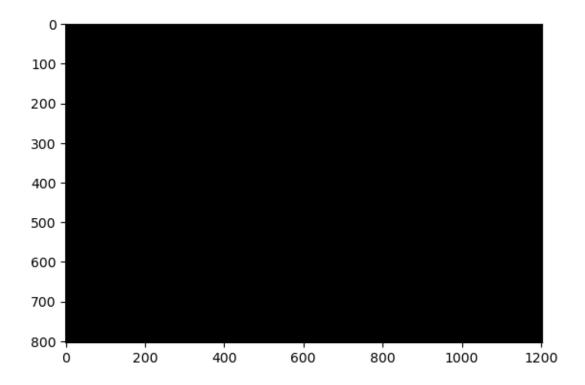
## Noise-Calibration

## October 4, 2022

```
[8]: import numpy as np
     import cv2
     # import skimage
     import matplotlib.pyplot as plt
     import src.cp_hw2
     import os
[]: plt.imshow(np.tile(np.linspace(0, 1, 255*16), (255*12,1)), cmap='gray')
     plt.savefig('ramp1.jpeg',dpi=2400)
[3]: # load dark images
     # using shutter speed 1/5
     # dark_img_root = '/home/aramesh/gphoto-burst-dark-shutter1by5/'
     dark_img_root = '/home/aramesh/Desktop/15-663 Computational Photography/assgn2/

data-dump/gphoto-burst-dark-shutter1by10-myroom-iso100/¹

     dark img tiffs = os.listdir(dark img root)
     dark_img_tiffs = [f for f in dark_img_tiffs if 'tiff' in f]
     dark_img = cv2.imread(dark_img_root+dark_img_tiffs[0], -1)
     dark_img = dark_img[...,::-1]
     dark_img = dark_img[::5,::5]
     dark_frame_mean = dark_img.copy()
     for i in range(1,len(dark_img_tiffs)) :
         img = cv2.imread(dark_img_root+dark_img_tiffs[i], -1)
         img = img[...,::-1]
         img = img[::5,::5]
         dark_frame_mean += img
     dark_frame_mean = dark_frame_mean/len(dark_img_tiffs)
     plt.imshow(dark_frame_mean/ (2**16 - 1)) # this needs to be normalized as its_
      \rightarrow uint16
    np.save('dark-frame-mean-myroom-shutter1by10-iso100-skip5', dark_frame_mean)
```

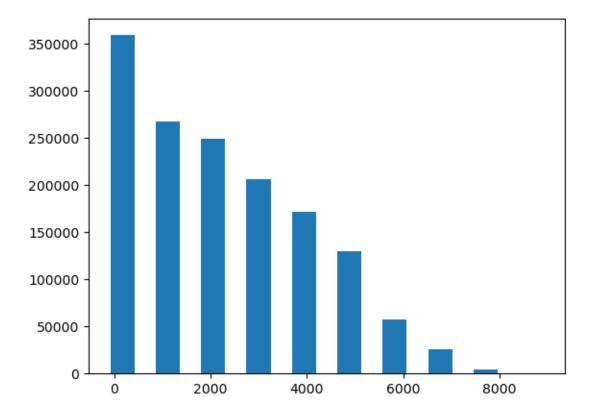


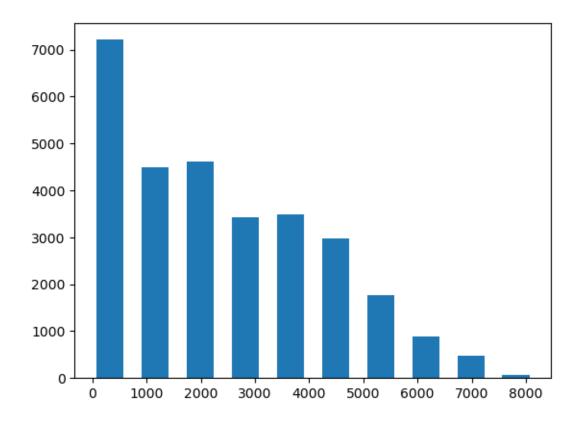
```
ramp img root = '/home/aramesh/Desktop/15-663 Computational Photography/assgn2/
      ⇔data-dump/gphoto-burst-ramp-shutter1by10-myroom-iso100/'
      # dark frame mean = np.load('dark-frame-mean.npy') # if already saved
      dark_frame_mean = np.load('dark-frame-mean-myroom-shutter1by10-iso100-skip5.

