Comp Photography Final Project

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Image Colorization

Project Description: This project is proposed to replicate the colorization algorithm presented in the paper *Colorization using Optimization* by A. Levin, D. Lischinski, and Y. Weiss.

This project is to colorize the black-and-white images marked with color scribbles. In addition, I extended the scope to colorize black-and-white video clips.

The Goal of Your Project

Original project scope:

Given a grayscale image marked with some color scribbles, the presented algorithm is able to colorize the image. The colorized image is then compared to the original color image.

What motivated you to do this project?

In my childhood, I saw some funny black-and-white movies, such as the ones performed by Charles Spencer Chaplin. At that time, I had a dream to colorize them using the modern colors, and this left me a room for imagination. After learning computational photography, I am finally equipped necessary skills to fulfill my child dream.

Scope Changes

 Did you run into issues that required you to change project scope from your proposal?

No, I haven't met issues during replication. However, when I finished colorizing still black-and-white images, I still got time remaining before the deadline. As such, I extended the scope to colorize black-and-white video clips.

Showcase

To colorize still image

Input 1: black and white image



Input: marked image







Input 2: marked Image



Output: colorized image



Output: colorized Image

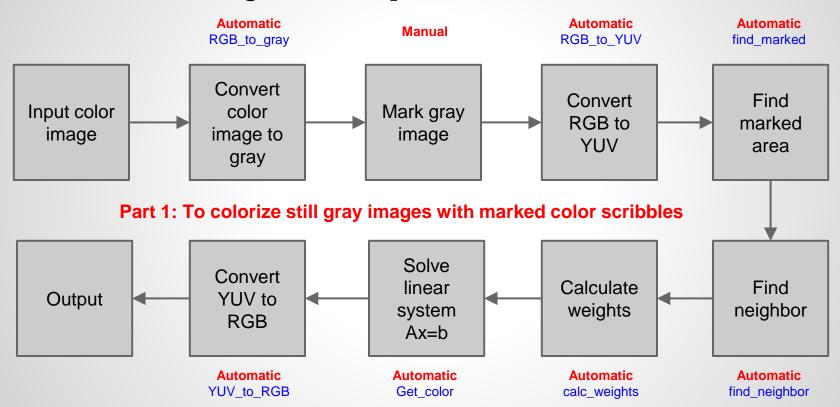


Compared to original image

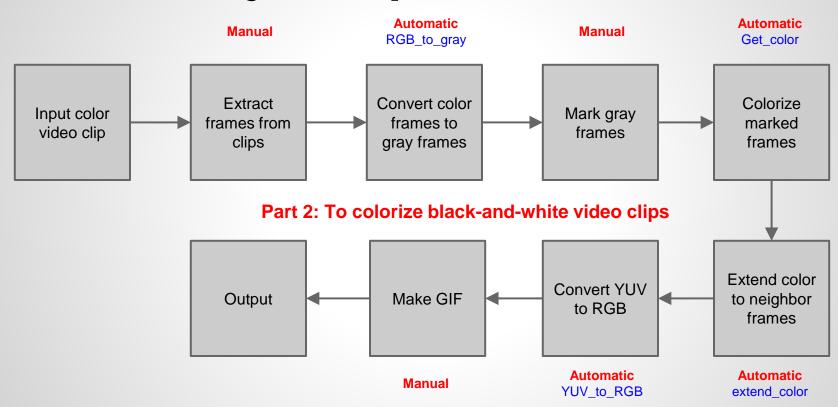




Project Pipeline: Part 1



Project Pipeline: Part 2



Demonstration: Result Sets

First I tested my code based on the set of images presented in the paper.
 After successfully replicated the results, I tested my codes based on four sets of my own images, downloaded online.

