

CS 445: Computational Photography

Programming Project #3: Gradient Domain Fusion

```
In [ ]: from google.colab import drive
drive.mount('/content/drive')
```

```
In [1]: import cv2
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
import os
from random import random
import time
import scipy
import scipy.sparse.linalg

# modify to where you store your project data including utils.py
datadir = "C:/Users/jackt/Desktop/CS445/cs445fusion"

#utilfn = datadir + "utils.py"
#!cp "$utilfn" .
samplesfn = datadir + "samples"
#!cp -r "$samplesfn" .
import utils
```

Part 1 Toy Problem (20 pts)

In [2]: `def toy_reconstruct(img):`

```
    """
    The implementation for gradient domain processing is not complicated, but
    it is easy to make a mistake,
    so let's start with a toy example. Reconstruct this image from its gradien
    t values, plus one pixel intensity.
    Denote the intensity of the source image at (x, y) as  $s(x,y)$  and the value
    to solve for as  $v(x,y)$ .

    For each pixel, then, we have two objectives:
    1. minimize  $(v(x+1,y)-v(x,y) - (s(x+1,y)-s(x,y)))^2$ 
    2. minimize  $(v(x,y+1)-v(x,y) - (s(x,y+1)-s(x,y)))^2$ 

    Note that these could be solved while adding any constant value to  $v$ , so w
    e will add one more objective:
    3. minimize  $(v(1,1)-s(1,1))^2$ 

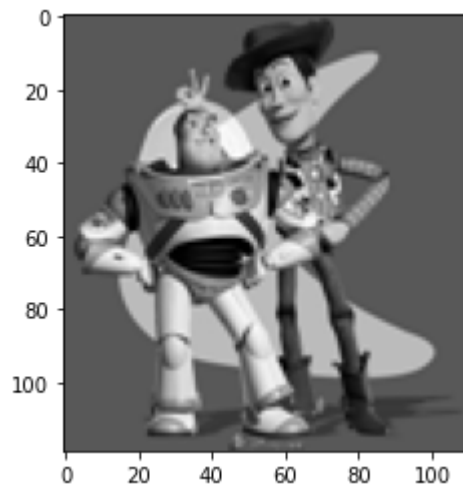
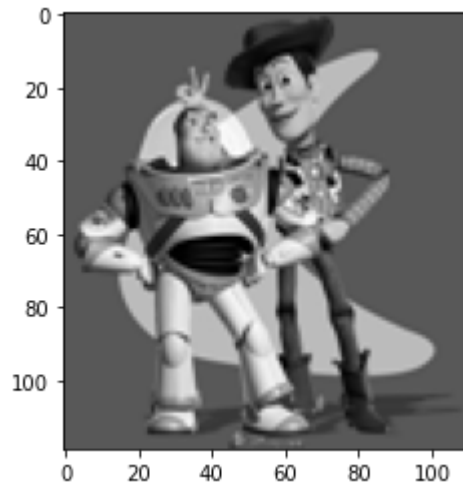
    :param toy_img: numpy.ndarray
    """
    im_h, im_w = img.shape
    im2var = np.arange(im_h * im_w).reshape(im_h, im_w)
    neq = (im_h - 1) * im_w + (im_w - 1) * im_h + 1

    # construct equation matrix A, solution vector b
    A = scipy.sparse.lil_matrix((neq, im_h*im_w), dtype='double')
    b = np.zeros((neq, 1), dtype='double')
    for e in range(neq):
        if e < (im_h-1) * im_w:
            # vertical edges
            x = e % im_w
            y = e // im_w
            A[e, im2var[y+1][x]] = 1
            A[e, im2var[y][x]] = -1
            b[e] = img[y+1][x] - img[y][x]
        elif e < neq-1:
            # horizontal edges
            temp = e - ((im_h-1)*im_w)
            y = temp % im_h
            x = temp // im_h
            A[e, im2var[y][x+1]] = 1
            A[e, im2var[y][x]] = -1
            b[e] = img[y][x+1] - img[y][x]
        else:
            # objective 3
            x = im_w - 1
            y = im_h - 1
            A[e, im2var[y][x]] = 1
            b[e] = img[y][x]

    # solve least squares system
    x = scipy.sparse.linalg.lsqr(A.tocsr(), b)
    return x[0].reshape(im_h, im_w)
```

```
In [3]: toy_img = cv2.cvtColor(cv2.imread('samples/toy_problem.png'), cv2.COLOR_BGR2GRAY).astype('double') / 255.0
plt.imshow(toy_img, cmap="gray")
plt.show()

im_out = toy_reconstruct(toy_img)
plt.imshow(im_out, cmap="gray")
plt.show()
print("Max error is: ", np.sqrt(((im_out - toy_img)**2).max()))
```