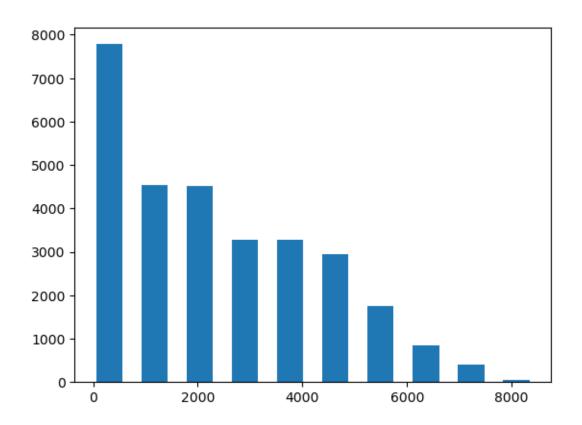
¬npy')
      ramp_img_tiffs_names = os.listdir(ramp_img_root)
      ramp_img_tiffs_names = [f for f in ramp_img_tiffs_names if 'tiff' in f]
      ramp_img_tiffs = []
      for i in range(len(ramp_img_tiffs_names)) :
          ramp_img_tiff = cv2.imread(ramp_img_root+ramp_img_tiffs_names[i], -1)
          ramp_img_tiff = ramp_img_tiff[...,::-1]
          ramp_img_tiff = ramp_img_tiff[::5,::5]
          ramp_img_tiff_meansub = ramp_img_tiff - dark_frame_mean
          ramp_img_tiffs.append(ramp_img_tiff_meansub)
      ramp_img_tiffs = np.array(ramp_img_tiffs)
[11]: ramp_img_tiffs.shape
[11]: (50, 804, 1204, 3)
[14]: # Computing histogram
      hist_subsample = []
      for im in ramp_img_tiffs :
```

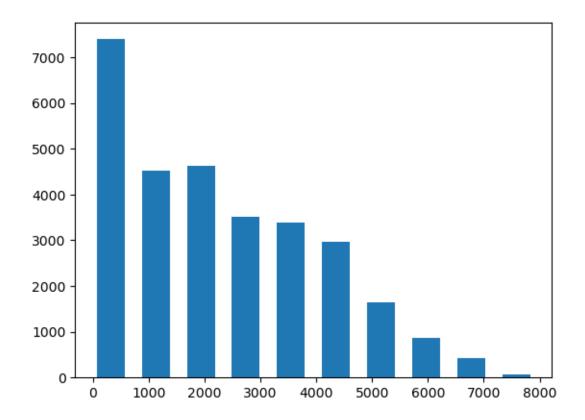
[10]: # load and prep ramp images

```
hist_subsample.append(im[::10,::10])
hist_subsample = np.array(hist_subsample)
H, bins = np.histogram(hist_subsample)
plt.bar(bins[:-1], H, width=500)
plt.show()
H0, bins0 = np.histogram(hist_subsample[0])
plt.bar(bins0[:-1], H0, width=500)
plt.show()
H5, bins5 = np.histogram(hist_subsample[5])
plt.bar(bins5[:-1], H5, width=500)
plt.show()
H10, bins10 = np.histogram(hist_subsample[10])
plt.bar(bins10[:-1], H10, width=500)
plt.show()
```









## []:

```
# Normalizing, then multiplying it into 255 to get fewer buckets and lesser

"avariance

ramp_img_tiff_normalized = ramp_img_tiffs

pixel_wise_mean = ramp_img_tiff_normalized.mean(0)

# Computing pixel-wise variance

pixel_wise_var = (ramp_img_tiff_normalized[0] - pixel_wise_mean) ** 2

for i in range(1,len(ramp_img_tiffs)):

    pixel_wise_var += ((ramp_img_tiff_normalized[i] - pixel_wise_mean)**2)

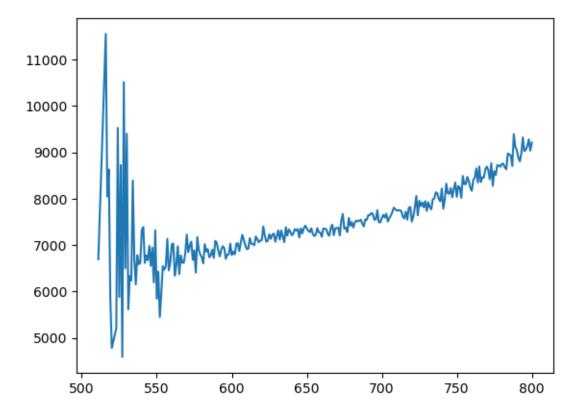
pixel_wise_var = pixel_wise_var / (len(ramp_img_tiffs)-1) # no numerical_u_stability issues

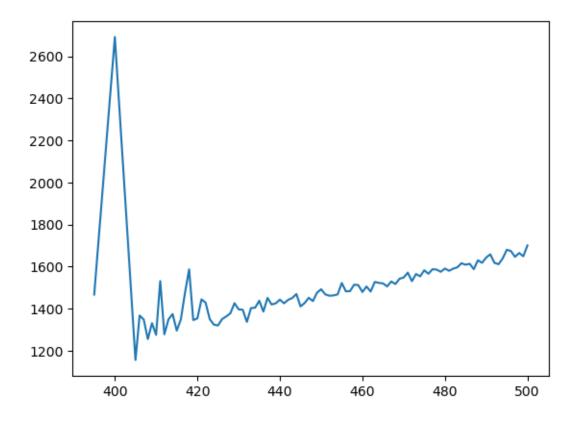
# pixel_wise_var = ramp_img_tiff_normalized.var(0)
```

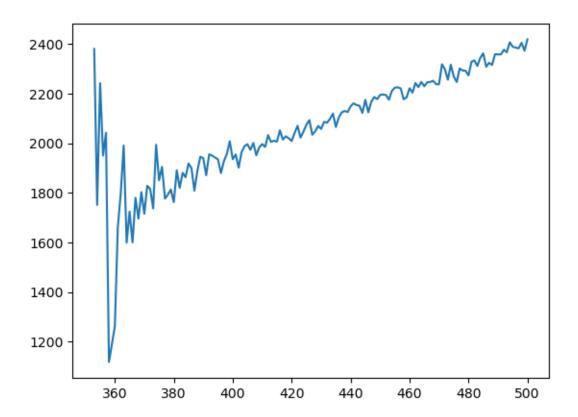
```
pixel_wise_mean = pixel_wise_mean.round().astype('uint16')
cutoff = 20000 # for gain