Dropbox links to test images:

https://www.dropbox.com/sh/b38gnbpgjp737h8/AAD-mae1x2mGW0dUNZd6Hqjoa?dl=0

Demonstration: Result Sets



Input 1: black and white image



Output: colorized image



Input 2: marked image



Compared to original image



Input 1: black and white image



Output: colorized image



Input 2: marked image



Compared to original image



Input 1: black and white image



Output: colorized image



Input 2: marked image



Compared to original image



Input 1: black and white image



Output: colorized image



Input 2: marked image



Compared to original image



Input 1: black and white image



Output: colorized image



Input 2: marked image



Compared to original image

Purpose: to colorize still black-and-white image

Step 1: Take a colored image, and convert it to black-and-white

- 1. Convert the colored image into YUV format
- 2. Keep only intensity channel Y, and ignore the color channels U and V
- 3. Convert the Y channel back to RGB channel
- 4. Save to black-and-white image

Note: see function *RGB_to_gray* for coding details

Step 2: Manually mark the black-and-white image using color scribbles

I used MS paint to mark the black-and-white image. At the same time, I open the color image in Photoshop to get the color information (i.e. R, G, B values). With these RGB values, I used the paint to mark the gray image with color scribbles.

Step 3: To convert the black and white images from RGB format to YUV format, where Y stands for intensities, and U and V contain relevant color information.

$$Y = 0.299 \times R + 0.587 \times G + 0.114 \times B$$

 $U = -0.147 \times R - 0.289 \times G + 0.436 \times B$
 $V = 0.615 \times R - 0.515 \times G - 0.100 \times B$

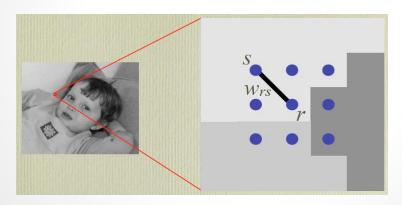
Note: the coefficients above are based on paper by Jack 2001 (see Source slide)

Note: See function *RGB_to_YUV* for coding details

Step 4: To find the matrix U such that J(U) is minimized:

$$J(U) = \sum_{\forall r \in \text{Image}} \left(U(r) - \sum_{s \in N(r)} \omega_{rs} \times U(s) \right)^{2}$$

Subject to constraints: $U[r_m] = u_m$, where $r_m = [i_m, j_m]$ are all marked pixels and u_m are pre-specified marked colors.



Note: the above figure is from one of A. Levin's presentations

In order to solve the above constrained minimization problem, I reshaped the color matrix U from

$$M \times N$$
 dimension matrix $U[i,j]$

to

$$P \times 1$$
 dimension vertical vector $U[j \times N + i]$

with $P = M \times N$, and M and N are number of rows and columns of input image

The above problem is equivalent to find U, such that

• For each colored pixel $r_m = [i_m, j_m]$, set the U value using the given color: $U[j_m \times N + i_m] = u_m$, which can be written in the vector form:

$$[0, ..., 1, ..., 0]_{1 \times P} \boldsymbol{U}_{P \times 1} = u_m$$

• For each uncolored pixel r_m , set the U value to be the weighted average value of neighbor pixels.

$$\begin{split} U[i_m,j_m] - \omega_{[i_m-1,j_m-1],[i_m,j_m]} \times U[i_m-1,j_m-1] \\ - \omega_{[i_m-1,j_m],[i_m,j_m]} \times U[i_m-1,j_m] - \omega_{[i_m-1,j_m+1],[i_m,j_m]} \times U[i_m-1,j_m+1] \\ - \omega_{[i_m,j_m-1],[i_m,j_m]} \times U[i_m,j_m-1] - \omega_{[i_m,j_m+1],[i_m,j_m]} \times U[i_m,j_m+1] \\ - \omega_{[i_m+1,j_m-1],[i_m,j_m]} \times U[i_m+1,j_m-1] - \omega_{[i_m+1,j_m],[i_m,j_m]} \times U[i_m+1,j_m] \\ - \omega_{[i_m+1,j_m+1],[i_m,j_m]} \times U[i_m+1,j_m+1] = 0 \end{split}$$

Where the weight function ω_{rs} , based on equation (2) in the paper, is defined as

$$\omega_{rs} \propto \exp\left(-\frac{(Y[r] - Y[s])^2}{2\sigma_r^2}\right)$$

With σ_r^2 being the variance of the intensity values in the window around pixel **r** with size 1

Combining the above two cases, the constrained problem is equivalent to solve the following linear system

$$AU = b$$

Where A is a $P \times P$ sparse matrix with

• If $r_m = [i_m, j_m]$ is colored, then

$$A[j_m \times N + i_m, l] = \begin{cases} 1 & \text{if } l = j_m \times N + i_m \\ 0 & \text{elsewhere} \end{cases}$$

