



Color

T. Maugey

Human Visual
System

Human
perception

Colorimetry

Demosacking

Hyperspectral
Imaging

Color transfer

Reference

Master SIF - REP (Part 3)

Color Representation

Thomas Maugey
thomas.maugey@inria.fr



Inria

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Eye structure

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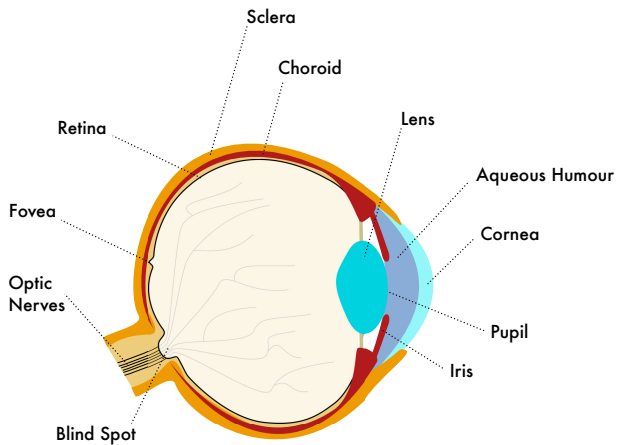
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Photosensors

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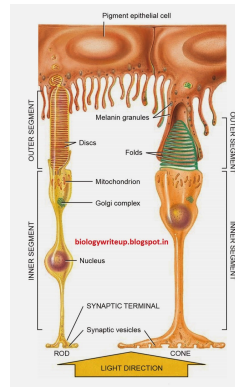
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Two types of Photosensors on the retina:

- **Rods:** achromatic vision
 - very sensitive to light intensity
 - night vision
 - low visual acuity
 - slow response to light
 - 120 millions in each retina
- **Cones:** color vision
 - not very sensitive to light intensity
 - high visual acuity
 - fast response to stimuli
 - 3 sorts of cones: Blue, Green, Red
 - 6 millions in each retina





Photosensors Distribution

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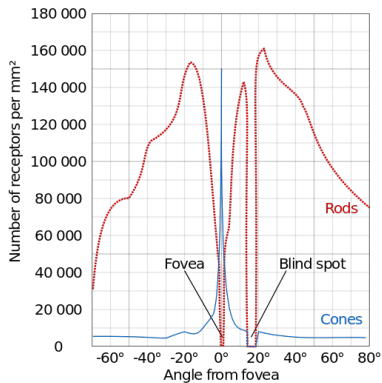
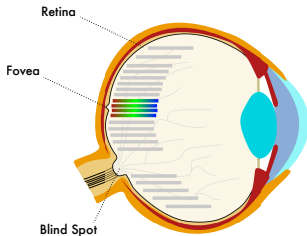
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Cones in the fovea

Rods in the retina



The Human vision is thus more sensible to light intensity than color.



Eye capture

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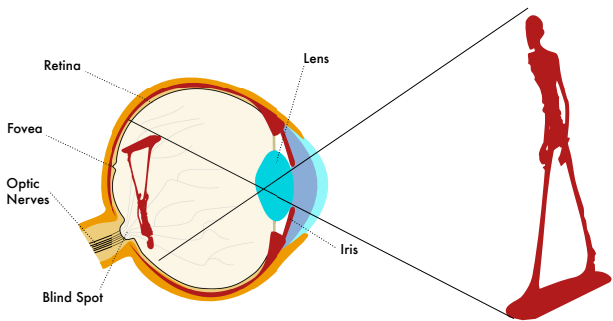
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Iris controls the quantity of light that enters in the eye (aperture)



Blind spot

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Demonstration of the blind spot

RL

Instructions: Close one eye and focus the other on the appropriate letter (R for right or L for left). Place your eye a distance from the screen approximately equal to 3x the distance between the R and the L. Move your eye towards or away from the screen until you notice the other letter disappear. For example, close your right eye, look at the "L" with your left eye, and the "R" will disappear.