# cutoff = 800 # for addvar
# channelwise_cutoffs = [800,500,500] # for addvar
# Computing avg pixel-wise variance for each unique mean value, channel-wise
pw mean uniq list = []
pw_var_mean_list = []
for c in range(3) :
    cw mean uniq list = []
    cw var mean list = []
    for uniq in np.unique(pixel_wise_mean[:,:,c]) :
        if uniq > cutoff : break
        if uniq > channelwise cutoffs[c] : break #comment when we want to_
 ⇔measure gain
          if uniq > 2500 : break
          if c == 0 :
#
              if uniq > 15 : break # excluding all mean values above threshold,
 →which was picked to give non negative intercept
          elif c == 1 :
#
              if uniq > 11 : break
         else :
#
              if uniq > 13 : break
        rows, cols = np.where(pixel_wise_mean[:,:,c] == uniq)
        pw_var_mean = pixel_wise_var[rows,cols,c].mean()
        cw_mean_uniq_list.append(uniq)
        cw var mean list.append(pw var mean)
    pw_mean_uniq_list.append(cw_mean_uniq_list)
    pw_var_mean_list.append(cw_var_mean_list)
pw_mean_uniq_list[0],pw_mean_uniq_list[1],pw_mean_uniq_list[2] = np.
 →array(pw_mean_uniq_list[0]), \
                            np.array(pw_mean_uniq_list[1]), np.
 →array(pw_mean_uniq_list[2])
pw_var_mean_list[0],pw_var_mean_list[1],pw_var_mean_list[2] = np.
 ⇒array(pw var mean list[0]), \
                            np.array(pw_var_mean_list[1]), np.
 →array(pw_var_mean_list[2])
plt.plot(pw_mean_uniq_list[0], pw_var_mean_list[0])
plt.show()
plt.plot(pw_mean_uniq_list[1], pw_var_mean_list[1])
plt.show()
plt.plot(pw_mean_uniq_list[2], pw_var_mean_list[2])
plt.show()
# Computing any pixel-wise variance for each unique mean value
```

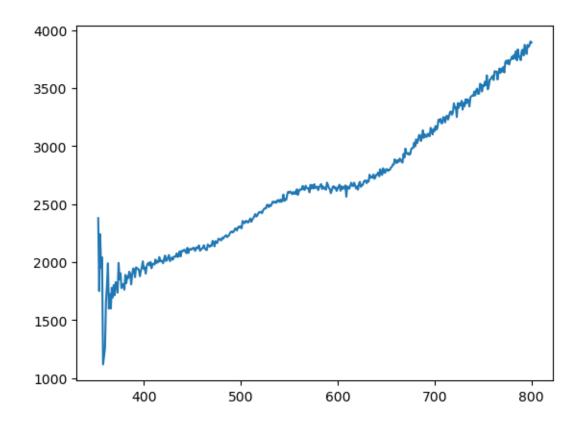
```
pw_var_mean_list_all_channels = []
pw_mean_uniq_list_all_channels = []
for uniq in np.unique(pixel_wise_mean) :
    if uniq > cutoff : break
    rows, cols, channels = np.where(pixel_wise_mean == uniq)
    pw_var_mean = pixel_wise_var[rows,cols,c].mean()
    pw_mean_uniq_list_all_channels.append(uniq)
    pw_var_mean_list_all_channels.append(pw_var_mean)

pw_var_mean_list_all_channels, pw_mean_uniq_list_all_channels = np.
