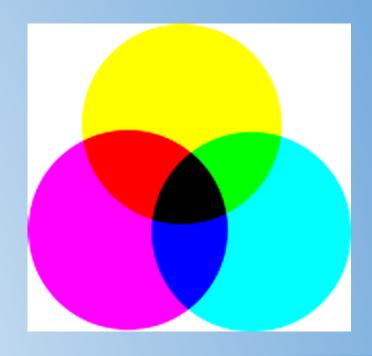
## COLOR APPEARANCE MODELS

Mehdi Rahimzadeh





### What is color?

- An Attribute of visual sensation
- Cannot be defined without examples





### Rayleigh Scattering

• For small particles x<<1

$$x = \frac{2\pi r}{\lambda}.$$

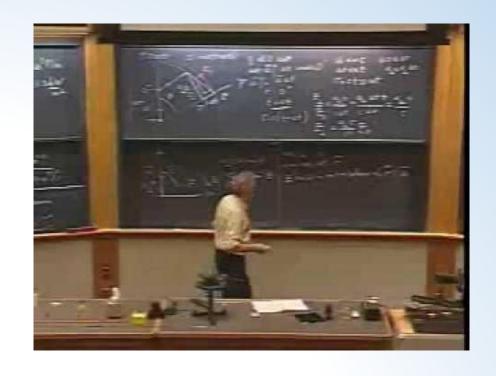
Scattered rays

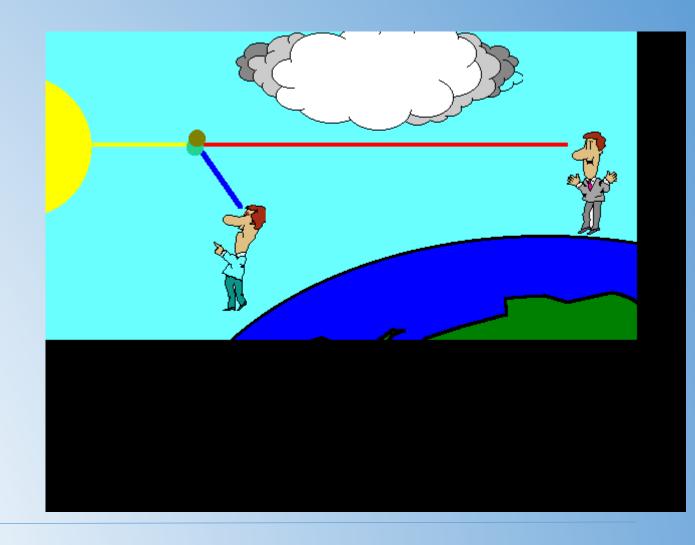
$$I = I_0 \frac{1 + \cos^2 \theta}{2R^2} \left(\frac{2\pi}{\lambda}\right)^4 \left(\frac{n^2 - 1}{n^2 + 2}\right)^2 \left(\frac{d}{2}\right)^6$$

Lower wavelength, higher scattering



### Rayleigh Scattering







### Color properties: Color

 Attribute of visual perception consisting of any combination of chromatic and achromatic content





### Color properties: Hue

- An area appears to be similar to one of the perceived colors:
- Red, Yellow, Green, Blue





### Color properties: Brightness and Lightness

- Brightness: An area appears to emit more or less light
- Lightness: The brightness of an area judged relative to brightness of a similarly illuminated white area