• If $r_m = [i_m, j_m]$ is not colored, then

$$A[j_m \times N + i_m, l] = \begin{cases} 1 & \text{if } l = j_m \times N + i_m \\ -\omega_{[i_m-1,j_m-1],[i_m,j_m]} & \text{if } l = (j_m-1) \times N + (i_m-1) \\ -\omega_{[i_m-1,j_m],[i_m,j_m]} & \text{if } l = j_m \times N + (i_m-1) \\ -\omega_{[i_m-1,j_m],[i_m,j_m]} & \text{if } l = (j_m+1) \times N + (i_m-1) \\ -\omega_{[i_m,j_m-1],[i_m,j_m]} & \text{if } l = (j_m-1) \times N + i_m \\ -\omega_{[i_m,j_m-1],[i_m,j_m]} & \text{if } l = (j_m+1) \times N + (i_m-1) \\ -\omega_{[i_m+1,j_m-1],[i_m,j_m]} & \text{if } l = (j_m-1) \times N + (i_m-1) \\ -\omega_{[i_m+1,j_m],[i_m,j_m]} & \text{if } l = (j_m-1) \times N + (i_m-1) \\ -\omega_{[i_m+1,j_m+1],[i_m,j_m]} & \text{if } l = (j_m-1) \times N + (i_m-1) \\ & \text{elsewhere} \end{cases}$$

and

$$b[j_m \times N + i_m] = \begin{cases} u_m & \text{if the pixel } r_m = [i_m, j_m] \text{ is colored} \\ 0 & \text{if the pixel } r_m = [i_m, j_m] \text{ is not colored} \end{cases}$$

Note: see function *get_color* for coding details

Step 5: Solving the linear system (2) gives us the color channel U in the vector form

$$U = A^{-1}b$$

then convert the $P \times 1$ vector into a $M \times N$ matrix form.

Note:

- The V color channel can be calculated in the same way as U color channel
- The Y intensity channel is calculated to be the black and white intensities
- See function *get_color* for coding details

Step 6: Convert the colorized image from YUV format to RGB format

$$R = Y + 1.140V$$

 $G = Y - 0.395U - 0.581V$
 $B = Y + 2.032U$

Note: see function *YUV_to_RGB* for coding details

Purpose: to extend colors to grey frames in video clips

Step 1: Manually extract frames of images from video

I manually extract image frames from the source video based online converter filezigzag. Frame for every XXX

Step 2: Convert the colored frames into black-and-white images

In this step, I first convert the image from RGB format to YUV format, then only keep intensity information (Y channel), and ignore the color information (U and V channel). Finally convert back to RGB format to form a gray image.

Note: See function *RGB_to_gray* for coding details

Step 3: Manually mark selected black-and-white images using color scribbles

I used MS paint as a tool to mark the gray images. In order to find the right color to mark, I open the color image in Photoshop, and find the R, G, B values of the color I'd like to mark. In my example, I chose to mark 1 frame for every 10 image frames.

Step 4: Colorized the marked black and white images

It follows the same procedures as colorizing the still black-and-white images. We may propose different colors from those in the source video, if necessary.

Note: See function *get_color* for coding details

Step 5: Colorize the marked black and white frames based on colored frame. For example, colorize frame 1 to frame 9 based on the colorized frame 0

- 1. Convert both colored image (e.g. frame 0) and black and white image (e.g. frame 1) from RGB format to YUV format
- 2. For each pixel $\mathbf{r} = [i,j]$ in the black and white image, loop through each pixel $\mathbf{s} = [i',j']$ on the colored image, such that where the Y channel of black and white frame and colored frame is minimized. In particular, difference between $\mathrm{YUV}[i,j,0]$ and $\mathrm{YUV}'[i',j',0]$ is minimized.
- 3. Set YUV[i, j, 1] = YUV'[i', j', 1] and YUV[i, j, 2] = YUV'[i', j', 2]
- 4. Convert the colorized frame (e.g. frame 1) from YUV format back to RGB format
- 5. Perform 1 to 4 for frame 1 to frame 9

Note: See function *extend_color* for coding details

Step 6: Manually convert the colorized frames into GIF format

I used the free online tool GIFMAKER to convert the image frames to GIF

What would you do differently?