    array(pw_var_mean_list_all_channels), np.
    array(pw_mean_uniq_list_all_channels)
plt.plot(pw_mean_uniq_list_all_channels,pw_var_mean_list_all_channels)
plt.show()
```







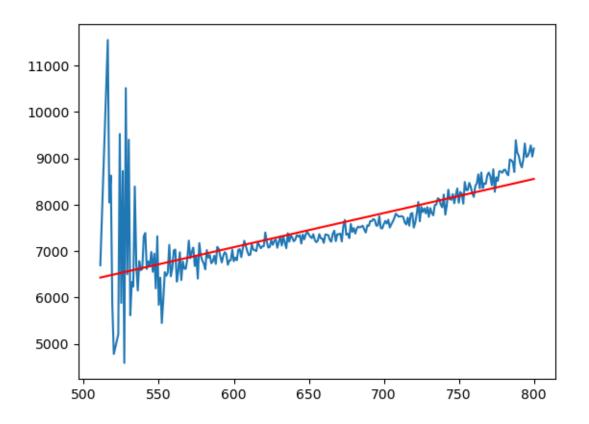


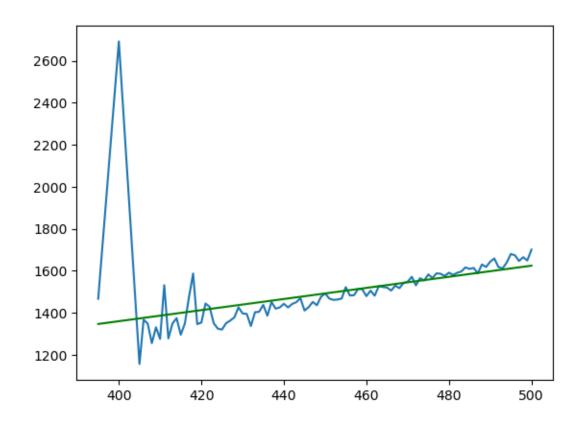
```
[31]: # Fitting a line through above plots
      r_m, r_c = np.polyfit(pw_mean_uniq_list[0], pw_var_mean_list[0],1)
      g_m, g_c = np.polyfit(pw_mean_uniq_list[1], pw_var_mean_list[1],1)
      b_m, b_c = np.polyfit(pw_mean_uniq_list[2], pw_var_mean_list[2],1)
      a_m, a_c = np.

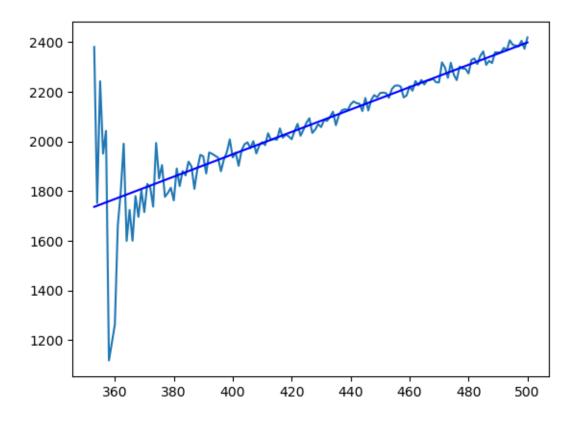
¬polyfit(pw_mean_uniq_list_all_channels,pw_var_mean_list_all_channels,1)
      print('gain and add_var need to be scaled up as this mean img brought down to⊔
       ⇔0-255¹)
      print('red gain = {} add_var = {}'.format(r_m,r_c))
      print('green gain = {} add_var = {}'.format(g_m,g_c))
      print('blue gain = {} add_var = {}'.format(b_m,b_c))
      print('mean gain = {} add_var = {}'.format((r_m+b_m+g_m)/3,(r_c+b_c+g_c)/3))
      print('all channel gain = {} add_var = {}'.format(a_m,a_c))
      plt.plot(pw_mean_uniq_list[0], pw_var_mean_list[0])
      plt.plot(pw_mean_uniq_list[0], pw_mean_uniq_list[0]*r_m + r_c, 'r')
      plt.show()
```

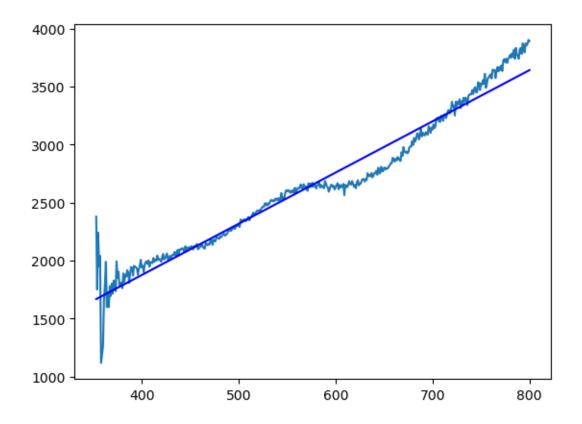
```
plt.plot(pw_mean_uniq_list[1], pw_var_mean_list[1])
plt.plot(pw mean_uniq list[1], pw mean_uniq list[1]*g m + g_c, 'g')
plt.show()
plt.plot(pw_mean_uniq_list[2], pw_var_mean_list[2])
plt.plot(pw_mean_uniq_list[2], pw_mean_uniq_list[2]*b_m + b_c, 'b-')
plt.show()
plt.plot(pw_mean_uniq_list_all_channels, pw_var_mean_list_all_channels)
plt.plot(pw_mean_uniq_list_all_channels,pw_mean_uniq_list_all_channels*a_m +_u
 →a c, 'b-')
plt.show()
\# a_m = (a_m * (2 ** 16 - 1) / 255)
\# a_c = (a_c * (((2 ** 16 - 1) / 255) **2))
# print(' \mid n \ unnormalized \ all \ channel \ qain = \{\} \mid n \ add \ var = \{\}'.format(a \ m, a \ c))
# When fitting on the entire graph, take gain from here
\# \text{ red } \text{ } qain = 30.819668560124956 \text{ } add \text{ } var = -34223.476605931835
