

# CS 332 Visual Processing in Computer and Biological Vision Systems

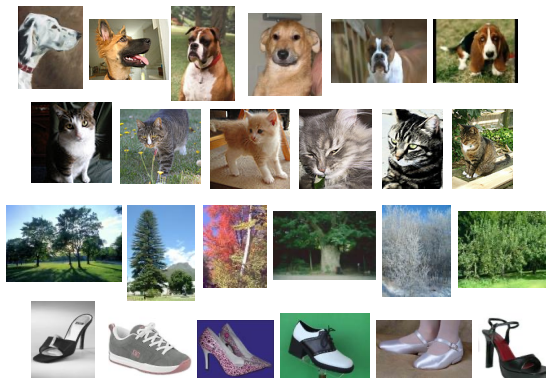
## Analysis of Color



**CS332 Visual Processing**  
Department of Computer Science  
Wellesley College

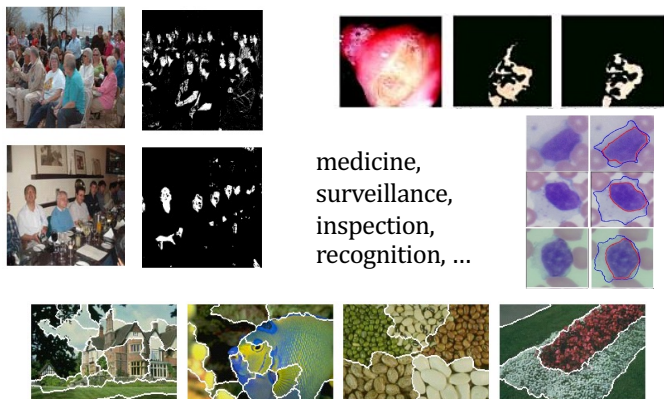
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## Content-based image retrieval



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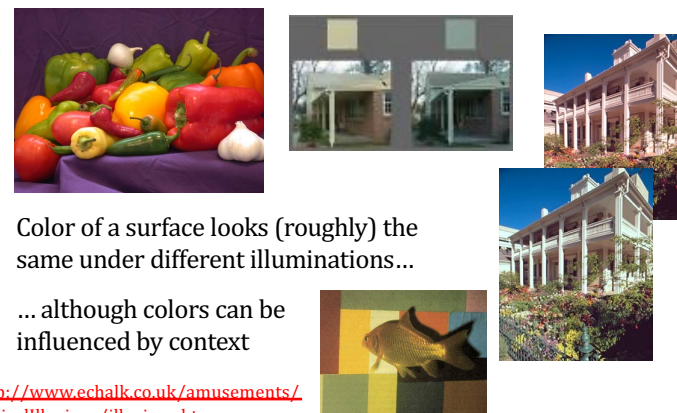
## Applications of color image segmentation



medicine,  
surveillance,  
inspection,  
recognition, ...

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## Color constancy



Color of a surface looks (roughly) the same under different illuminations...

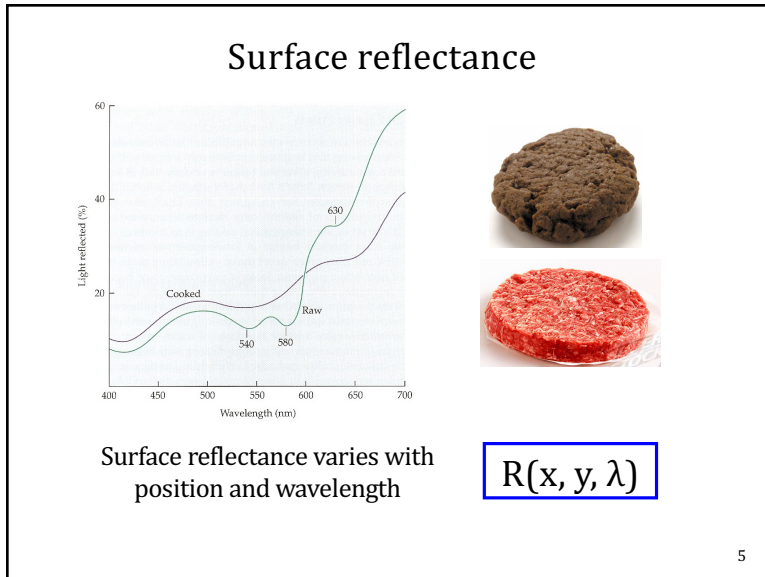
... although colors can be influenced by context