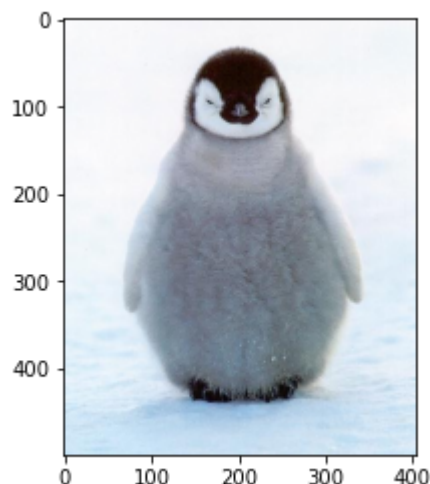
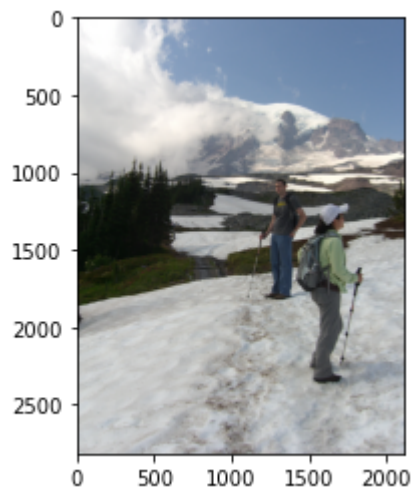
Max error is: 7.5332676048867064e-06

Preparation

```
In [4]: background_img = cv2.cvtColor(cv2.imread('samples/im2.JPG'), cv2.COLOR_BGR2RGB)
        .astype('double') / 255.0
        plt.figure()
        plt.imshow(background_img)
        plt.show()
        object_img = cv2.cvtColor(cv2.imread('samples/penguin-chick.jpeg'), cv2.COLOR_
        BGR2RGB).astype('double') / 255.0
        plt.imshow(object_img)
        plt.show()

        use_interface = True # set to true if you want to use the interface to choose
        points (might not work in Colab)
        if not use_interface:
            xs = (65, 359, 359, 65)
            ys = (24, 24, 457, 457)
            object_mask = utils.get_mask(ys, xs, object_img)
            bottom_center = (500, 2500) # (x,y)

            object_img, object_mask = utils.crop_object_img(object_img, object_mask)
            bg_ul = utils.upper_left_background_rc(object_mask, bottom_center)
            plt.imshow(utils.get_combined_img(background_img, object_img, object_mask, b
            g_ul))
```



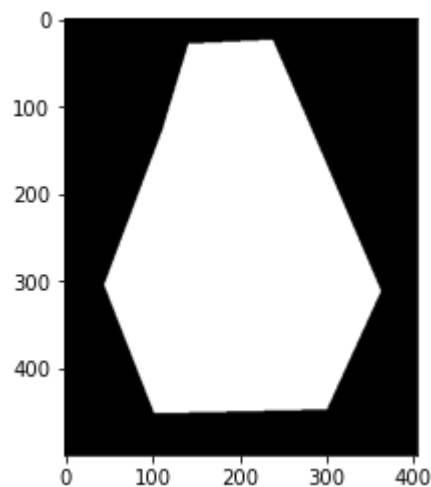
```
In [6]: if use_interface:
import matplotlib.pyplot as plt
%matplotlib notebook
mask_coords = utils.specify_mask(object_img)
```

If it doesn't get you to the drawing mode, then rerun this function again.



```
In [7]: if use_interface:
xs = mask_coords[0]
ys = mask_coords[1]
%matplotlib inline
import matplotlib.pyplot as plt
plt.figure()
object_mask = utils.get_mask(ys, xs, object_img)
```

<Figure size 432x288 with 0 Axes>



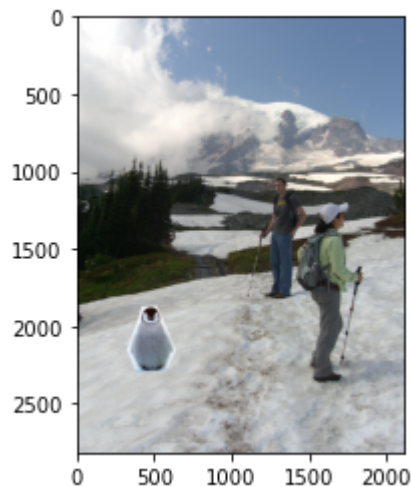
```
In [8]: if use_interface:
        %matplotlib notebook
        import matplotlib.pyplot as plt
        bottom_center = utils.specify_bottom_center(background_img)
```