# green gain = 22.285713443976338 add_var = -24681.715112475904
# blue qain = 21.660911647440948 add var = -21109.0362468687
# mean \ gain = 24.922097883847414 \ add_var = -26671.409321758812
# all channel gain = 16.434812354721977 add var = -13749.254489825458
# When fitting on smaller portions
# red gain = 7.3560641821540855 add_var = 2671.274681360358
# green gain = 2.6448211695040906 add_var = 301.8739903182136
# blue gain = 4.5009159905476785 add_var = 147.45178412841946
\# mean \ qain = 4.833933780735285 \ add_var = 1040.2001519356638
# all channel gain = 4.416838503147344 add var = 109.89622638828904
```

```
gain and add_var need to be scaled up as this mean img brought down to 0-255 red gain = 7.3560641821540855 add_var = 2671.274681360358 green gain = 2.6448211695040906 add_var = 301.8739903182136 blue gain = 4.5009159905476785 add_var = 147.45178412841946 mean gain = 4.833933780735285 add_var = 1040.2001519356638 all channel gain = 4.416838503147344 add_var = 109.89622638828904
```









```
[32]: # values selected from our hybrid fitting

r_m, g_m, b_m, a_m = 30, 22, 21, 16

r_c, g_c, b_c, a_c = 2671, 300, 150, 100

r_m_norm, g_m_norm, b_m_norm, a_m_norm = r_m, g_m, b_m, a_m

r_c_norm = r_c / (2**16 -1)**2

g_c_norm = g_c / (2**16 -1)**2

b_c_norm = b_c / (2**16 -1)**2

a_c_norm = a_c / (2**16 -1)**2

print('gains when fitted to r, g, b, and all :', r_m_norm, g_m_norm, b_m_norm, a_m_norm)

print('intercepts when fitted to r,g,b and all :', r_c, g_c, b_c, a_c)

print('addvar when fitted to r, g, b, and all :', r_c_norm, g_c_norm, b_c_norm, a_c_norm)
```

gains when fitted to r, g, b, and all: 30 22 21 16 intercepts when fitted to r,g,b and all: 2671 300 150 100 addvar when fitted to r, g, b, and all: 6.219096282303523e-07 6.985132477315826e-08 3.492566238657913e-08 2.3283774924386086e-08

```
[33]: # Loading my hdr stack
     \# t_filler = lambda x : 2.0 ** (x-1-12)
      \# t = [t_filler(i) \text{ for } i \text{ in } range(1,19)]
     42,1,2,4,8,15,30
     dark_frame_mean = np.load('dark-frame-mean-myroom-shutter1by10-iso100-skip5.

