

# Homework4 for Mathematical Image Process

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## 1 Wavelet Based Image Processing

Image Restoration can be considered as solving the inverse problem of

$$Au = f + \eta$$

There are two approaches to process images by wavelets:

- **Analysis Approach**

$$\min_u \|\lambda \cdot Wu\|_1 + \frac{1}{2} \|Au - f\|_2^2$$

- **Balanced Approach**

$$\min_{\alpha} \|\lambda \cdot \alpha\|_1 + \frac{1}{2} \|AW^T\alpha - f\|_2^2 + \frac{\kappa}{2} \|(I - WW^T)\alpha\|_2^2$$

To solve the analysis approach method, we used Split Bregman method to do the optimization problem:

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**Algorithm 1** Split Bregman For Analysis Approach

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set  $d_0$  and  $b_0$

**repeat**

  update:

- $u_k = (A^T A + \mu I)^{-1} (A^T f + \mu W^T (d_k - b_k))$
- $d_{k+1} = \mathcal{T}_{\lambda/\mu}(Wu_{k+1} + b_k)$
- $b_{k+1} = b_k + \delta(Wu_{k+1} - d_{k+1})$

**until**  $\frac{\|Wu_{k+1} - d_{k+1}\|}{\|f\|_2} < tol$

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To solve the balanced approach problem we use the ISTA algorithm:

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**Algorithm 2** ISTA For Balanced Approach

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```

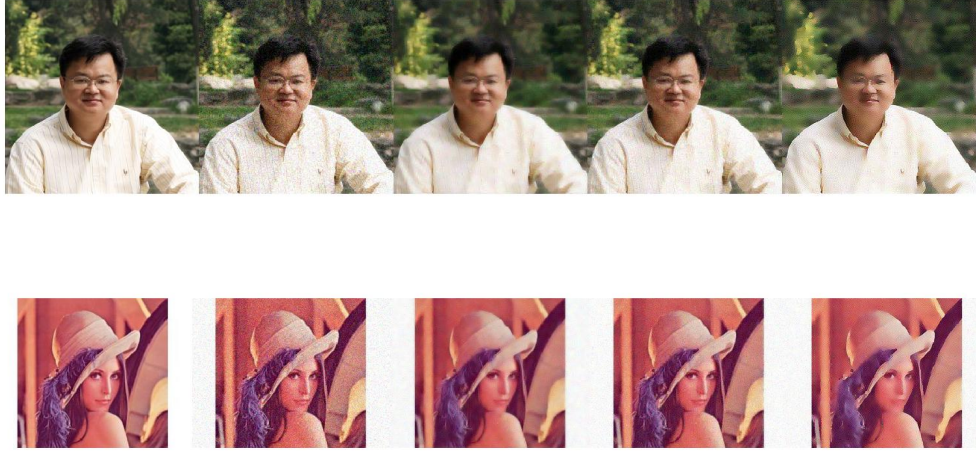
set  $\alpha_0$ 
repeat
  update:
    •  $g_k = \alpha_k - \nabla F_2(\alpha_k)/L$ 
    •  $\alpha_{k+1} = \mathcal{T}_{\lambda/L}(g_k)$ 
until end

```

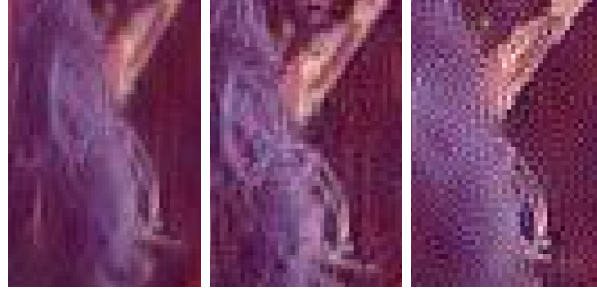
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## 2 Wavlet Based Image Denoising

In the denoising problem, the linear operator  $A$  here is  $id$ , results is shown bellow:



**Test1.** Image Denoising Test:(a) Original Image (b) Noised Image (c) Analysis Approach  
(d) Balanced Approach (e) TV model



**Test2.**Detail Of The Denoised Image:(a) Analysis Approach (b) Balanced Approach (c) TV model

Obviously, the wavelet based image denoising holds more details.

### 3 Wavelet Based Deblur



**Test3.** Image Deblurring Test:(a) Original Image (b) Blured Image With Noise (c) Analysis Approach (d) Balanced Approach (e) TV model

### 4 ReadMe

The functions in the folder **profunc** are functions to process the images, for denoising there are three functions:

- denoise\_TV.m
- denoise\_anl.m
- denoise\_wav.m(balanced approach)

For deblurring, the code of TV model is in blur.m and others are in deblur\_wav.m  
The **test\_another.m** and test\_wavelet.m are the test entrance.