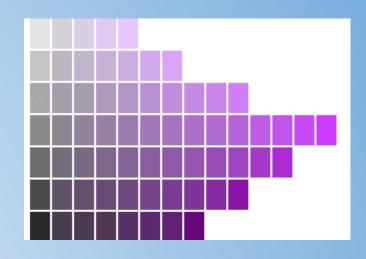


$$Lightness = \frac{Brightness}{Brightness (White)}$$



### Color properties: Colorfulness and Chroma

- Colorfulness: An area appears to be more or less chromatic
- Chroma: The colorfulness of an area judged as a proportion of the brightness of similarly illuminated white



$$Chroma = \frac{Colorfulness}{Brightness (White)}$$



### Color properties: Saturation

 Colorfulness of an area judged to its brightness

$$Saturation = \frac{Chroma}{Lightness}$$

$$Saturation = \frac{Colorfulness}{Brightness (White)} \times \frac{Brightness (White)}{Brightness}$$

$$Saturation = \frac{Colofulness}{Brightness}$$



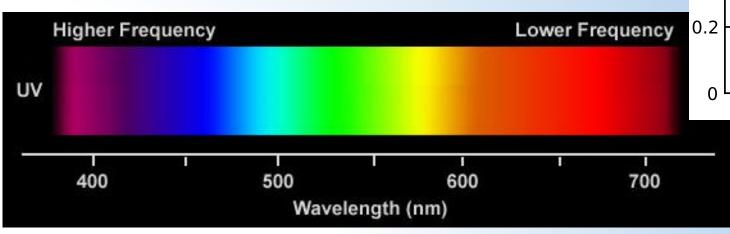
### Color properties:

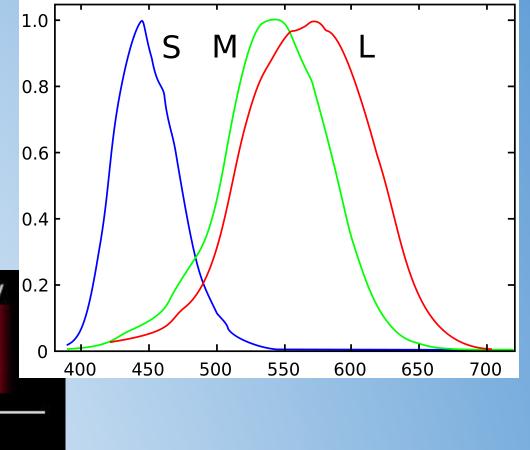
- Brightness
- Lightness
- Colorfulness
- Chroma
- Hue



### Human Color Perception:

- Color spectrum
- Cone responses (L, M, S)

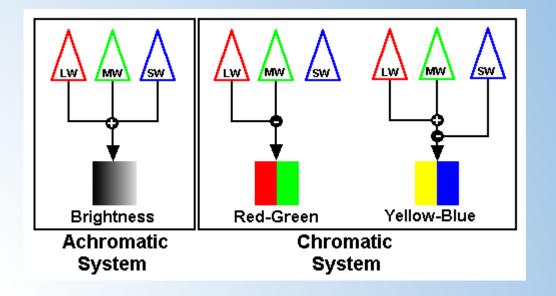






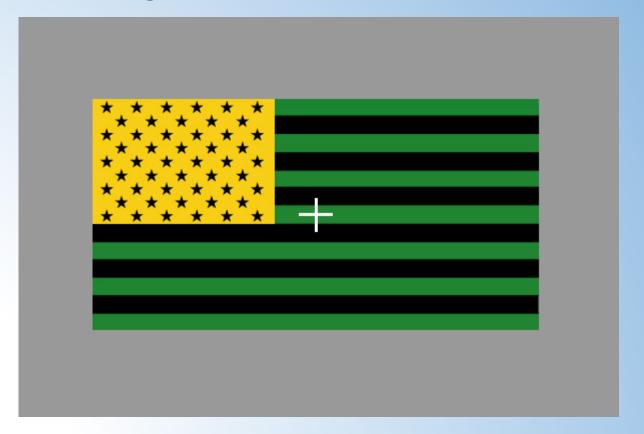
### Opponent Color Theory:

