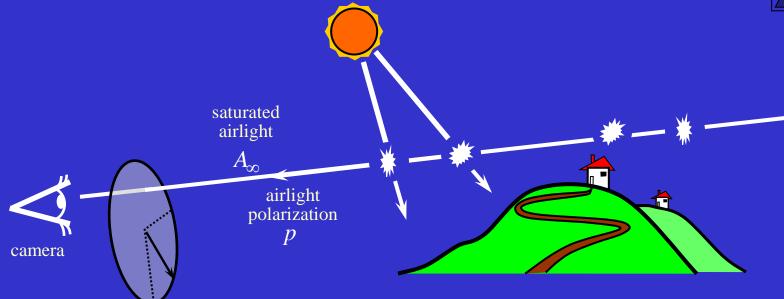
# Recovery

depth 
$$e^{-\beta z} = 1 - \frac{(I_{\perp} - I_{\parallel})/p}{A_{\infty}}$$

radiance 
$$R = \frac{(I_{\perp} + I_{\parallel}) - (I_{\perp} - I_{\parallel})/p}{e^{-\beta z}}$$

for known  $p, A_{\infty}$ 

#### Model



#### 2 input images:

$$I_{\parallel} = T/2 + A_{\parallel}$$

$$I_{\perp} = T/2 + A_{\perp}$$

transmission  $T = Re^{-\beta z}$ 

airlight 
$$A = A_{\infty} \left(1 - e^{-\beta z}\right)$$

polarization degree 
$$p = \frac{A_{\perp} - A_{\parallel}}{A_{\perp} + A_{\parallel}}$$

# Recovery

depth 
$$e^{-\beta z} = 1 - \frac{(I_{\perp} - I_{\parallel})/p}{A_{\infty}}$$

radiance 
$$R = \frac{(I_{\perp} + I_{\parallel}) - (I_{\perp} - I_{\parallel})/p}{e^{-\beta z}}$$