If it doesn't get you to the drawing mode, then rerun this function again. Also, make sure the object fill fit into the background image. Otherwise it will crash



```
In [9]: if use_interface:
        %matplotlib inline
        import matplotlib.pyplot as plt

        object_img, object_mask = utils.crop_object_img(object_img, object_mask)
        bg_ul = utils.upper_left_background_rc(object_mask, bottom_center)
        plt.imshow(utils.get_combined_img(background_img, object_img, object_mask, bg_ul))
```



Part 2 Poisson Blending (50 pts)

```
In [10]: def combine_img_bw(bg_img, object_img, object_mask, bg_ul):
        """Same as utils.combine_img, but only intensity channel"""
        combined_img = bg_img.copy()
        (nr, nc) = object_img.shape

        combined_patch = combined_img[bg_ul[0]:bg_ul[0]+nr, bg_ul[1]:bg_ul[1]+nc]
        combined_patch = combined_patch*(1-object_mask) + object_img[:, :]*object_mask
        combined_img[bg_ul[0]:bg_ul[0]+nr, bg_ul[1]:bg_ul[1]+nc] = combined_patch

        return combined_img
```

```
In [11]: def poisson_blend(object_img, object_mask, bg_img, bg_ul):
```

```

"""
Returns a Poisson blended image with masked object_img over the bg_img at
position specified by bg_ul.
Can be implemented to operate on a single channel or multiple channels
:param object_img: the image containing the foreground object
:param object_mask: the mask of the foreground object in object_img
:param background_img: the background image
:param bg_ul: position (row, col) in background image corresponding to (0,
0) of object_img
"""
im_h, im_w = object_img.shape
im2var = np.arange(im_h * im_w).reshape(im_h, im_w)

# find neq
neq = 0
for y in range(im_h-1):
    for x in range(im_w-1):
        if object_mask[y][x] == 1:
            neq += 2
            continue
        if object_mask[y+1][x] == 1:
            neq += 1
        if object_mask[y][x+1] == 1:
            neq += 1

# construct equation matrix A, solution vector b
A = scipy.sparse.lil_matrix((neq, im_h*im_w), dtype='double')
b = np.zeros((neq, 1), dtype='double')

count = 0
for y in range(im_h-1):
    for x in range(im_w-1):
        # right
        if object_mask[y][x] == 1:
            if object_mask[y][x+1] == 1:
                A[count, im2var[y][x]] = 1
                A[count, im2var[y][x+1]] = -1
                b[count] = object_img[y][x] - object_img[y][x+1]
                count += 1
            else:
                A[count, im2var[y][x]] = 1
                b[count] = object_img[y][x] - object_img[y][x+1] + bg_img[
bg_ul[0]+y][bg_ul[1]+x+1]
                count += 1
        else:
            if object_mask[y][x+1] == 1:
                A[count, im2var[y][x+1]] = 1
                b[count] = object_img[y][x+1] - object_img[y][x] + bg_img[
bg_ul[0]+y][bg_ul[1]+x]
                count += 1
            # down
            if object_mask[y][x] == 1:
                if object_mask[y+1][x] == 1:
                    A[count, im2var[y][x]] = 1
                    A[count, im2var[y+1][x]] = -1

```

```

        b[count] = object_img[y][x] - object_img[y+1][x]
        count += 1
    else:
        A[count, im2var[y][x]] = 1
        b[count] = object_img[y][x] - object_img[y+1][x] + bg_img[
bg_ul[0]+y+1][bg_ul[1]+x]
        count += 1
    else:
        if object_mask[y+1][x] == 1:
            A[count, im2var[y+1][x]] = 1
            b[count] = object_img[y+1][x] - object_img[y][x] + bg_img[
bg_ul[0]+y][bg_ul[1]+x]
            count += 1
        if count >= neq:
            break
    if count >= neq:
        break

    # solve least squares system
    v = scipy.sparse.linalg.lsqr(A.tocsr(), b)
    blend = v[0].reshape(im_h, im_w)
    #plt.imshow(blend)
    #plt.show()

    return combine_img_bw(bg_img, blend, object_mask, bg_ul)

```



```
In [12]: im_blend = np.zeros(background_img.shape)
         for b in np.arange(3):
             im_blend[:, :, b] = poisson_blend(object_img[:, :, b], object_mask, background_i
             mg[:, :, b].copy(), bg_ul)

         plt.figure(figsize=(15,15))
         plt.imshow(im_blend)
```

Clipping input data to the valid range for imshow with RGB data ([0..1] for floats or [0..255] for integers).