Primary colors are encoded before sending to brain





# US Flag afterimage:

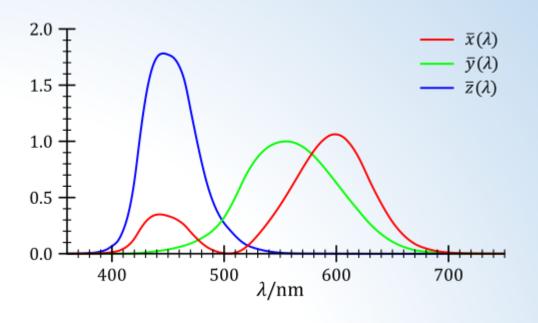




### US Flag afterimage:



### CIE 1937 XYZ matching functions:

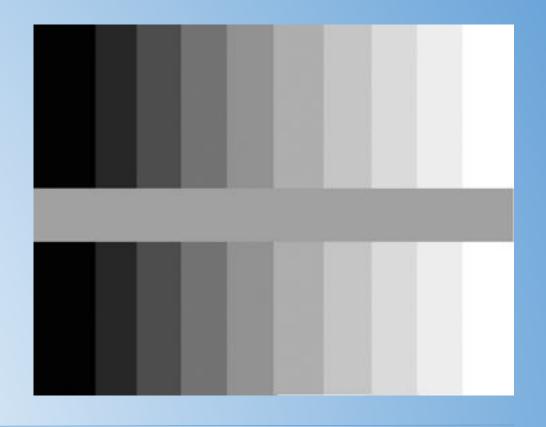


$$X = \int_{380}^{780} I(\lambda) \, \overline{x}(\lambda) \, d\lambda$$
$$Y = \int_{380}^{780} I(\lambda) \, \overline{y}(\lambda) \, d\lambda$$
$$Z = \int_{380}^{780} I(\lambda) \, \overline{z}(\lambda) \, d\lambda$$

Color Appearance Phenomena:

Simultaneous Contrast

 Darker background cause the gray ribbon appear lighter



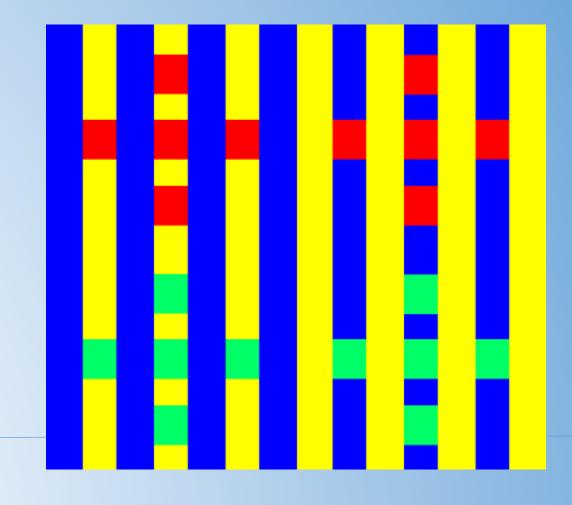


Color Appearance Phenomena:

Simultaneous Contrast

• Robertson (1996)

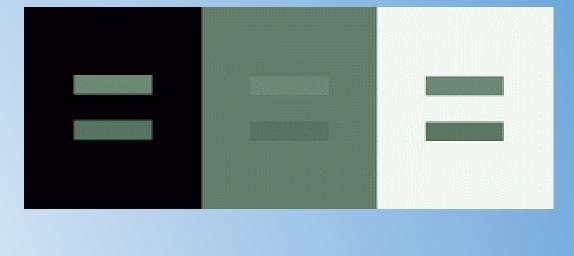
 Darker background cause the gray ribbon appear lighter





### Color Appearance Phenomena: Crispening

 Increase in perceived magnitude of color differences when the background is similar in color