for known  $p, A_{\infty}$ 

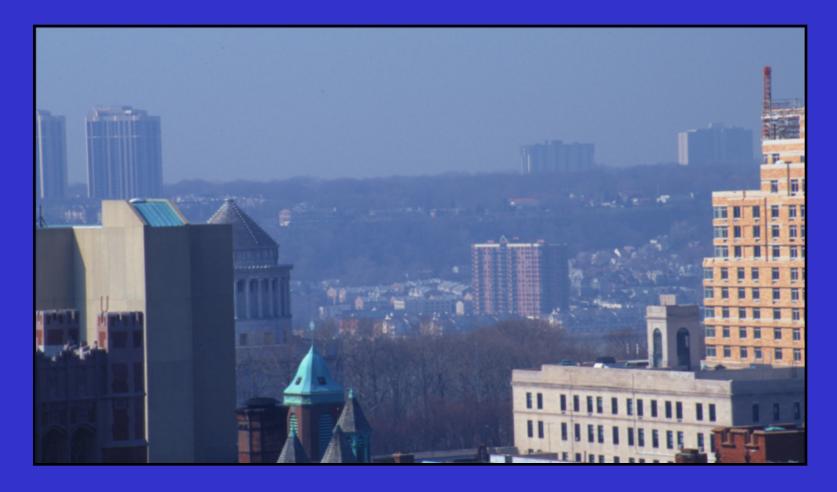


# Dehazing Experiment



Best polarized image





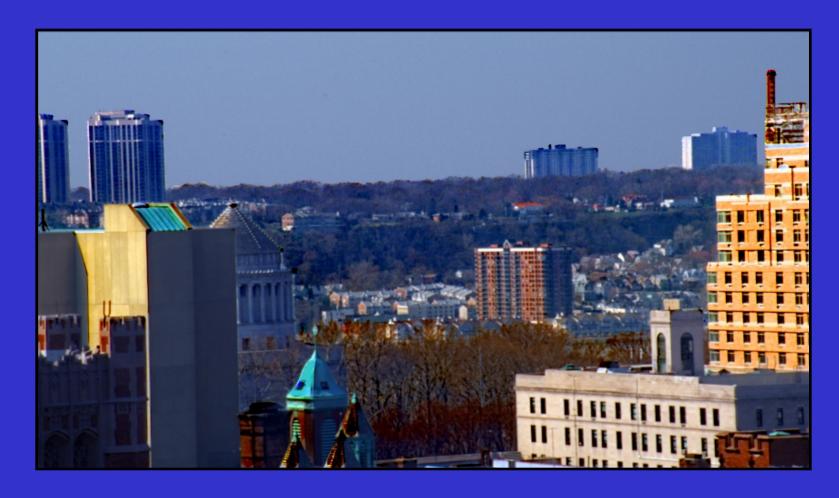


# Dehazing Experiment



Dehazed image

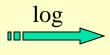




### Range map



depth 
$$e^{-\beta_z} = 1 - \frac{(I_{\perp} - I_{\parallel})}{pA_{\infty}}$$



$$\beta z(x,y)$$

component images  $I_{\perp}(x,y)$ ,  $I_{||}(x,y)$ 

Airlight saturation  $A_{\infty}$  polarization p







# Dehazing Experiment



Best polarized image







# Dehazing Experiment



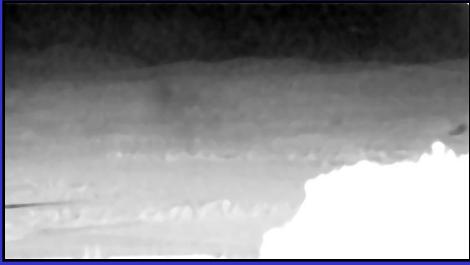
Dehazed image



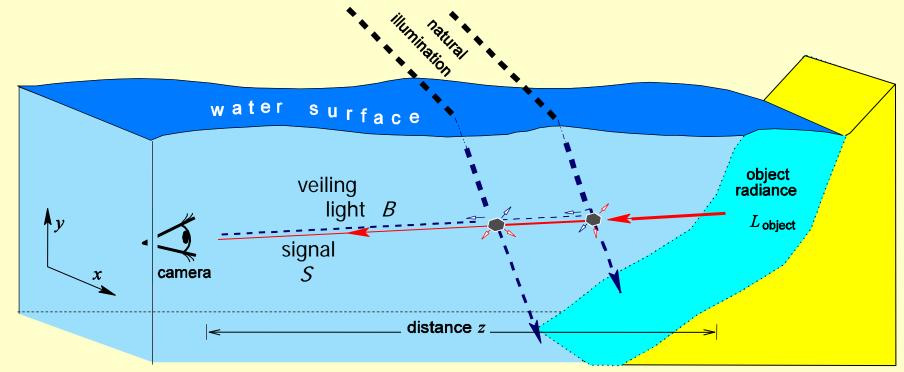


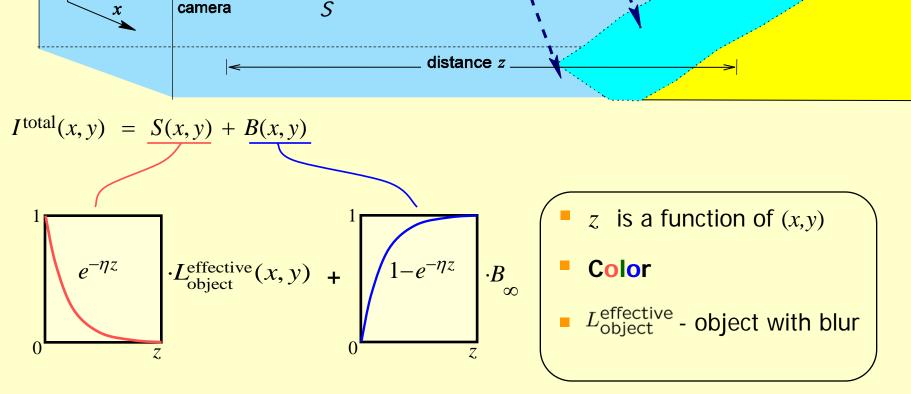
#### Range map





Instant Dehazing: Yoav Schechner, Srinivasa Narasimhan, Shree Nayar





### Hypothesis, 4 Decades Old

#### Lythgoe & Hemmings, 1967 (Nature):

"Many invertebrates are able to distinguish the plane of polarized light. Does this enable them to **see further** underwater?"

#### Lythgoe, 1972 (Handbook Sensory Physiol):

"...there is a strong possibility that it [polarization] could be useful for improving the visibility of **distant objects**, especially under water."