Out[12]: <matplotlib.image.AxesImage at 0x1fc15924ef0>



Part 3 Mixed Gradients (20 pts)

```

In [13]: def mixed_blend(object_img, object_mask, bg_img, bg_ul):
        """
        Returns a mixed gradient blended image with masked object_img over the bg_
        img at position specified by bg_ul.
        Can be implemented to operate on a single channel or multiple channels
        :param object_img: the image containing the foreground object
        :param object_mask: the mask of the foreground object in object_img
        :param background_img: the background image
        :param bg_ul: position (row, col) in background image corresponding to (0,
        0) of object_img
        """

        im_h, im_w = object_img.shape
        im2var = np.arange(im_h * im_w).reshape(im_h, im_w)

        # find neq
        neq = 0
        for y in range(im_h-1):
            for x in range(im_w-1):
                if object_mask[y][x] == 1:
                    neq += 2
                    continue
                if object_mask[y+1][x] == 1:
                    neq += 1
                if object_mask[y][x+1] == 1:
                    neq += 1

        # construct equation matrix A, solution vector b
        A = scipy.sparse.lil_matrix((neq, im_h*im_w), dtype='double')
        b = np.zeros((neq, 1), dtype='double')

        count = 0
        for y in range(im_h-1):
            for x in range(im_w-1):
                # right
                if object_mask[y][x] == 1:
                    if object_mask[y][x+1] == 1:
                        A[count, im2var[y][x]] = 1
                        A[count, im2var[y][x+1]] = -1
                        grad_s = object_img[y][x] - object_img[y][x+1]
                        grad_t = bg_img[bg_ul[0]+y][bg_ul[1]+x] - bg_img[bg_ul[0]+
y][bg_ul[1]+x+1]
                        b[count] = grad_s if abs(grad_s) > abs(grad_t) else grad_t
                        count += 1
                    else:
                        A[count, im2var[y][x]] = 1
                        b[count] = object_img[y][x] - object_img[y][x+1] + bg_img[
bg_ul[0]+y][bg_ul[1]+x+1]
                        count += 1
                else:
                    if object_mask[y][x+1] == 1:
                        A[count, im2var[y][x+1]] = 1
                        b[count] = object_img[y][x+1] - object_img[y][x] + bg_img[
bg_ul[0]+y][bg_ul[1]+x]
                        count += 1
                    # down
                    if object_mask[y][x] == 1:

```

```

        if object_mask[y+1][x] == 1:
            A[count, im2var[y][x]] = 1
            A[count, im2var[y+1][x]] = -1
            b[count] = object_img[y][x] - object_img[y+1][x]
            count += 1
        else:
            A[count, im2var[y][x]] = 1
            b[count] = object_img[y][x] - object_img[y+1][x] + bg_img[
bg_ul[0]+y+1][bg_ul[1]+x]
            count += 1
        else:
            if object_mask[y+1][x] == 1:
                A[count, im2var[y+1][x]] = 1
                b[count] = object_img[y+1][x] - object_img[y][x] + bg_img[
bg_ul[0]+y][bg_ul[1]+x]
                count += 1
            if count >= neq:
                break
        if count >= neq:
            break

    # solve least squares system
    v = scipy.sparse.linalg.lsqr(A.tocsr(), b)
    blend = v[0].reshape(im_h, im_w)
    #plt.imshow(blend)
    #plt.show()

    return combine_img_bw(bg_img, blend, object_mask, bg_ul)

```

```
In [14]: im_mix = np.zeros(background_img.shape)
         for b in np.arange(3):
             im_mix[:, :, b] = mixed_blend(object_img[:, :, b], object_mask, background_img
            [:, :, b].copy(), bg_ul)

         plt.figure(figsize=(15,15))
         plt.imshow(im_mix)
```


Clipping input data to the valid range for imshow with RGB data ([0..1] for floats or [0..255] for integers).

Out[14]: <matplotlib.image.AxesImage at 0x1fc15778978>



Bells & Whistles (Extra Points)

Color2Gray (20 pts)

```
In [ ]: def color2gray(img):  
        pass
```

Laplacian pyramid blending (20 pts)

```
In [ ]: def laplacian_blend(object_img, object_mask, bg_img, bg_ul):  
        # feel free to change input parameters  
        pass
```

More gradient domain processing (up to 20 pts)

```
In [ ]:
```