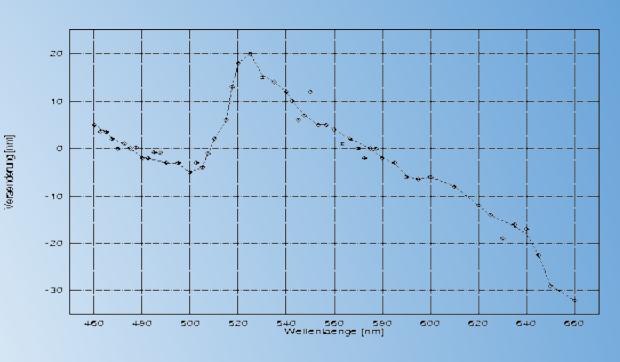




### Color Appearance Phenomena:

### Bezold-Brucke Hue Shift

- Hue changes with luminance
- Wavelength shift required to maintain constant hue across a 10X reduction in luminance





### Color Appearance Phenomena:

- Hunt Effect: Colorfulness increases with luminance
- Stevens Effect: Contrast increases with luminance



### Color Appearance Phenomena: Helson-Judd effect

- Under strongly monochromatic illumination
- Samples lighter than the background exhibited
   Chroma of the same hue as the source
- Samples darker than background exhibited Chroma of the hue of the source's complement



# Color Appearance Phenomena: Discounting-the-Illuminant

- Cognitive ability of observers to interpret the colors of objects based on illuminated environment in which the are viewed
- White objects appear white under tungsten light, fluorescent light, and daylight.



### Color Appearance Model:

- Any model that includes predictors of at least the relative color-appearance attributes of lightness, chroma, and hue
- It must include at least some form of a chromatic-adaptation transform



### Color Appearance Model:

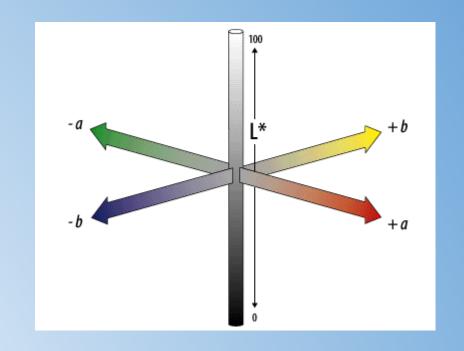
- Transform of XYZ tri-stimulus values to cone responses
- Viewing environment (tri-stimulus of adaptation stimulus)



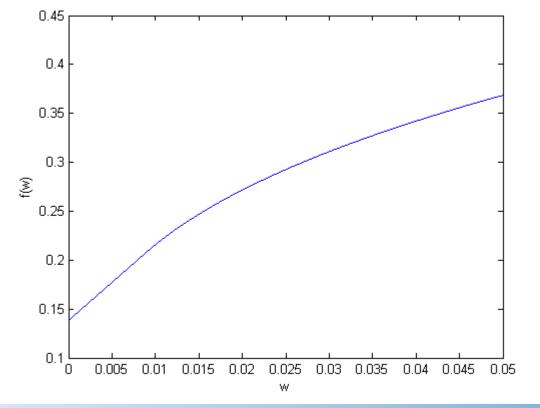
- Stimulus XYZ
- Reference White  $X_n$ ,  $Y_n$ ,  $Z_n$
- Results in L (luminance), a, and b (chrominance) parameters



- a: red-green
- b: yellow-blue
- $L = 116(Y/Y_n) 16$
- $a = 500[f(X/X_n) f(Y/Y_n)]$
- $b = 200[f(Y/Y_n) f(Z/Z_n)]$



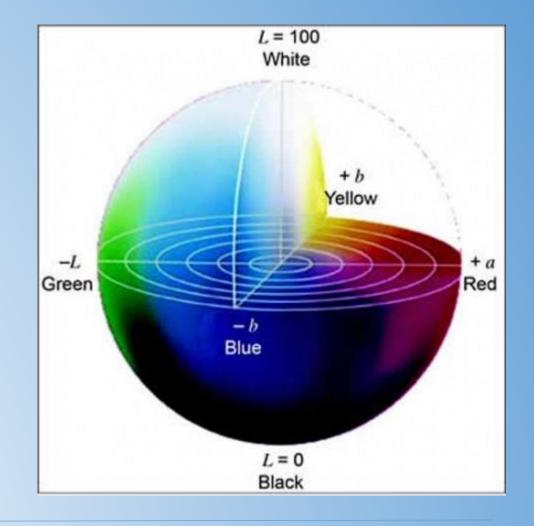




• 
$$f(\omega) = \begin{cases} \omega^{1/3} \\ 7.787\omega + 16/116 \end{cases}$$

