

CODE (DEMO.PY)

```
import numpy as np
import math
import cv2
import matplotlib.pyplot as plt
from plot_util import plot_and_save, show_hist
def Gaussian_Filter(img_size, lowpass=True, D0=100):
    Return filtered img and filter H
    # Create Gaussin Filter: Low Pass Filter in frequenct
    M, N = img_size[0], img_size[1]
    H = np.zeros((M,N), dtype=np.float32)
    D0 = D0 # Cutoff frequency
   xv, yv = np.meshgrid(range(M), range(N), sparse=False)
   H = np.exp(-((xv - M/2)**2 + (yv - N/2)**2) / (2. * D0 *
D0))
    if lowpass:
        pass
    else:
        H = 1 - H
    return H
class alpha trimmed mean filter:
    def __init__(self, mask_size=5, alpha=16):
        self.mask_size = mask_size
        self.alpha = alpha
    def padding(self, img):
        pad_size = self.mask_size // 2
        pad_img = np.pad(img, pad_width=pad_size)
        return pad img
    def filter(self, img):
        img = np.array(img)
        img_size = img.shape
        pad_img = self.padding(img)
        result_img = np.empty(img_size)
        kernel size = self.mask size
```

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f i = []
        for i in range(img_size[0]):
            f j = []
            for j in range(img_size[1]):
                startx = i
                starty = j
                f = pad_img[startx : startx + kernel_size,
starty : starty + kernel_size]
                f_j.append(f.flatten())
            f_i.append(f_j)
        f = np.array(f i).reshape(img size[0], img size[1],
kernel_size**2)
        f = np.sort(f, axis=-1)
        result_img = np.mean(f[:, :, (self.alpha // 2): -
(self.alpha // 2)], axis=-1)
        return result_img
class inverse_filter:
    def __init__(self, degradation_model):
        self.H = degradation_model
    def inverse(self, s):
        s = np.array(s)
        assert s.shape == self.H.shape
        S = np.fft.fft2(s)
        S = np.fft.fftshift(S)
        F = S / self.H
        F = np.fft.ifftshift(F)
        f = np.fft.ifft2(F)
        return np.real(f)
def demo():
    Assume system: \n
    Assume h is Gaussian blur \n
        s + n = g \setminus n
    Try to find f from g \n
    img_file = 'Kid2 degraded.tiff'
    img = cv2.imread(img_file, 0)
    g = img
```

```
D0s = np.linspace(100, 250, 4, dtype=int)
    for D0 in D0s:
        # Denoise (g -> s)
        mask_size = 5
        alpha = 16
        filter = alpha trimmed mean filter(mask size, alpha)
        s = filter.filter(g)
        # Inverse filter (s -> f)
        H = Gaussian_Filter(s.shape, lowpass=True, D0=D0)
        inv filter = inverse filter(degradation model=H)
        f = inv_filter.inverse(s)
        # Plot results
        name_list = []
        img_list = []
        name_list.append('origin_img'), img_list.append(g)
        name_list.append('denoise_img'), img_list.append(s)
        name_list.append('inv_filter_img'), img_list.append(f)
        plot_and_save(f'Kid_restoration_D0={str(D0)}',
img_list, name_list, dpi=200, plot=False, save=True)
        show_hist(f'Kid_restoration_D0={str(D0)}', img_list,
name_list, plot=False, save=True, density=False)
    # Anaylize noise
    n_hat = g - s
    n_hist = show_hist('Kid_restoration', [n_hat],
filenames=['noise_hist'], plot=False, save=True)[0]
    n_{mean} = np.sum(n_{hist[0]} * n_{hist[1][:-1])
    n_{var} = np.sum(n_{hist[0]} * (n_{hist[1]}[:-1] - n_{mean})**2)
    print(f'noise mean: {n_mean}')
    print(f'noise variance: {n_var}')
if __name__ == "__main__":
    demo()
```

CODE (PLOT_UTIL.PY)

```
import numpy as np
import cv2
import os
import matplotlib.pyplot as plt
def plot_and_save(demo_name, gray_imgs, filenames, dpi=200,
plot=True, save=True, cv_plot=False):
    size = len(gray_imgs)
    if save:
        root = 'results'
        result path = os.path.join(root, demo name)
        imgs_path = os.path.join(result_path, 'imgs')
        if not os.path.exists(root):
            os.mkdir(root)
        if not os.path.exists(result_path):
            os.mkdir(result path)
        if not os.path.exists(imgs_path):
            os.mkdir(imgs_path)
        for i in range(size):
            img_path = imgs_path + '/' + filenames[i] + '.png'
            plt.figure()
            plt.title(filenames[i])
            plt.tight_layout()
            plt.imshow(gray_imgs[i], cmap='gray')
            plt.savefig(img_path, bbox_inches='tight',
dpi=dpi)
        plt.close('all')
    if plot and not cv_plot:
        plt.figure(figsize=(16, 8))
        img in row = 4
        r = size // img_in_row + (size % img_in_row > 0)
        c = img_in_row
        for i in range(size):
            plt.subplot(r, c, i+1)
            plt.title(filenames[i])
            plt.imshow(gray_imgs[i], cmap='gray')
        plt.suptitle(demo_name + ' images')
        plt.tight_layout()
        plt.show()
        plt.close('all')
```