[Wikipedia]



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Measuring light

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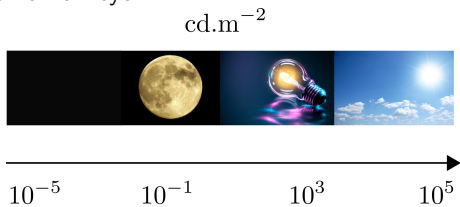
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Brightness: Human's visual perception of "how much" a source is reflecting or radiating light.

Luminance: is the luminous intensity per unit area and is measured in cd.m^{-2} . It also corresponds to the photometric quantity of light arriving at the human eye.



Other physical measurement of light: light intensity (Candela), luminous flux (Lumen), illuminance or luminous emittance (Lux).



Human's perception

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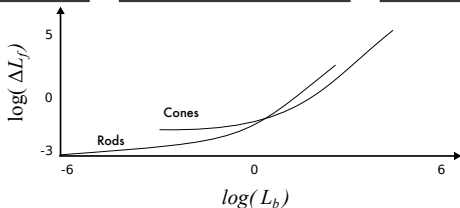
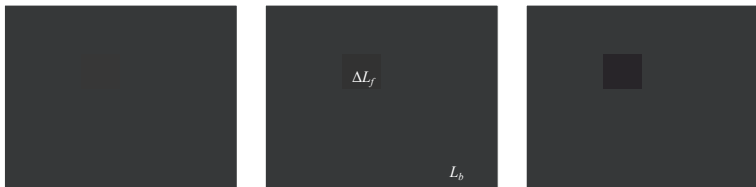
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Brightness not straightforwardly linked to Luminance



[Blackwell, H. (1981). An analytical model for describing the influence of lighting parameters upon visual performance, volume 1: Technical foundations.]

[Barten, P. G. J. (1992). Physical model for the contrast sensitivity of the human eye. In Rogowitz, B. E., editor, SPIE 1666, Human Vision, Visual Processing, and Digital Display III,, pages 5772.]



Context dependent interpretation

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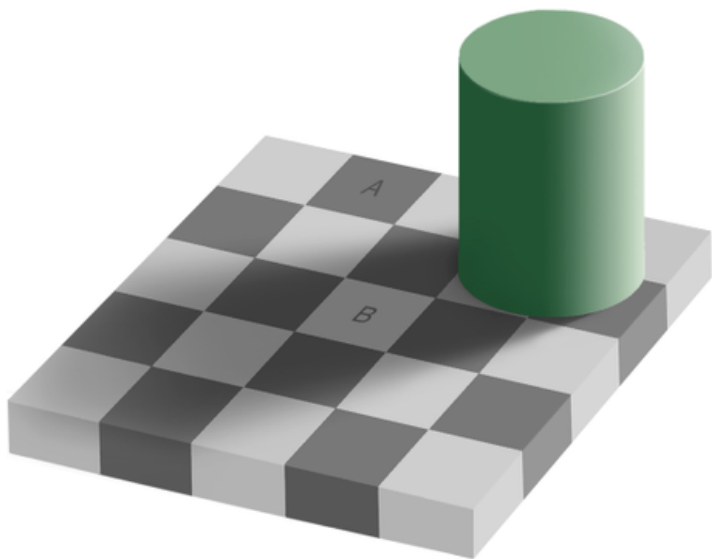
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Context dependent interpretation

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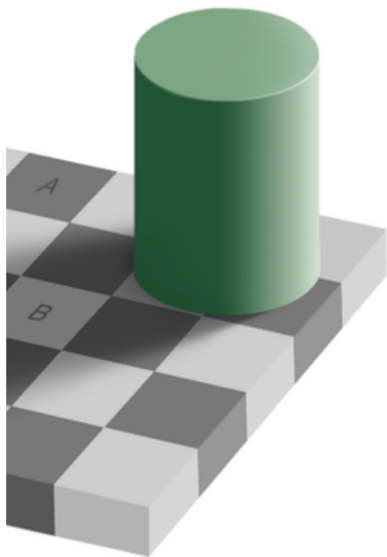
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Color perception

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Perception of color is also a mental construction of the brain