¬npy')
     def dark_frame_sub(images_stack_tiff, dark_frame_mean, t) :
         tnc = 1/10
         images_stack_tiff_darkframe_sub = np.zeros(images_stack_tiff.shape)
         for k in range(len(images_stack_tiff)) :
             images_stack_tiff_darkframe_sub[k] = images_stack_tiff[k] - ((t[k]/tnc)__
       →* dark frame mean)
         return images_stack_tiff_darkframe_sub
     image_files_tiff = ['data/gphoto-exposure-stack-no-noise-reduction-myroom/
       ⇔exposure'+str(i)+'.tiff' for i in range(1,17)]
     images stack tiff = []
     for imf in image_files_tiff :
         img = cv2.imread(imf, -1)
         img = img[...,::-1]
         img = img[::5, ::5]
         images stack tiff.append(img)
     images_stack_tiff = np.array(images_stack_tiff)
     images_stack_tiff_darkframe_sub = dark_frame_sub(images_stack_tiff,_
      →dark_frame_mean, t)
     del images stack tiff
     images_stack_tiff_normalized = images_stack_tiff_darkframe_sub / (2**16 - 1)
      \# a m norm = a m / (2**16 - 1)
      \# a_c_norm = a_c / ((2**16 - 1)**2)
      \# a_m_norm = a_m
      \# a\_c\_norm = a\_c
```

[]:

```
I_hdr = I_hdr_num / I_hdr_den
    # where num is zero, hdr final should also be zero
   I_hdr_num_zero = np.where(I_hdr_num == 0)
    if len(I hdr num zero) == 3 :
        I_hdr_num_zero = np.vstack((np.

¬vstack((I_hdr_num_zero[0],I_hdr_num_zero[1])), I_hdr_num_zero[2])).T

        I hdr num zero = np.vstack((I hdr num zero[0], I hdr num zero[1])).T
    # where num is not zero, but den is zero, all hdr final values should be \Box
 →max val
   I_hdr_den_zero = np.where(I_hdr_den == 0)
    if len(I_hdr_den_zero) == 3 :
        I_hdr_den_zero = np.vstack((np.
 ovstack((I_hdr_den_zero[0],I_hdr_den_zero[1])), I_hdr_den_zero[2])).T
   else :
        I_hdr_den_zero = np.vstack((I_hdr_den_zero[0],I_hdr_den_zero[1])).T
   I hdr max val = []
   if I hdr num zero.size > 0 :
        if len(I_hdr.shape) == 3 :
            I_hdr[I_hdr_num_zero[:,0],I_hdr_num_zero[:,1],I_hdr_num_zero[:,2]]__
 ⇒= ()
        else :
            I_hdr[I_hdr_num_zero[:,0],I_hdr_num_zero[:,1]] = 0
   if I_hdr_den_zero.size > 0 :
        for index in I hdr den zero :
            if len(I_hdr.shape) == 3 :
                  print(I hdr num[index[0], index[1], index[2]])
#
                if I_hdr_num[index[0],index[1],index[2]] != 0 :
                    I_hdr_max_val.append(index)
            else :
                if I_hdr_num[index[0],index[1]] != 0 :
                    I_hdr_max_val.append(index)
        I_hdr_max_val = np.array(I_hdr_max_val)
        if I_hdr_max_val.size > 0 :
            I_hdr_max_val = np.stack(I_hdr_max_val)