<http://www.echalk.co.uk/amusements/OpticalIllusions/illusions.htm>

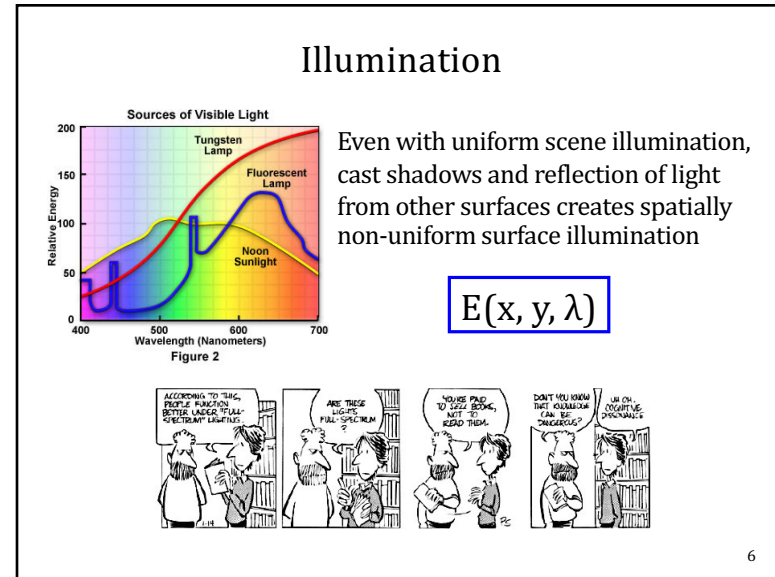
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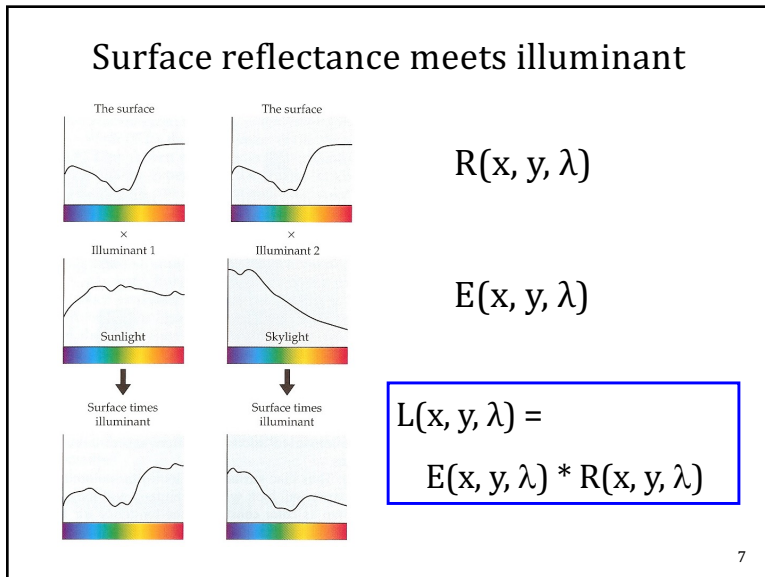
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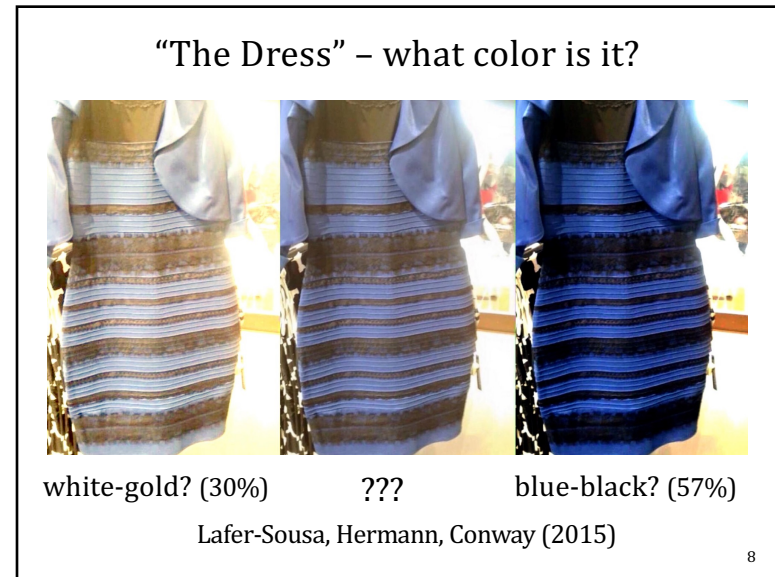
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## It depends on the illuminant...

cool  
illuminant  
(blue sky)



more likely to see  
white/gold

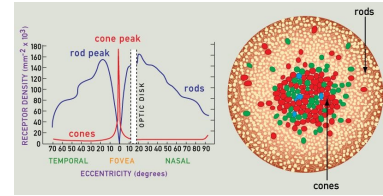


warm  
illuminant  
(incandescent)

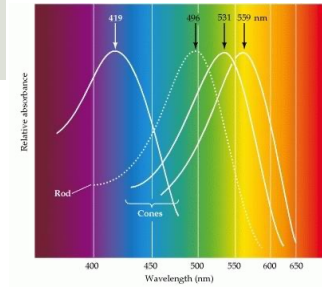
more likely to see  
blue/black

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## Measuring color by retinal cones