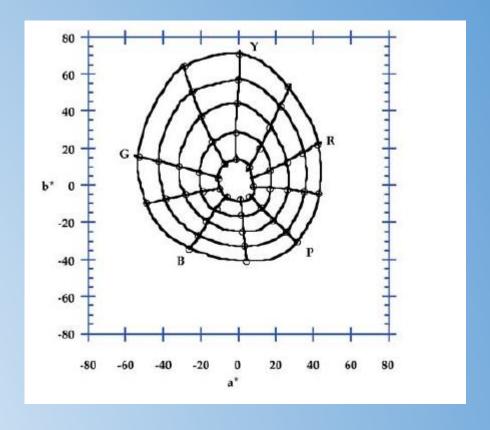


- Chroma:  $C_{ab} = \sqrt{a^2 + b^2}$
- Hue:  $h_{ab} = \tan^{-1}(b/a)$





- Contours of constant
   Chroma and Hue
- Lines: constant Hue
- Circles: constant Chroma





#### **CIELAB: Pros and Cons**

- Not accurate von Kries adaptation transformation
- Incapable of predicting luminance-depending effects (Hunt and Stevens effect)
- Incorporate no background or surround dependency
- No modeling for discounting-the-illuminant



### Nayatani et al:

- Luminance factor of achromatic background  $(Y_0)$
- Color of the illumination  $(x_0, y_0)$
- Test stimulus in (x, y, Y)
- Absolute luminance of the stimulus  $(E_0)$
- Normalizing illuminance  $(E_{or})$
- Noise term (n)



### Nayatani et al:

- Converting XYZ to intermediate values
- $\xi = (0.48105x_0 + 0.78841y_0 0.08081)/y_0$
- $\eta = (0.27200x_0 + 1.11962y_0 0.04570)/y_0$
- $\zeta = 0.91822(1 x_0 y_0)/y_0$



### Nayatani et al: adaptation model

$$\beta_1(R_0) = \frac{6.469 + 6.362R_0^{0.4495}}{6.469 + R_0^{0.4495}}$$

$$\beta_1(G_0) = \frac{6.469 + 6.362G_0^{0.4495}}{6.469 + G_0^{0.4495}}$$

$$\beta_2(B_0) = \frac{8.414 + 8.091B_0^{0.5128}}{8.414 + B_0^{0.5128}} \times 0.7844$$

$$\beta_1(L_{\text{or}}) = \frac{6.469 + 6.362 L_{\text{or}}^{0.4495}}{6.469 + L_{\text{or}}^{0.4495}}$$

$$\begin{vmatrix} R \\ G \\ B \end{vmatrix} = \begin{vmatrix} 0.40024 & 0.70760 & -0.08081 \\ -0.22630 & 1.16532 & 0.04570 \\ 0.0 & 0.0 & 0.91822 \end{vmatrix} \begin{matrix} X \\ Y \\ Z \end{matrix}$$

$$e(R) = \begin{cases} 1.758 & R \ge 20\xi \\ 1.0 & R < 20\xi \end{cases}$$

$$e(G) = \begin{cases} 1.758 & G \ge 20\eta \\ 1.0 & G < 20\eta \end{cases}$$



### Nayatani et al: Opponent color dimension

Achromatic response 
$$Q = \frac{41.69}{\beta_1(L_{or})} \left[ \frac{2}{3} \beta_1(R_o) e(R) \log \frac{R+n}{20\xi+n} + \frac{1}{3} \beta_1(G_o) e(G) \log \frac{G+n}{20\eta+n} \right]$$