### Hypothesis, 4 Decades Old

#### Lythgoe & Hemmings, 1967 (Nature):

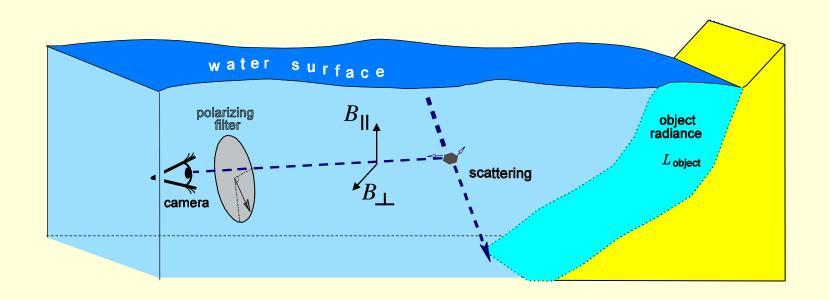
"Many invertebrates are able to distinguish the plane of polarized light. Does this enable them to **see further** underwater?"

- "...when the [polarizing] screen was oriented to exclude the maximum spacelight ... fishes stood out in greater contrast against their background."
- "... simple polarizing screen will be less versatile than the system found in Octopus, where there is the intra-ocular ability to distinguish light polarized in one plane from that polarized in another."

#### Lythgoe, 1972 (Handbook Sensory Physiol):

"...there is a strong possibility that it [polarization] could be useful for improving the visibility of **distant objects**, especially under water."

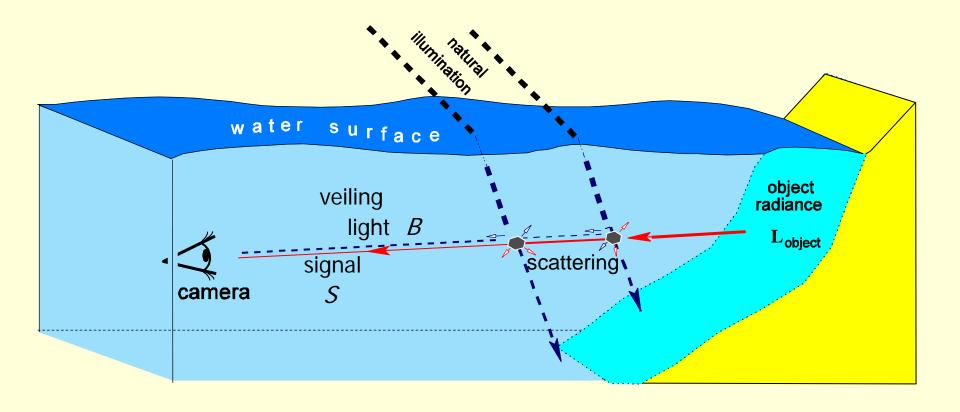
### Polarization of Veiling Light



Veiling light is partially polarized

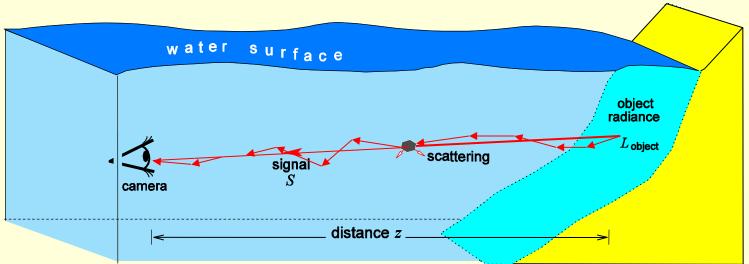
$$B_{\perp} > B_{\parallel}$$

### Image Components



Veiling light = Spacelight = Path radiance = Backscatter

### Signal Polarization



- Rough surfaces : naturally depolarize
- Specular reflection: weaker than in air
- Multiple scattering
- Signal decreases with distance / veiling-light increases

## At large distance: signal polarization has a negligible effect

(Supported by Shashar, Sabbah & Cronin 2004)

