# Performance Analysis of FrFT based Adaptive Filters with LMS Algorithm

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#### **ABSTRACT**

Fractional Fourier Transform function (FrFT) is a generalization of Fourier transforms (FT). Finite Impulse Response (FIR) filters are implemented based on Fractional Fourier transform domains, then modified filters characteristics some what tunable when compare with existing FT based FIR filters. So, in our proposals implementation is made on the FrFT FIR filters for different windows like Rectangle, Bartlett, Hamming, Hanning, and Kaiser, based on the adaptive algorithms ,and the performance of the proposed filters is made by SNR values of the different obtain filters for given noisy sinusoidal inputs.

#### **Keywords**

Adaptive Filters, FrFT, LMS Algorithm, SNR

### 1. INTRODUCTION

Digital filter plays an important role in digital signal processing applications. Digital filters are widely used in digital signal processing applications, such as digital signal filtering, noise filtering, signal frequency analysis, speech and audio compression, biomedical signal processing and image enhancement etc.[1]. Traditionally, most digital filter applications have been limited to audio and high-end image processing. With advances in process technologies and digital signal processing methodologies, digital filters are now costeffective in the IF range and in almost all video markets[2]. Finite impulse response (FIR) digital filter impulse response is finite, so it can be used for Fast Fourier Transform (FFT) algorithm to achieve the filtered signal, which can greatly improve the efficiency of operation. In addition, FIR digital filter can be designed a linear phase digital filter which is convenient for image processing and data transmission applications[3]

FIR Filter banks are used to perform short-term spectram Analysis in a variety of speech processing systems[4]. Many Window functions are widely used in digital signal processing for various applications in signal analysis and estimation, digital filter design and speech processing [5]. Embedded devices. Heart rate frequency is very important health status information. The frequency measurement is used in many medical or sport applications like stress tests or life treating situation prediction.[6]. The accurate extraction of the AA signal from the ECG of AF is of great interest for subsequent analysis, since it has been documented to provide significant information on the properties of AF episodes[7]. reduction represents another important objective of ECG signal processing; in fact, the waveforms of interest are sometimes

so heavily masked by noise that their presence can only be revealed once appropriate signal rocessing has first been applied.[8] In the last two decades, spectral analysis of the residual ECG signal (rECG, i.e. an ECG signal in which ventricular components were canceled through beat averaging techniques) has been employed to characterize atrial activities[9].VF is raditionally described as a system of many chaotic in the myocardium wandering, electrical wavelets, ever changing in direction and number. In contrast, recent findings indicate that stable organized centres of rapid activity, called "mother rotors"[10].

# 2. ADAPTIVE FILTERS & LMS ALGORITHM

Adaptive filters provide performance excellence due to their inherent pole-zero structure as compared with adaptive finite impulse response (FIR) filters that have an all-zero form ,in active noise control Application[1].RLS Filters[2].Adaptive Filters are highly stable and effectively attenuate and often cancel destitutions[3].An Adaptive filters are successfully used in bio-medical processing systems like Denoising of ECG Waveforms[4] Adaptive filters play an important role in modern Digital signal processing products in area such as telephone echo cancellations, noise cancellation, equalization of communications channels, biomedical signal enhancement, active noise control, and adaptive control systems[5]

# 3. FRACTIONAL FOURIER TRANSFORM

Fractional Fourier Transform widely used in quantum mechanics and quantum optics [16]. Fractional Fourier Analysis can obtain the mixed time and frequency components of signals[17]. it finds various applications like pattern recognisition with some spatial distortion, Image representation, compression and noise removal in signal processing [18]-[20]. FrFT used for Interpretation of sinusoidal signals and design of Digital FIR Filters[21]-[22].

The continuous –time Fractional Fourier Transform of a signal  $\omega(t)$  is defined through an interval [3]

$$\omega_{\alpha}(u) = \int_{-\infty}^{\infty} \omega(t) K_{\alpha}(t, u) dt - - - (1)$$

Where the transform kernel  $K_{\alpha}(t, u)$  of the FRFT is Given by

$$K_{\alpha}(t,u) = \sqrt{\frac{1 - jcot(\alpha)}{2\pi}} exp\left[i\left(\frac{t^2 + u^2}{2}\right) cot(\alpha) - iutcosec(\alpha)\right] \text{ if } \alpha \text{ is multiple of } \pi$$
$$= \partial(t - u) \text{ if } \alpha \text{ is multiple of } 2\pi$$

= 
$$\partial(t+u)$$
 if  $\alpha + \pi$  is a mulpiple of  $2\pi - - - (2)$ 

Where  $\alpha$  indicates rotation of angle of the Transformed signal for FrFT.