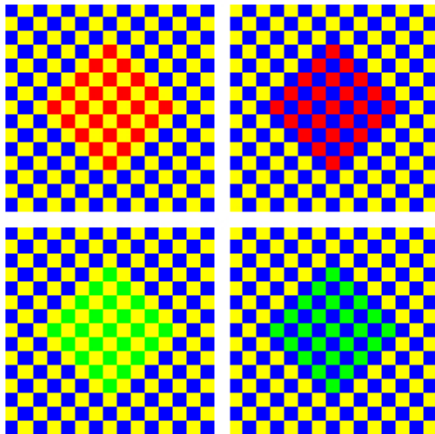




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Color perception

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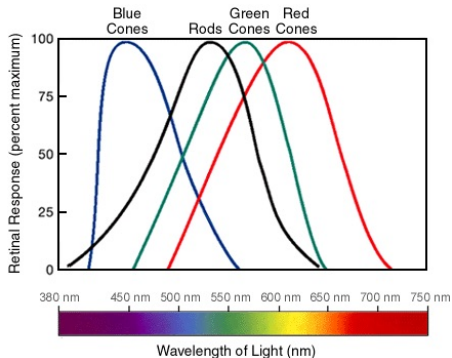
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Three color channels filtered by the cones → trichromatic vision



Digression

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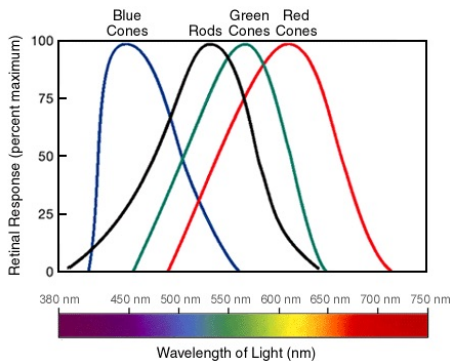
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Why the visible light spectrum is the visible light spectrum?





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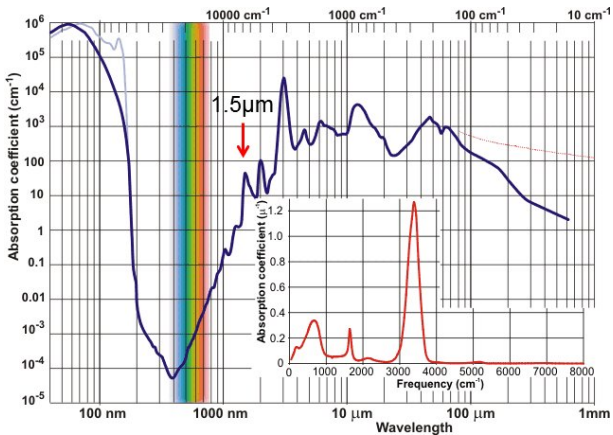
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Water's absorption properties





Colorimetry

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Colorimetry is the field of assigning code values to perceived colors.

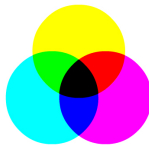
There are several ways to represent perceived colors using color spaces.

A **color space** is an abstract mathematical representation designed to describe the way color can be represented as a combination of code values (i.e. color components or color channels).

Synthesis: Additive



Subtractive



The **Gamut** designates a complete range or scope of a color space.



RGB Color space

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In 1931, the Commission Internationale de l'Eclairage (CIE) defined the standard CIE 1931 RGB color space.

Color vectorial space of dimension 3 (additive colors)

$$\lambda_R = 700nm, \lambda_G = 546.1nm, \lambda_B = 435.8nm$$



[Smith, T. and Guild, J. (1931). The c.i.e. colorimetric standards and their use. Transactions of the Optical Society, 33(3):73]



RGB drawbacks

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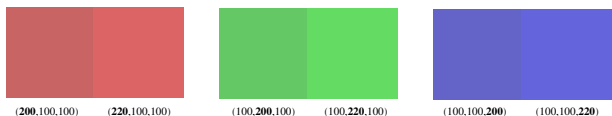
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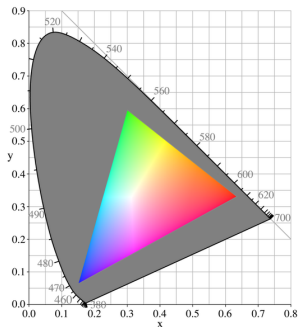
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- Relative luminance
- The eye/brain does not respond equally between the channels



- The full gamut is achievable only with negative values.