            if len(I hdr.shape) == 3 :
                I_hdr[I_hdr_max_val[:,0],I_hdr_max_val[:,1],I_hdr_max_val[:,2]]__
 \rightarrow= np.nanmax(I_hdr)
            else :
```

```
I_hdr[I_hdr_max_val[:,0],I_hdr_max_val[:,1]] = np.nanmax(I_hdr)
    return I_hdr
def linear_merging_channelwise(im_s, lin_im_s, t, w_v, r_m, g_m, b_m, r_c, g_c, u_
 ⇔b_c, is_w_photon=True) :
    I_hdr = np.zeros(im_s[0].shape)
    I_hdr[...,0] = linear_merging(im_s[...,0], lin_im_s[...,0], t, w_v, r_m, u
 or_c, is_w_photon) # the var_add needs a normalization term
    I_hdr[...,1] = linear_merging(im_s[...,1], lin_im_s[...,1], t, w_v, g_m, lin_im_s[...,1])
 \rightarrowg_c, is_w_photon) # the var_add needs a normalization term
    I_hdr[...,2] = linear_merging(im_s[...,2], lin_im_s[...,2], t, w_v, b_m, ___
 ⇔b_c, is_w_photon) # the var_add needs a normalization term
    return I_hdr
@np.vectorize
def weight optimal(z,tk, g, var add, Z min=0.001, Z max=0.995):
    if Z \min \le z \le Z \max:
        out num = tk ** 2
        out_den = g * z + var_add
          print(out_num / out_den)
#
#
          if out_num / out_den < 30 :</pre>
        return out_num / out_den
          return 15
#
          return tk
    return 0
# HDR display util functions
def linear_scaling(img_cc, scale, should_plot=False):
      img_scaled = np.clip(skimage.color.rgb2gray(img_cc) * scale, 0, 1)
    img_scaled = np.clip(img_cc * scale, 0, 1)
    if should plot :
        plt.imshow(img_scaled)
        plt.title('linear scaling')
        plt.show()
    return img_scaled
# Gamma Encoding
def gamma_encoding(val) :
    if val <= 0.0031308 :</pre>
        return 12.92 * val
    else :
        return (1+0.055) * np.power(val, 1/2.4) - 0.055
```

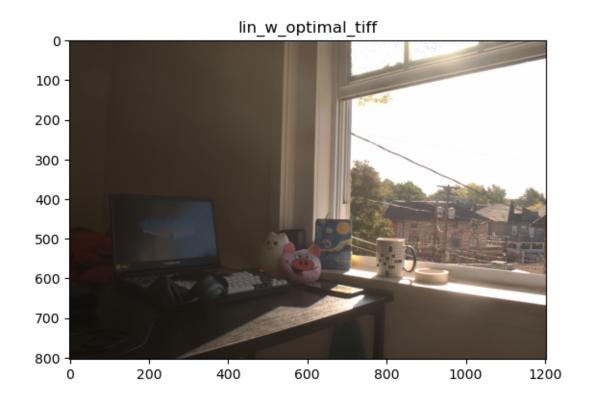
```
def display_hdr_image(img, scale, title='', should_plot=True) :
    img_scaled = linear_scaling(img, scale)
    ge_f = np.vectorize(gamma_encoding)
    image_ge = ge_f(img_scaled)
    if should_plot :
        plt.imshow(image_ge)
        plt.title(title)
        plt.show()
    return image_ge
```

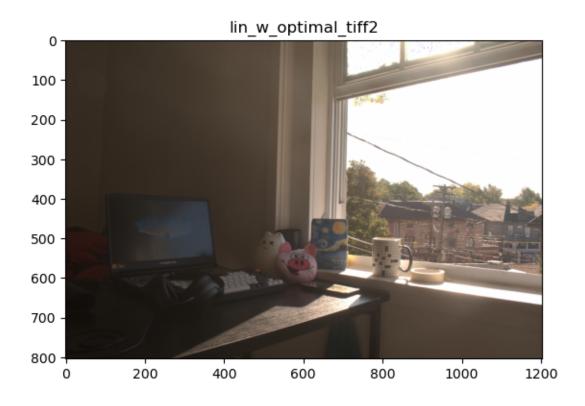
```
[61]: I_hdr_tiff_lin_merged_w_optimal =
       →linear_merging_channelwise(images_stack_tiff_normalized,_
       wimages stack tiff darkframe sub, t, weight optimal, r m norm, g m norm,
       →b_m_norm, r_c, g_c, b_c)
      _ = display_hdr_image(I_hdr_tiff_lin_merged_w_optimal,0.
      ⇔0000006, 'lin_w_optimal_tiff')
     I hdr_tiff_lin merged w optimal2 = linear_merging(images stack_tiff_normalized,_

images_stack_tiff_darkframe_sub, t, weight_optimal, a_m_norm, a_c)

      _ = display_hdr_image(I_hdr_tiff_lin_merged_w_optimal2,0.