Chromatic response 
$$t = \beta_1(R_0) \log \frac{R+n}{20\xi+n} - \frac{12}{11} \beta_1(G_0) \log \frac{G+n}{20\eta+n} + \frac{1}{11} \beta_2(B_0) \log \frac{B+n}{20\zeta+n}$$

$$p = \frac{1}{9}\beta_1(R_0)\log\frac{R+n}{20\xi+n} + \frac{1}{9}\beta_1(G_0)\log\frac{G+n}{20\eta+n} - \frac{2}{9}\beta_2(B_0)\log\frac{B+n}{20\zeta+n}$$



### Nayatani et al: Pros and Cones

- Accounts for change in color appearance due to chromatic adaptation and luminance level (Stevens and Hunt effect)
- Predicts Helsun-Judd effect
- No chromatic or cognitive adaptation (von Kries and discounting-the-illuminant)
- Not incorporate rod vision



#### Hunt Model:

- Heavily depends on surround relative luminance
- Transparencies projected in a dark room
- Television displays in a dim surround



#### Hunt Model:

- Chromaticity coordinates of the illuminant and the adapting field
- Chromaticity and luminance factors of the background, reference white and test sample



### Hunt Model: adaptation model

$$\begin{vmatrix} \rho \\ \gamma \\ \beta \end{vmatrix} = \begin{vmatrix} 0.38971 & 0.68898 & -0.07868 \\ -0.22981 & 1.18340 & 0.04641 \\ 0.0 & 0.0 & 1.0 & Z \end{vmatrix}$$

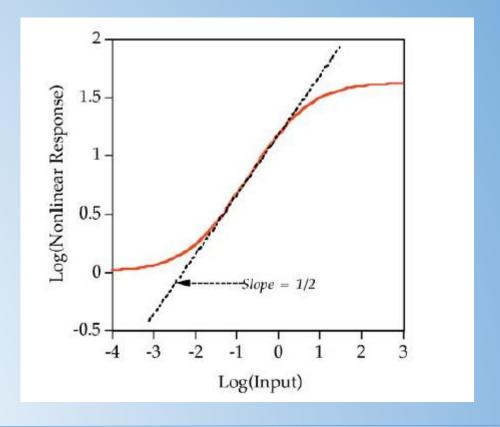
$$\begin{split} \rho_{\mathrm{a}} &= B_{\mathrm{p}}[f_{\mathrm{n}}(\mathrm{F_L}\mathrm{F_{\mathrm{p}}}\rho/\rho_{\mathrm{W}}) + \rho_{\mathrm{D}}] + 1 \\ \gamma_{\mathrm{a}} &= B_{\mathrm{y}}[f_{\mathrm{n}}(\mathrm{F_L}\mathrm{F_{\mathrm{y}}}\gamma/\gamma_{\mathrm{W}}) + \gamma_{\mathrm{D}}] + 1 \\ \beta_{\mathrm{a}} &= B_{\mathrm{\beta}}[f_{\mathrm{n}}(\mathrm{F_L}\mathrm{F_{\mathrm{\beta}}}\beta/\beta_{\mathrm{W}}) + \beta_{\mathrm{D}}] + 1 \end{split}$$

- $F_L$ : Luminance-level adaptation factor
- $F_{\rho}$ ,  $F_{\gamma}$ , and  $F_{\beta}$  are chromatic adaptation factors
- $\rho_D$ ,  $\gamma_D$ , and  $\beta_D$  are Helson-Judd effect factors
- $B_{\rho}$ ,  $B_{\gamma}$ , and  $B_{\beta}$  are cone bleach factors