XYZ Color space

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In 1931, the CIE defined the standard CIE 1931 XYZ color space which includes all of the visible gamut.

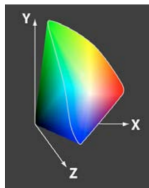
Y = Luminance

Z = the response of the “blue” cone

X = linear combination of “green” and “red” cones

Given a Y , the plan XZ gives all the chromaticities at the given luminance.

$$\begin{bmatrix} X \\ Y \\ Z \end{bmatrix} = \begin{bmatrix} 2.7689 & 1.7517 & 1.1302 \\ 1.0000 & 4.5907 & 0.0601 \\ 0.0000 & 0.056508 & 5.5943 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$





Chromaticity diagram

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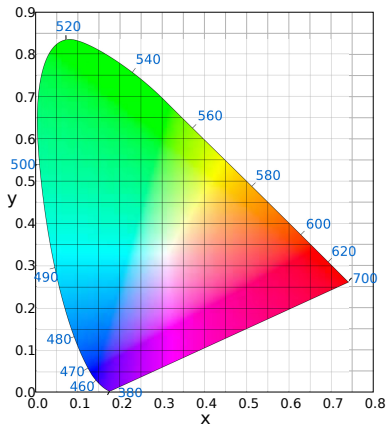
Chrominance

$$x = \frac{X}{X+Y+Z}$$

$$y = \frac{Y}{X+Y+Z}$$

Chromaticity diagram

- Pure color: "outside" border
- $x = y = 1/3$ white
- a line define the linear combination between two colors



Limits: still not perfectly matching the color perception



HSV color space

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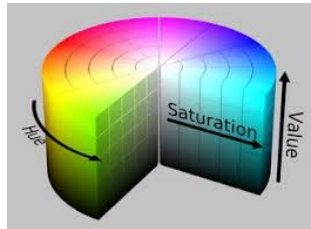
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Reference

- H = "hue"
Color identity on the wheel



- S = Saturation
Color intensity
- V = value
Color luminance





YUV color space

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$$\begin{bmatrix} Y \\ U \\ V \end{bmatrix} = \begin{bmatrix} 0.299 & 0.587 & 0.114 \\ -0.14713 & -0.28886 & 0.436 \\ 0.615 & -0.51498 & -0.10001 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

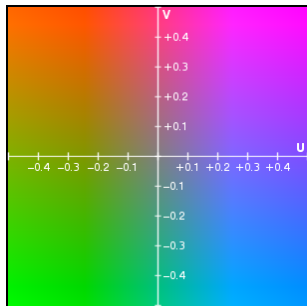
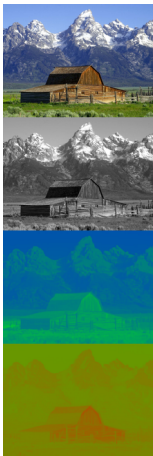




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Capture with Bayer pattern

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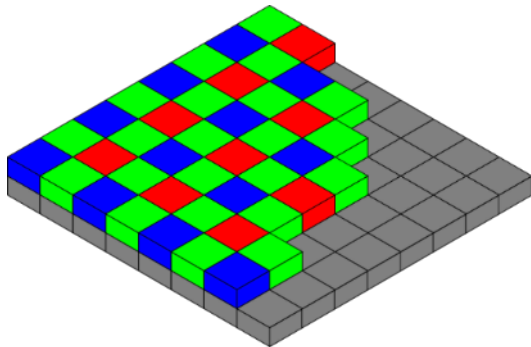
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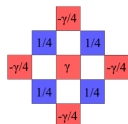
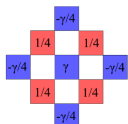
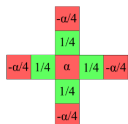
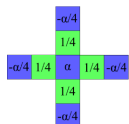
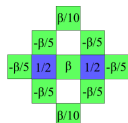
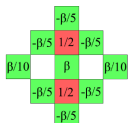
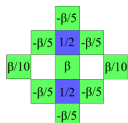
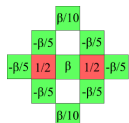
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Retrieve the green component at a red location:

$$\hat{G}(i, j) = \frac{1}{4} (G(i - 1, j) + G(i + 1, j) + G(i, j - 1) + G(i, j + 1)) + \alpha \Delta R(i, j)$$

and

$$\Delta R(i, j) = R(i, j) - \frac{1}{4} (R(i - 2, j) + R(i + 2, j) + R(i, j - 2) + R(i, j + 2))$$

with $\alpha = 1/2$, $\beta = 5/8$, $\gamma = 3/4$



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Hyperspectral Imaging

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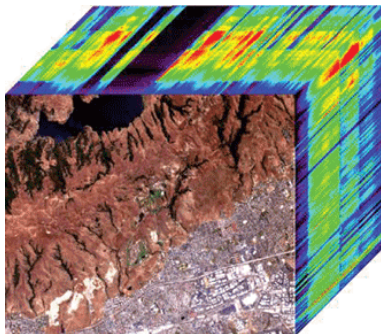
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One image per band:



The image is now a tensor of dimension 3.

[Ziph Schatzberg, L. (2014). Hyperspectral imaging enables industrial applications. Industrial Photonic.]



Hyperspectral Imaging

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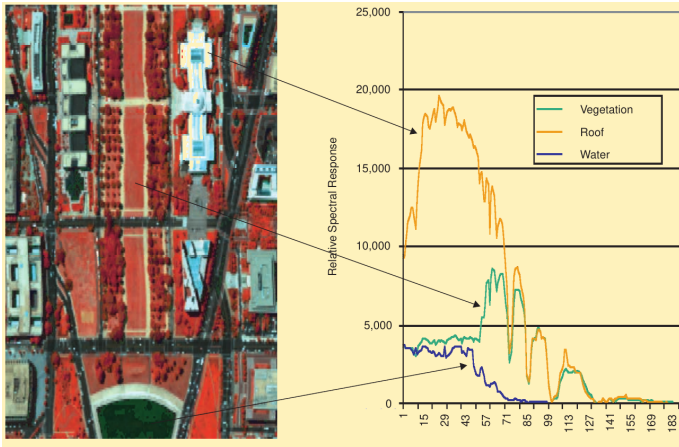
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[Landgrebe, D. (2002). Hyperspectral image data analysis. IEEE Signal processing magazine, 19(1), 17-28.]



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Color Transfer example

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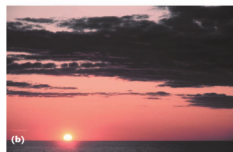
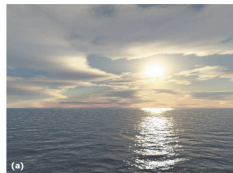
Color transfer

Reference

Given a reference image (a)

Modify an input image (b)

Such that the resulting image (c)
has the color of (b)



[Reinhard, E., Adhikhmin, M., Gooch, B., Shirley, P. (2001). Color transfer between images. IEEE Computer graphics and applications, 21(5), 34-41.]



General concept of Color transfer:

- Find a good representation of the color
- Transfer the characteristics of the reference image into the input one

What is a good representation ? Different answers in the literature

- Different color space
- Parametric / non parameteric
- Global / local



Choice of Colorspace

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Need of having decorrelated color channels

RGB:



RG : $cc = 0.72$ RB : $cc = 0.51$ BG : $cc = 0.80$

Not a good choice

YUV, XYZ, HUV: less correlated but still not satisfying



Example

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Characteristics: $l\alpha\beta$ color space / parametric / global