      ⇔0000006, 'lin_w_optimal_tiff2')
      # I_hdr_tiff_lin_merged_w_optimal2 =__
      →linear merging(images stack tiff normalized2, images stack tiff, t, ⊔
      \rightarrow weight_optimal, 30, 1000)
      # = display hdr image(I hdr tiff lin merged w optimal2,0.
       →000006, 'lin_w_optimal_tiff2')
      # I hdr tiff log merged w optimal = log merging(images stack tiff normalized,
      ⇒images_stack_tiff_darkframe_sub, t, weight_optimal, 30, 1000)
      # _ = display_hdr_image(I_hdr_tiff_log_merged_w_optimal, 0.
      →1, 'log_w_optimal_tiff')
     src.cp_hw2.writeHDR('I_hdr_tiff_lin_merged_w_optimal-part5.HDR',__
      src.cp hw2.writeHDR('I hdr tiff lin merged w optimal2-part5.HDR',
       →I_hdr_tiff_lin_merged_w_optimal2)
      \# # src.cp_hw2.writeHDR('I_hdr_tiff_log_merged_w_optimal-debug.HDR',_u
       \rightarrow I_hdr_tiff_log_merged_w_optimal)
```

```
I_hdr = I_hdr_num / I_hdr_den
```





```
[60]: | im_hdr_selected = I_hdr_tiff_lin_merged_w_optimal2.copy()
       \begin{tabular}{ll} \# im\_hdr\_selected = src.cp\_hw2.readHDR('I\_hdr\_tiff\_lin\_merged\_w\_optimal-debug. \\ \end{tabular} 
       →HDR′)
      # Photographic ToneMapping
      # kinda sus, make sure its right
      def calc_geometric_mean_log(im) :
          if im.min() < 0 :</pre>
               # clipping out negative values and raising them to be over 0
              g_{mean} = np.exp(np.log(im - (1.00000001) * im.min()).mean())
          else :
               # else
              g_{mean} = np.exp(np.log(im + 1e5).mean())
          return g_mean
      def calc_geometric_mean(im) :
          pass
      def place_key(g_mean, im, K) :
          im_keyed= K * (im) / g_mean
          return im_keyed
      def set_white(im_keyed, B) :
          im_white = B * np.max(im_keyed)
          return im_white
      # Note: don't really understand what the difference
      # would be upon applying tonemapping for the 3 channels separately
      # in the case mentioned in the hints. That would be same as this right?
      # unless we are setting different keys and burnouts
      def complete_photographic_tonemap(im, K, B) :
          g_mean = calc_geometric_mean_log(im)
          im_keyed = place_key(g_mean, im, K)
          im_white = set_white(im_keyed, B)
          im_tonemapped_num = im_keyed * (1 + im_keyed / (im_white**2))
          im_tonemapped_den = 1 + im_keyed
          im_tonemapped = im_tonemapped_num / im_tonemapped_den
          return im_tonemapped
      def complete_photographic_tonemap_throughxyY(im, K, B) :
```

```
im_XYZ = src.cp_hw2.lRGB2XYZ(im)
    x = im_XYZ[...,0].copy() / im_XYZ.sum(2)
    y = im_XYZ[...,1].copy() / im_XYZ.sum(2)
    Y = im_XYZ[...,1].copy()
    Y_tonemapped = complete_photographic_tonemap(Y, K, B)
    X = (x * Y_tonemapped) / y
    Y = Y \text{ tonemapped}
    Z = (1 - x - y) * Y_{tonemapped} / y
    im_XYZ_tonemapped = np.concatenate((np.stack((X,Y),-1),np.
 \rightarrowexpand dims(Z,-1)),-1)
    im_RGB_tonemapped = src.cp_hw2.XYZ21RGB(im_XYZ_tonemapped)
    return im_RGB_tonemapped
# im_hdr_selected_cc_wb_ptm = complete_photographic_tonemap(im_hdr_selected,_u
 \hookrightarrow K=0.36, B=0.95)
# im_hdr_selected_cc_wb_ptm_tonemapped =__
 adisplay_hdr_image(im_hdr_selected_cc_wb_ptm, 1, 'image after ptm tonemapped')
# src.cp_hw2.writeHDR('im_hdr_selected_cc_wb_ptm-debug.HDR',_
 → im hdr selected cc wb ptm)
im_hdr_selected_cc_wb_ptm_xyY =
 ocomplete_photographic_tonemap_throughxyY(im_hdr_selected, K=0.6, B=0.09)
im_hdr_selected_cc_wb_ptm_tonemapped =__
 display_hdr_image(im_hdr_selected_cc_wb_ptm_xyY, 1, 'image after ptm_
 src.cp_hw2.writeHDR('im_hdr_selected_cc_wb_ptm_xyY-part5.HDR',_
 →im_hdr_selected_cc_wb_ptm_xyY)
/tmp/ipykernel_17410/2410649774.py:48: RuntimeWarning: invalid value encountered
in divide
 x = im_XYZ[...,0].copy() / im_XYZ.sum(2)
/tmp/ipykernel_17410/2410649774.py:49: RuntimeWarning: invalid value encountered
in divide
 y = im_XYZ[...,1].copy() / im_XYZ.sum(2)
```