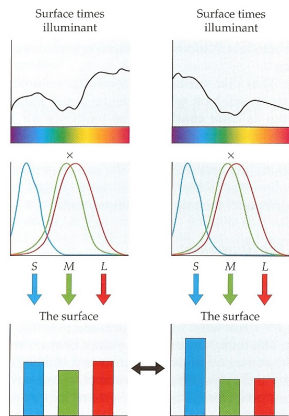
Absorption spectra for  
S (short), M (medium),  
L (long) wavelength cones



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## Luminance meets the cones



$$L(x, y, \lambda)$$

$$S(\lambda) \quad M(\lambda) \quad L(\lambda)$$

$$I_S(x, y) = \int L(x, y, \lambda) S(\lambda) d\lambda$$

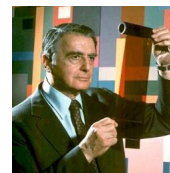
$$I_M(x, y) = \int L(x, y, \lambda) M(\lambda) d\lambda$$

$$I_L(x, y) = \int L(x, y, \lambda) L(\lambda) d\lambda$$

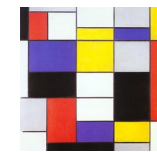
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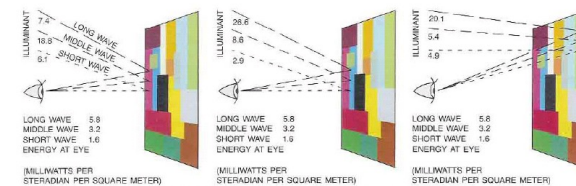
## Land's color "Mondrian" experiments



Edwin Land



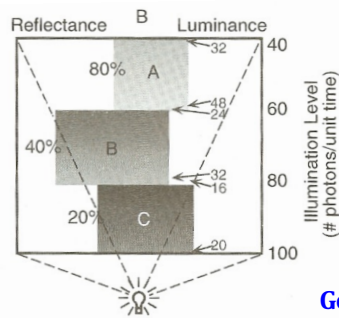
Piet Mondrian  
*Composition A, 1923*



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## Land's Retinex theory\*



$$L(x, y) = E(x, y) * R(x, y)$$

$L(x, y)$ : luminance

$E(x, y)$ : illuminant

$R(x, y)$ : surface reflectance

**Goal:** recover surface reflectance

$$\frac{48}{24} \times \frac{32}{16} = \frac{1536}{384} = \frac{4}{1}$$

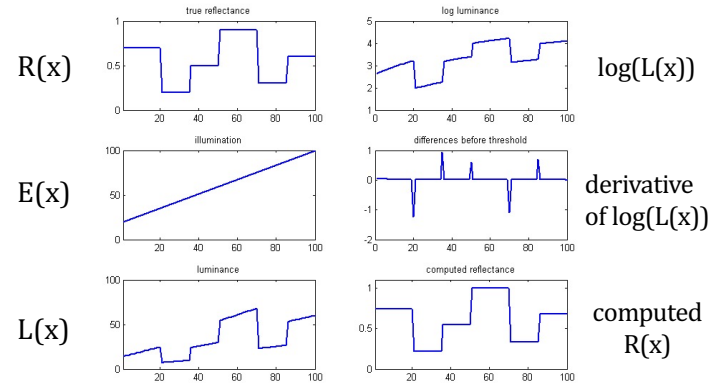
Luminance Edge Calculation of A to C

\* ignore color for now...

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## Land's Retinex theory (1D)



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## Retinex theory for 2D color analysis

2D extensions:

- Land & McCann: multiple 1D paths
- Horn: 2D analysis based on Laplacian  $\nabla^2 L$
- Jobson, Rahman & Woodell: applied to image enhancement

Color:

- Perform same analysis for  $I_S(x, y)$ ,  $I_M(x, y)$ ,  $I_L(x, y)$
- Triplet of values  $R_S(x, y)$ ,  $R_M(x, y)$ ,  $R_L(x, y) \Rightarrow$  color

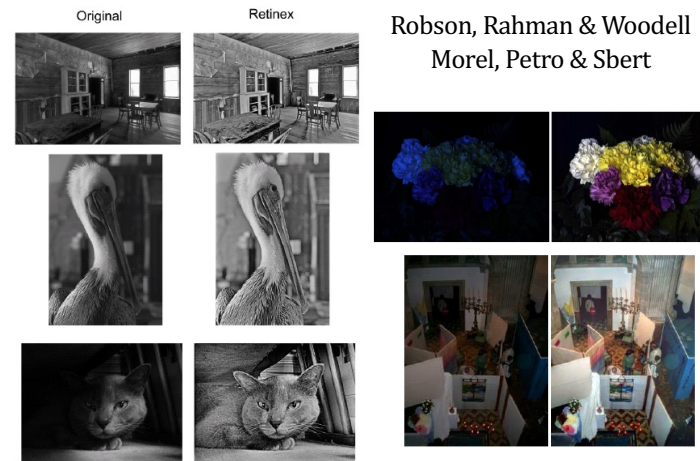
Restrictions (Assumptions):

- Reflectance changes abruptly, illumination changes slowly
- Matte (Lambertian) reflectance characteristics

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## Image enhancement, Retinex style



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