Y. Schechner & N. Karpel, *polarization-based recovery* 

### Polarization Photography



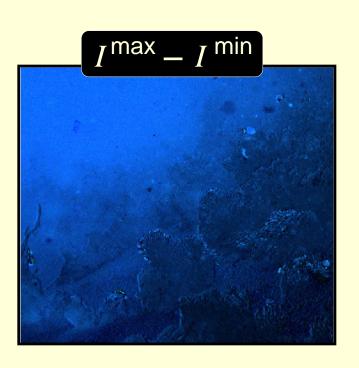


#### Past Polarization-Based Methods

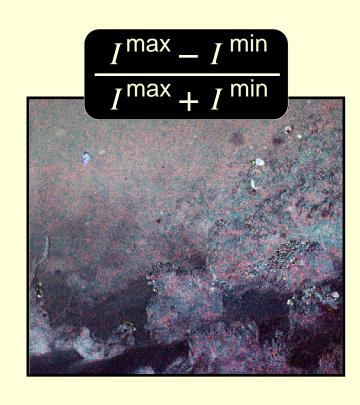




Raw images

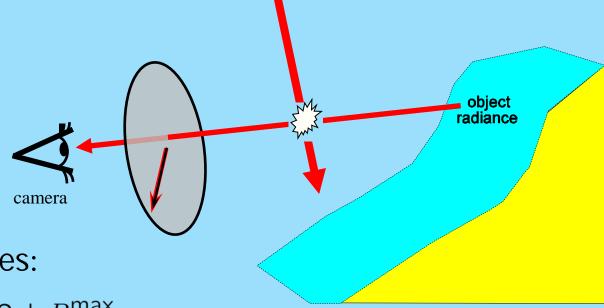


Polarization-difference imaging



Degree of polarization

### Model



#### 2 input images:

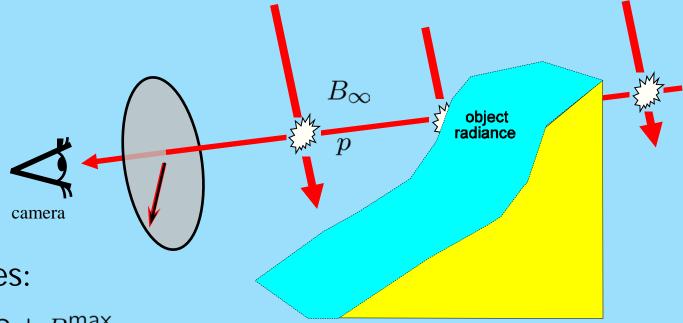
$$I^{\text{max}} = S/2 + B^{\text{max}}$$
  
 $I^{\text{min}} = S/2 + B^{\text{min}}$ 

backscatter  $B = B_{\infty} \left( 1 - e^{-\eta z} \right)$ 

signal 
$$S=e^{-\eta z}\;L_{\rm object}$$
 polarization  $p\equiv \frac{B_{\rm max}-B_{\rm min}}{B}$ 

### Recovery

$$L_{\text{object}} = \frac{I^{\text{max}} + I^{\text{min}} + (I^{\text{max}} - I^{\text{min}})/p}{1 - \frac{(I^{\text{max}} - I^{\text{min}})/p}{B_{\infty}}}$$



#### 2 input images:

$$I^{\text{max}} = S/2 + B^{\text{max}}$$
  
 $I^{\text{min}} = S/2 + B^{\text{min}}$ 

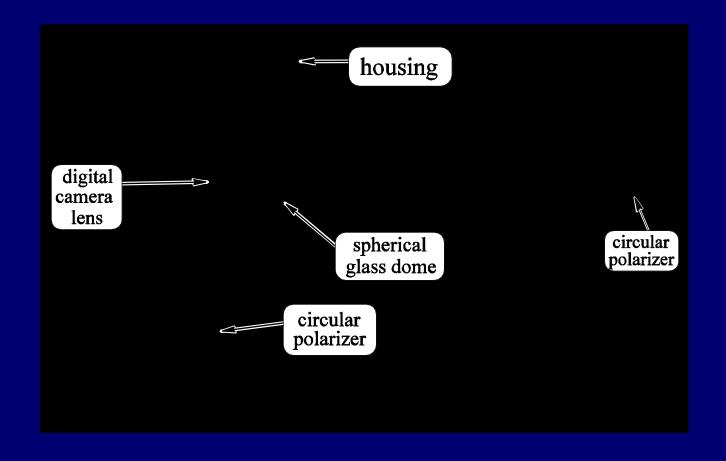
backscatter  $B = B_{\infty} \left( 1 - e^{-\eta z} \right)$ 

signal  $S=e^{-\eta z}$   $L_{\rm object}$  polarization  $p\equiv \frac{B_{\rm max}-B_{\rm min}}{B}$ 

### Recovery

$$L_{\text{object}} = \frac{I^{\text{max}} + I^{\text{min}} + (I^{\text{max}} - I^{\text{min}})/p}{1 - \frac{(I^{\text{max}} - I^{\text{min}})/p}{B_{\infty}}}$$