```
if cv plot:
        c = size
        p = 0
        concated img = []
        for i in range(size):
            cv2.putText(gray_imgs[i], filenames[i], (40, 40),
cv2.FONT_HERSHEY_SIMPLEX, 1, (128, 128, 128), 1, cv2.LINE_AA)
        blanks = 4 - size % 4
        for in range(blanks):
            gray_imgs.append(np.zeros(gray_imgs[0].shape,
dtype='uint8'))
            cv2.putText(gray_imgs[-1], 'BLANK IMG',
(gray_imgs[0].shape[1]//2-80, gray_imgs[0].shape[0]//2),
cv2.FONT HERSHEY SIMPLEX, 1, (255, 255, 255), 1, cv2.LINE AA)
        while c > 0:
            concated_img.append(cv2.hconcat(gray_imgs[p:p+4]))
            p += 4
        final img = cv2.vconcat(concated img)
        final img = cv2.resize(final_img, (1280, 720))
        cv2.imshow('imgs', final_img)
        cv2.moveWindow('imgs', 0, 0)
        cv2.waitKey(0)
        cv2.destroyAllWindows()
def show_hist(demo_name, gray_imgs, filenames, plot=True,
save=True, density=True):
    size = len(gray_imgs)
    if save:
        root = 'results'
        result path = os.path.join(root, demo name)
        hist_path = os.path.join(result_path, 'hist')
        if not os.path.exists(root):
            os.mkdir(root)
        if not os.path.exists(result_path):
            os.mkdir(result path)
        if not os.path.exists(hist_path):
            os.mkdir(hist_path)
        for i in range(size):
            img_path = hist_path + '/' + filenames[i] + '.png'
            plt.figure()
            plt.title(filenames[i])
            plt.hist(gray_imgs[i].ravel(), 256, [0,256])
            plt.tight layout()
```

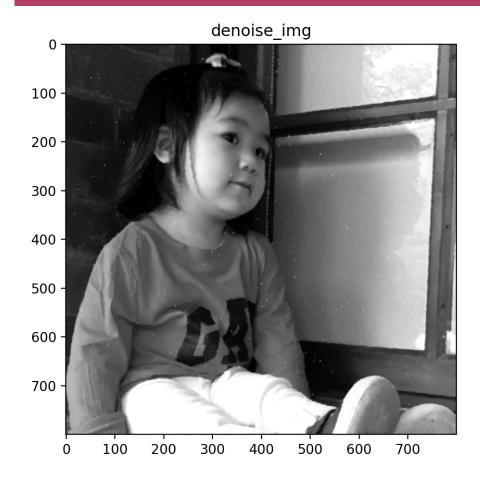
```
plt.savefig(img_path, bbox_inches='tight')
        plt.close('all')
    if plot:
        plt.figure(figsize=(16, 9))
        r = size // 4 + (size % 4 > 0)
        for i in range(size):
            plt.subplot(r, c, i+1)
            plt.title(filenames[i])
            plt.hist(gray_imgs[i].ravel(), 256, [0,256])
        plt.suptitle(demo_name + ' histograms')
        plt.tight_layout()
        plt.show()
        plt.close('all')
    hists = []
    for i in range(size):
        hists.append(np.histogram(gray_imgs[i].ravel(), 256,
[0, 256], density=density))
    return hists
```

RESULTS OF NOISE MODEL AND MODEL PARAMETERS

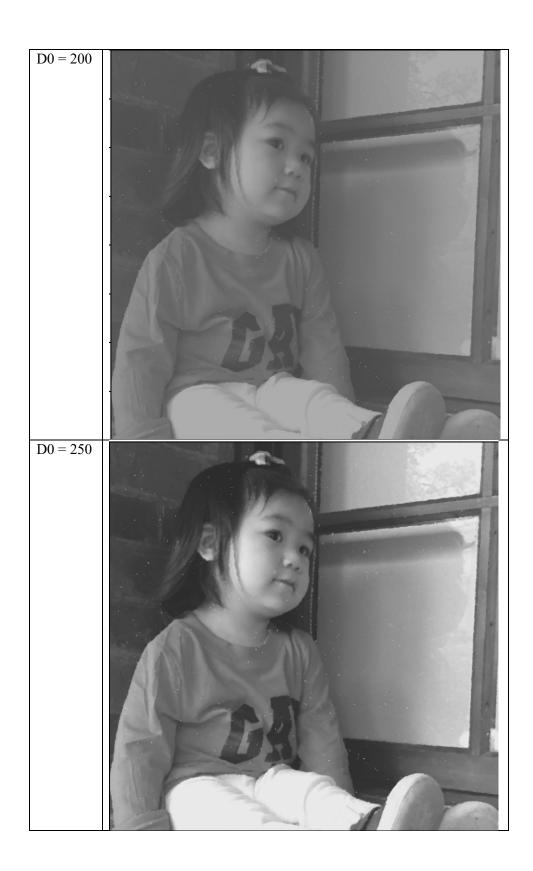
Model: pepper and salt noise model Noise mean: 43.815218160831094

Noise variance: 5811.754854517623

DE-NOISED IMAGE BY ALPHA-TRIMMED MEAN FILTER USING 5X5 MASK AND ALPHA= 16



IMAGES RECONSTRUCTED BY ESTIMATED INVERSE FILTER D0 = 100D0 = 150



DESCRIBE THE PARAMETERS USED FOR DECONVOLUTION, INCLUDING DO OF THE INVERSE FILTER AS WELL AS THE ORDER N AND CUTOFF FREQUENCY OF BUTTERWORTH LP

Before we reconstructed the images, we assumed that the degradation model is Gaussian model. When we use inverse filter (inverse Gaussian filter) to reconstruct the images, we will get images closer to the original images if we guess more accurate about the degradation model.

Here we assume the degradation model is Gaussian, so the parameter is D0. When the D0 is same as the degradation model (Gaussian model), we can get original image.

The degraded image looks not heavily blurred, so the D0 should not be too small. If it does, we won't get a good result, like previous part D0=100, we get a bad result.