### Hunt Model: adaptation model

$$f_{\rm n}[I] = 40[I^{0.73}/(I^{0.73} + 2)]$$





### Hunt Model: Opponent color dimension

$$A_{a} = 2\rho_{a} + \gamma_{a} + (1/20)\beta_{a} - 3.05 + 1$$

$$C_{1} = \rho_{a} - \gamma_{a}$$

$$C_{2} = \gamma_{a} - \beta_{a}$$

$$C_{3} = \beta_{a} - \rho_{a}$$

### A: Achromatic post-adaptation signal



#### Hunt Model: Pros and Cons

- Designed to predict the appearance of stimuli in a variety background and surround
- Predicts Hunt effect, Hue shift, Helson-Judd effect, Simultaneous constant, Stevens effect
- Predicts chromatic adaptation due to discounting-the-illuminant



#### Hunt Model: Pros and Cons

- It is very complex model
- Extreme poor result on incomplete input data
- Cannot be easily converted
- Expensive and difficult to implement



#### RLAB:

- XYZ of the test object
- $X_n, Y_n, Z_n$  of the white point
- Absolute luminance of the white object in  $cd/m^2$
- Relative luminance of the surround
- Is discounting-the-illuminant taking place?



#### RLAB:

$$egin{array}{c|c} X_{\mathrm{ref}} \\ Y_{\mathrm{ref}} \\ Z_{\mathrm{ref}} \end{array} = \mathbf{RAM} egin{array}{c|c} X \\ Y \\ Z \end{array}$$

- M: Cone Response Transformation
- A: von Kries adaptation
- R:  $A^{-1}M^{-1}$  for reference viewing conditions

$$\mathbf{M} = \begin{vmatrix} 0.3897 & 0.6890 & -0.0787 \\ -0.2298 & 1.1834 & 0.0464 \\ 0.0 & 0.0 & 1.0000 \end{vmatrix}$$

$$\mathbf{A} = \begin{vmatrix} a_L & 0.0 & 0.0 \\ 0.0 & a_M & 0.0 \\ 0.0 & 0.0 & a_S \end{vmatrix}$$

$$\mathbf{R} = \begin{vmatrix} 1.9569 & -1.1882 & 0.2313 \\ 0.3612 & 0.6388 & 0.0 \\ 0.0 & 0.0 & 1.0000 \end{vmatrix}$$

### RLAB: Opponent color dimension

Analogous to CIELAB

$$L^R = 100(Y_{\rm ref})^{\sigma}$$

$$\alpha^R = 430[(X_{\text{ref}})^{\sigma} - (Y_{\text{ref}})^{\sigma}]$$

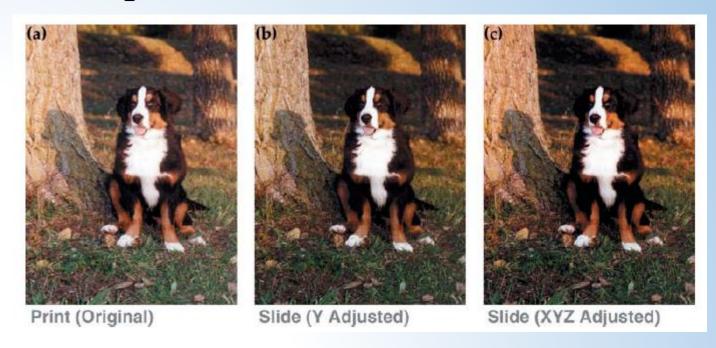
$$b^{R} = 170[(Y_{ref})^{\sigma} - (Z_{ref})^{\sigma}]$$

- Average surround  $\sigma = 1/2.3$
- Dim surround  $\sigma = 1/2.7$
- Dark surround  $\sigma = 1/3.5$



### RLAB:

Adaptation to dark surround





#### **RLAB: Pros and Cons**

- Predicts discounting-the-illuminant
- Includes variable exponent for better contrast in different surroundings
- Not exhaustive in predicting color-appearance phenomena (Hunt, Helson-Judd, Stevens)
- Not over a wide range of luminance