Color space conversion (RGB) \rightarrow (LMS- cones' response) \rightarrow ($l\alpha\beta$)

$$\begin{bmatrix} L \\ M \\ S \end{bmatrix} = \begin{bmatrix} 0.3811 & 0.5783 & 0.0402 \\ 0.1967 & 0.7244 & 0.0782 \\ 0.0241 & 0.1288 & 0.8444 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

then

$$\begin{bmatrix} l \\ \alpha \\ \beta \end{bmatrix} = \begin{bmatrix} \frac{1}{\sqrt{3}} & 0 & 0 \\ 0 & \frac{1}{\sqrt{6}} & 0 \\ 0 & 0 & \frac{1}{\sqrt{2}} \end{bmatrix} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & -2 \\ 1 & -1 & 0 \end{bmatrix} \begin{bmatrix} \log L \\ \log M \\ \log S \end{bmatrix}$$

$l\alpha\beta$ channels are decorrelated and very close to human's perception
 \rightarrow the three channels are treated separately

[Reinhard, E., Adhikhmin, M., Gooch, B., Shirley, P. (2001). Color transfer between images. IEEE Computer graphics and applications, 21(5), 34-41.]



Algorithm

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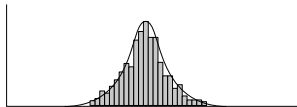
The distribution is assumed to be Gaussian

Remove the mean of each channel:

$$l^* = l_{\text{in}} - \bar{l}_{\text{in}}$$

$$\alpha^* = \alpha_{\text{in}} - \bar{\alpha}_{\text{in}}$$

$$\beta^* = \beta_{\text{in}} - \bar{\beta}_{\text{in}}$$



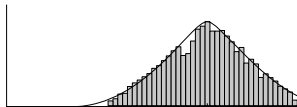
Input

Adjust the variance and the mean of each channel:

$$l' = \frac{\sigma_{\text{ref}}^l}{\sigma_{\text{in}}^l} l^* + \bar{l}_{\text{ref}}$$

$$\alpha' = \frac{\sigma_{\text{ref}}^\alpha}{\sigma_{\text{in}}^\alpha} \alpha^* + \bar{\alpha}_{\text{ref}}$$

$$\beta' = \frac{\sigma_{\text{ref}}^\beta}{\sigma_{\text{in}}^\beta} \beta^* + \bar{\beta}_{\text{ref}}$$



Target



Results

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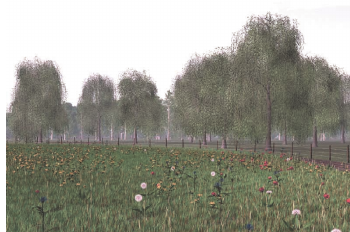
Input



Color Transfer in RGB



Reference



Color Transfer in $l\alpha\beta$



Other approaches

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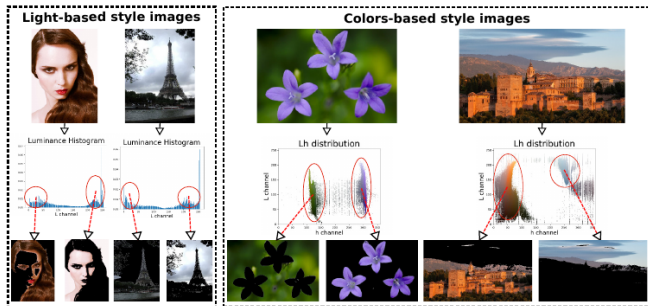
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- Local: bright/dark regions, color clusters



- Parametric: more complex distributions
- Non-parametric: histogram alignment, optimal transport
- Smart transfer: gradient, style



Some results

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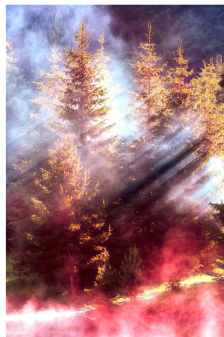
Reference



Input image



Target image



Result

Example 1

Input



Reference



Ours



[Hristova, H., Le Meur, O., Cozot, R., Bouatouch, K. (2015, June). Style-aware robust color transfer. In Computational Aesthetics (pp. 67-77).]



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