### Aqua-polaricam





## Experiments



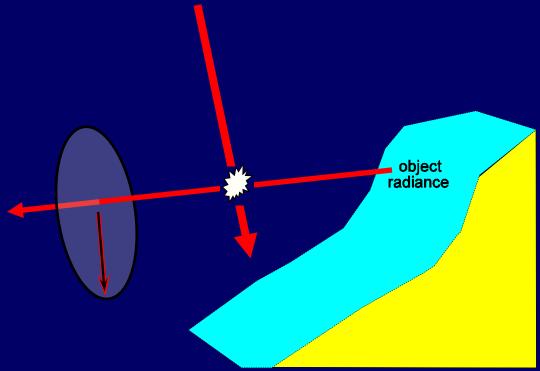


### Experiment

Eilat, 26m underwater



Best polarization image



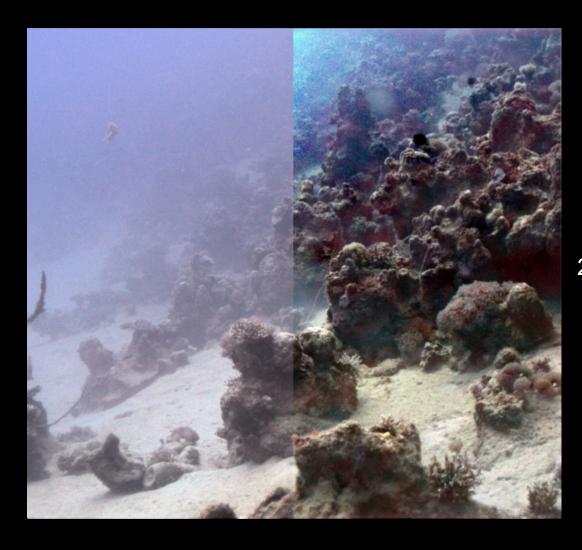
$$I^{\min} = S/2 + B^{\min}$$



### Naive White Balancing



26m underwater



26m underwater

#### Y. Schechner & N. Karpel, *underwater imaging*

### Range Map

#### **Attenuation**

$$e^{-\eta z} = 1 - \frac{(I^{\max} - I^{\min})/p}{B_{\infty}}$$



 $\begin{array}{c} {\rm Image} \\ {\rm components} \end{array} \quad I^{\rm max}, I^{\rm min}$ 

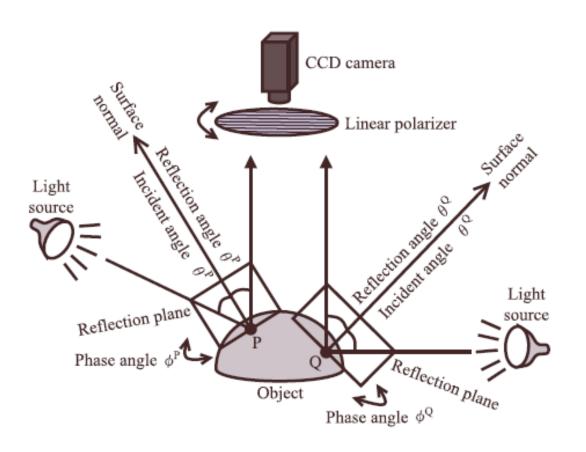
backscatter  $B_{\infty}, p$ 





#### Shape Reconstruction of Transparent Objects

Miyazaki et al

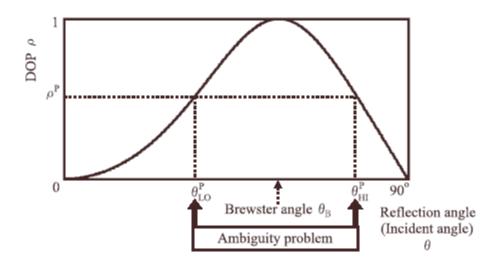


- Incident light is completely unpolarized.
- Index of refraction is given.
- Exploit relation between degree of polarization and angle of incidence (Surface normal).

#### Relationship between DOP and Angle of Incidence

$$\rho = \frac{2\sin^2\theta\cos\theta\sqrt{n^2 - \sin^2\theta}}{n^2 - \sin^2\theta - n^2\sin^2\theta + 2\sin^4\theta}$$

Two-way ambiguity in recovered angle of incidence:



Manually disambiguate, use multiple views or use prior knowledge (convex, concave, etc).

### Recovered Shape









#### NEXT WEEK

# Volumetric Scattering and its Applications to Computer Vision and Computer Graphics

Lectures #18, #19, #20