# AIP-Assignment 1

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#### Question 4 1

Algorithm: EWISTARS(Exponential Wavelet Iterative Shrinkage Thresholding Algorithm with Random Shift)

This uses following features:

- 1. ISTA
- 2. the sparse representation of exponent of wavelet transform(EWT)
- 3. the shift-invariance of random shifting (RS)

It is aimed at improving the reconstruction quality and accelerating computation.

#### Part A

#### 1. Reconstruction Model

- (a) y = Ux + e, where U denotes the under sampling scheme in the kspace, namely, the incomplete Fourier transform. e is caused by either scanner imprecision's or the noise
- (b)  $y = Q\omega + e$ , where Q=UW,W is inverse sparse transform(EWT)  $\omega$  denotes the sparsity coefficients
- (c) cost function defination  $S(\omega) = \parallel y - Q\omega \parallel_2^2 + \lambda \parallel \omega \parallel_1$
- 2. Exponential Wavelet Transform Pseudocode of exponential wavelet transform (EWT) is as follows:

Step 1. Input the randomly under sampled MRI signal or image.

Step 2. Repeat k times.

Step 2.1. Carry out the wavelet transform (WT).

Step 2.2. Normalize wavelet coefficients to [0 1].

Step 3. Output the EWT coefficients.

k is the number of exponential iterations and  $T_E$  is the exponential wavelet transform. A single (k=1) EWT is implemented by

$$T_E(x,1) = \frac{exp(T_W(x))-1}{e-1}$$
 where,  
 $T_W(x) = \omega$  here  $T_W$  represents the wavelet transform  $(T_W = W^{-1})$ 

3. The iterative thresholding algorithm (ISTA) presents a sequence of estimates  $\omega_n$ , which gradually approximates to the optimal result  $w^*$ 

# 4. AGORITHM EWISTA

Input: 
$$\omega_0$$
  $Y^{-1} \leftarrow diag(b)$  Parameter Setting  $t_0 = 1, n = 0, v_0 = \omega_0$  Produce the sequence of EWT modified by RS  $\{T_E(x,n)\}$  Repeat  $Q \leftarrow UW_n, A \leftarrow Q^HQ, a \leftarrow Q^Hy, \{\text{step 1}\}$   $\omega_{n+1} \leftarrow \Gamma_{\lambda b}(v_n + Y^{-1}(a - Av_n)) \{\text{step 2}\}$   $t_{n+1} \leftarrow \frac{1 + \sqrt{1 + 4t_n^2}}{2}$   $v_{n+1} \leftarrow \omega_{n+1} + \frac{(t_n - 1)}{t_{n+1}}(\omega_{n+1} - \omega_n) \{\text{step 3}\}$   $n \leftarrow n + 1$  Until termination criterion are met Output:  $\omega_{n+1}$   $x^* \leftarrow W\omega_{n+1}$ 

# **Explanation:**

### Step 2

 $\Gamma$  is the shrinkage operator and b is the threshold:

$$\Gamma_b(z) = sgn(z)(|z| - min(b/2, |Z|))$$
(same as ISTA step)

#### Step 3

 $t_n$  increases with the number of iteration. It basically fasten the process of reaching the termination criterion. It takes newly calculated  $\omega_{n+1}$  in addition with  $\frac{(t_n-1)}{t_{n+1}}$  times the gap between newly calculated  $\omega_{n+1}$  and  $\omega_n$ .

Part b For paper link click here: EWISTARS

# Part C Advantages over ISTA are :

- 1. It is aimed at improving the reconstruction quality(by using EWT) and accelerating computation(step 3).
- 2. EWISTARS algorithm takes advantage of the simplicity of ISTA, the sparse representation of EWT, and the shift-invariance of RS.
- 3. Applications in MRI

**Part D** Couldn't find an implementation of this algorithm.