- 1. If had chance to start from beginning, I would choose images that are simple in colors. That is, the colors are more uniform across pixels, so that I may spend less time on marking the black-and-white images.
- 2. I would test my algorithm on more than 1 video clips. But this takes time to mark frames, especially I would like to make sure that the same area is colorized in the same color across frames.

Any challenges or issues you met?

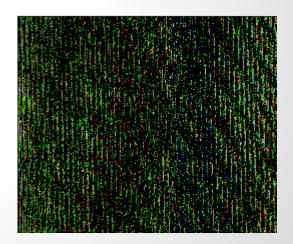
- 1. Not sure how to define the neighbor of a pixel. I choose the distance to be 1 pixel, and hence there are 8 pixels in the neighbor for a specified pixel
- 2. Not sure how to solve the constrained least square problem. It took me a very long time to figure it out, by writing down the formulas and do some derivation. Reading authors' matlab codes also helps me understand.
- 3. Not sure the conversion formula between YUV and RGB format. I read the reference paper by Jack, and took the formula there.

The authors of the paper shared their matlab codes about how to colorize still images using matlab, which provides a very good source to start with. Without it, I may not be able to complete my final project.

Output: I am using the images in the paper as my initial test case to replicate the algorithm in the paper. The output is just noises with no clear image.

Reason: I forgot to put 1 to in the diagonal items in the weight matrix A. Note: the colorized image is derived by solving the linear system: Ax = b

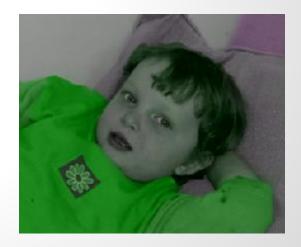




Output: I am using the images in the paper as my initial test case to replicate the algorithm in the paper. The output tends to more green.

Reason: When I convert YUV format to RGB format, I made a mistake in the code that all R, G, B set to be R.





Output: I am using the images in the paper as my initial test case to replicate the algorithm in the paper. The output is all black ...

Reason: When I convert RGB format to YUV format, I forgot to divide by 255.0.





Output: I am using the images in the paper as my initial test case to replicate the algorithm in the paper. The output looks the same as the marked image

Reason: I forgot to update the row index, so that the weight matrix is not correct.





Computation: Code Functional Description

Part 1: To colorize still Image

```
import numpy as np
import matplotlib.pyplot as plt
from scipy import misc
from scipy import sparse
from scipy.sparse import linalg
import os
import argparse
```

Above is the list of libraries I used in my final project

Part 1: To colorize still Image

```
def RGB_to_YUV(RGB):
    YUV = np.zeros(RGB.shape)
    YUV[:,:,0] = (0.30*RGB[:,:,0] + 0.59*RGB[:,:,1] + 0.11*RGB[:,:,2])/255.0
    YUV[:,:,1] = (0.60*RGB[:,:,0] - 0.28*RGB[:,:,1] - 0.32*RGB[:,:,2])/255.0
    YUV[:,:,2] = (0.21*RGB[:,:,0] - 0.52*RGB[:,:,1] + 0.31*RGB[:,:,2])/255.0
    return YUV
```

Step 1: As suggested in the paper, I first convert the image in the RGB format to YUV format, where Y is the intensity channel, and U and V channel include color information.

Part 1: To colorize still Image

```
def find_marked(blackwhite_YUV,marked_YUV):
    return abs(blackwhite_YUV - marked_YUV).sum(2) > 0.001
```

Step 2: find the marked area with color scribbles. This is where there are differences in Y, U or V channel.

Part 1: To colorize still Image

Step 3: For each pixel $\mathbf{r}=[i,j]$ in the image, identify its neighbor with width 1 pixel.

i-1, j-1	i-1, j	i-1, j+1
i, j-1	i,j	i, j+1
i+1, i-1	i+1, j	i+1, j+1

Part 1: To colorize still Image

```
def calc_variance(Y,window_vals,r):
    center = Y[r[0],r[1]].copy()
    variance = np.mean((window_vals - np.mean(window_vals))**2)
    sigma = variance * 0.6

mgv = min(( window_vals - center )**2)
    if (sigma < ( -mgv / np.log(0.01 ))):
        sigma = -mgv / np.log(0.01)
    if (sigma < 0.000002):
        sigma = 0.000002

    return sigma</pre>
```

Step 4: Calculate variance in the neighbor of each pixel $\mathbf{r}=[i,j]$. The variance is required to calculate the weight matrix A

Part 1: To colorize still Image

```
def calc_weights(Y,window_vals,sigma,r):
    center = Y[r[0],r[1]]
    weights = np.exp( -((window_vals - center)**2) / sigma )
    weights = weights / np.sum(weights)
    return weights
```

Step 5: for each pixel r=[i,j], calculate the weight of each pixel in its neighbor based on equation 2 in the paper. The weights will be added into the weight matrix A, to form the linear system Ax = b.

```
def get colors(blackwhite_RGB, marked_RGB):
    # CONVERT FROM RGB TO YUV FORMAT
    blackwhite YUV = RGB to YUV(blackwhite RGB)
                  = RGB to YUV(marked RGB)
    marked YUV
    # FIND THE LOCATION OF MARKED AREA
                  = find marked(blackwhite YUV, marked YUV)
    isColored
    # BEGIN TO CONSTRUCT A SUCH THAT Ax=b
              = marked_YUV.shape[0]
              = marked YUV.shape[1]
    size
    location matrix = index matrix(marked YUV)
               = 1
   num pixel = (2*wd + 1)**2
              = size * num pixel
    max num
    # ROW and COL OF NONZERO VALUES IN THE SPARSE MATRIX A
   row inds = np.zeros(max num, dtype=np.int64)
    col inds
              = np.zeros(max num, dtype=np.int64)
    vals
              = np.zeros(max num)
    length
    pixel num = 0
```

Step 6: Once derived the weight matrix A, the colorized image is calculated by solving the linear system Ax = b. The detailed algorithm is shown in the slides of development details.

```
for j in range(m):
    for i in range(n):
        if (not isColored[i,j]):
            window vals = np.zeros(num pixel)
            temp_num,temp_col_inds,temp_vals = find_neighbor(blackwhite_YUV[:,:,0],[i,j],wd)
            length = length + temp num
            col inds[length - temp num:length] = temp col inds
            row inds[length - temp num:length] = pixel num
            window vals[0:temp num] = temp vals
            sigma=calc variance(blackwhite YUV[:,:,0],temp vals,[i,j])
            vals[length-temp num:length] = - calc weights(blackwhite YUV[:,:,0],temp vals,sigma,[i,j])
        row inds[length] = pixel num
        col inds[length] = location matrix[i,j]
        vals[length] = 1
        length += 1
        pixel num += 1
# Trim to variables to the length that does not include overflow from the edges
vals = vals[0:length]
col inds = col inds[0:length]
row inds = row inds[0:length]
A = sparse.csr matrix((vals, (row inds, col inds)), (pixel num, size))
# TO CONSTRUCT b. SUCH THAT Ax=b
b = np.zeros((A.shape[0]))
colorized YUV = np.zeros(blackwhite YUV.shape)
colorized YUV[:,:,0] = blackwhite YUV[:,:,0]
color_copy_for_nonzero = isColored.reshape(size,order='F').copy()
colored inds = np.nonzero(color copy for nonzero)
for channel in [1,2]:
    curIm = marked_YUV[:,:,channel].reshape(size,order='F').copy()
    b[colored inds] = curIm[colored inds]
    new vals = linalg.spsolve(A, b)
    colorized YUV[:,:,channel] = new vals.reshape(n, m, order='F')
# CONVERT FROM YUV TO RGB
colorized RGB = YUV to RGB(colorized YUV)
return colorized RGB
```

Part 1: To colorize still Image

```
def YUV_to_RGB(YUV):
    R = YUV[:,:,0] + 0.948262*YUV[:,:,1] + 0.624013*YUV[:,:,2]
    G = YUV[:,:,0] - 0.276066*YUV[:,:,1] - 0.639810*YUV[:,:,2]
    B = YUV[:,:,0] - 1.105450*YUV[:,:,1] + 1.729860*YUV[:,:,2]
    R[R < 0] = 0
    R[R > 1] = 1
    G[G < 0] = 0
    G[G > 1] = 1
    B[B < 0] = 0
    B[B > 1] = 1

    RGB = np.zeros(YUV.shape)
    RGB[:,:,0] = R
    RGB[:,:,1] = G
    RGB[:,:,2] = B
    return np.uint8(np.round(RGB*255))
```

Step 7: Convert the colorized image from YUV format back to RGB format, and save the output.

Part 2: To colorize black and white video clips

Step 1: given the image frames extracted from video clip, I first convert the color image into black-and-white images. That is I convert the image from RGB to YUV format, but only keep the Y channel (intensity channel) and ignore the U and V channels (color channels). Then convert back to RGB format.

Part 2: To colorize black and white video clips

```
def extend_color(blackwhite_YUV,colored_YUV):
    [row,col,channel] = colored YUV.shape
    extended YUV
                        = np.zeros(colored YUV.shape)
    extended YUV[:,:,0] = blackwhite YUV[:,:,0]
    for i in range(row):
        for i in range(col):
                           = blackwhite YUV[i,j,0]
            grey val
            window colored = colored YUV[max(i-wd,0):min(i+wd,row),max(j-wd,0):min(j+wd,col),:]
                         = abs(window colored[:,:,0] - grey val)
            diff matrix
            min idx
                          = np.argwhere(diff matrix == np.min(diff matrix))
            if len(min idx)>0:
                ii = min idx[0][0]
                ii = min idx[0][1]
                extended YUV[i,j,1] = window colored[ii,jj,1]
                extended YUV[i,j,2] = window colored[ii,jj,2]
                print 'something wrong with [row,col] = [' + str(i) + ', ' + str(j) + ']'
    # CONVERT FROM YUV TO RGB
    extended RGB = YUV to RGB(extended YUV)
    return extended RGB
```

Given one gray frame and one colorized frame, for each pixel r=[i,j] in the gray frame, I compare its intensity value (Y channel) to intensity values in the neighbor of r with width 5 pixels of the colorized image. I identify the location in the colorized image s=[ii,ji], such that the different Y[r]-Y[s] is minimized in the neighbor of pixel r with width 5 pixels. Then let U[r] and V[r] values of gray image to equal to U[s] and V[s] of colorized image gray U[i,j] = colorized U[ii,jj] gray V[i,i] = colorized V[ii,ii] Finally, I converted the YUV format back to **RGB** format

Step 2: After manually marking the black-and-white image using color scribbles, I used the *get_color* in part 1 to colorize the marked image. Then I extended the colorized image to its neighbor black-and-white images. In my test example, I marked and colorized 1 frame for every 10 frames, and extend the colorized frame to the next 9 frames. For example, I colorized the 0th image, and extend its color to frame 1, 2, ..., and 9

Resources

- Source paper *Colorization using Optimization* by Anat Levein, Dani Lischinski, Yair Weiss, https://www.cs.huji.ac.il/~yweiss/Colorization/colorization-siggraph04.pdf
- Source matlab code
 https://www.cs.huji.ac.il/~yweiss/Colorization/colorization.zip
- Conversion from RGB to YUV and YUV to RGB
 Jack, K. 2001, Video Demystified, 3rd edition ed. Elsevier Science & Technology
- Duck image https://i.ytimg.com/vi/vufs2Y1pFeQ/maxresdefault.jpg

Resources

- Cattle image
 https://i.pinimg.com/736x/9f/c4/c6/9fc4c6ce00de0d4ffb3f98f9c7d4e852--cow-face-funny-cows.jpg
- Rat image
 https://cdn.vox cdn.com/thumbor/tSvdZRmVKzBGDXujME9MSw1VqGo=/60x0:939x586/1280x854/cdn.vox cdn.com/uploads/chorus_image/image/48349001/WINNER-Julian-Rad.0.0.jpg
- Girl image from Youtube using screen shot https://www.youtube.com/watch?v=HgmDCkkLQT0

Appendix: Your Code

Code Language:

Python 2.7

List of code files:

- ReadMe.txt
- colorize_image.py
- colorize_video.py

Note:

- ReadMe.txt includes the instructions to run python code
- The python codes has been compressed in resources.zip and uploaded

Credits or Thanks

I would like to thank the following tool providers for my final project

Online converter from video to frames
 http://www.filezigzag.com/Download/DT.aspx?T=107b8c2f-041a-4393-a14c-80fb36a684f5

GIF makerhttp://gifmaker.me/