## 4. DESIGN OF FRFT BASED ADAPTIVE FILTER

In our illustrative numerical example, the adaptive filter is set to be a 100-tap FrFT based FIR filter to simplify numerical algebra. The filter adjustable coefficient wn is adjusted based on the LMS algorithm.

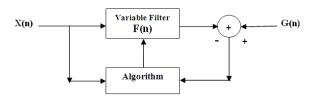
$$w_{n+1} = w_n + m * e(n)x(n) - - - (3)$$

where wn is the coefficient used currently, while  $w_{n+1}$  is the coefficient obtained from the LMS algorithm and will be used for the next coming input sample. The value of m controls the speed of the coefficient change, e(n) is an error value updated each time and x(n) is noised signal coefficient. The output equations of LMS algorithm leads to

$$F(n) = G(n) * x(n) - - - (4)$$

$$e(n) = d(n) - y(n) - - - (5)$$

$$G_{n+1} = G + m * e(n)x(n) - - (6)$$



### 4.1 Steps to Design Adaptive Filter

 The Low pass filter removes the corrupting low frequency noises in signal. The order of the filter is the order of the filter is 64.

#### Steps to low pass filter

The desired transfer function of filter is

$$h_d(n) = \frac{sinw_c n}{\pi n}$$

By multiplying the desired transfer function with windows designed by FrFT ,we can get transfer function of FIR band reject filter i.e

$$h(n) = h_d(n) * w(n)$$

where w(n) is represents Transfer function of following windows

- i Hamming window
- ii Hanning window
- iii Kaiser window

- 2. Now h(n) is compared with x(n) which produces e(n).
- The error coefficients are fed back to LMS algorithm to update the coefficients of FrFt based LPF.
- 4. Steps 2 and 3 repeated up to error becomes negligible.
- The updated coefficients of LMS Algorithm is the is the Response of desired Filter

## 5. RESULTS AND IMPLEMENTATIONS

The results shows responses of the FrFT based Adaptive filter with LMs Algorithm and we applied a noised signal shown in Fig2 and compares the signal to noise ratio of Noised signal before and after the filtering for different Fractional Parameters of FrFT.

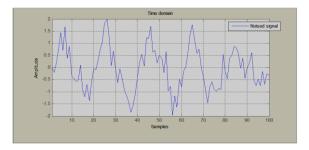


Fig2: Noised signal

When the Noised signal of fig2 is filtered with Adaptive Filter whole noise was removed, producing a near clean signal of fig:3 to fig:8 with different window combinations of Desired FrFt based Filter. and SNR values of noised and denoised signals are calculated for LMs and FrFT based LMS Algorithms for different windows are shown in Table-1 to Table-5.

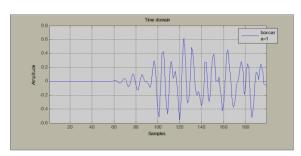


Fig3:Response of Adaptive filter with Rectangular window and a=1

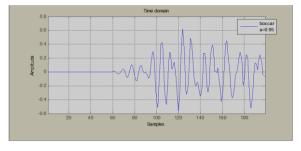


Fig4:Response of Adaptive filter with Rectangular window and a=0.95

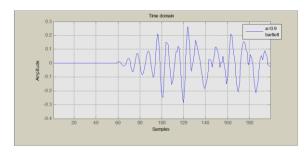


Fig5:Response of Adaptive filter with Bartlett window and a=0.9

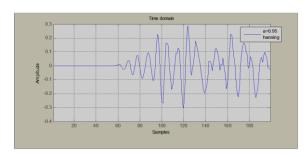


Fig6:Response of Adaptive filter with Hanning  $\;$  window and a=0.95

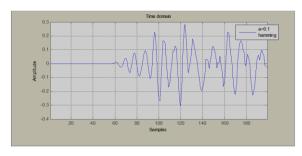


Fig7:Response of Adaptive filter with Hamming window and a=0.1

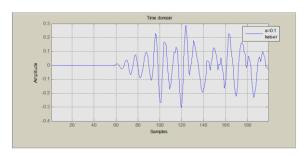


Fig8:Response of Adaptive filter with kaiser  $% \left( 1\right) =0.1$  window and  $a{=}0.1$ 

Table1: Response of FrFT+LMS based Rectangular window

N	FrFT + LMS		LMS
	Tuning parameter(a)	SNR in dB	SNR in dB
100	1*		12.9578

100	0.98	13.0029	
100	0.95	13.0184	
100	0.9	12.9644	
100	0.1	13.0194	
100	0.01	12.9792	
100	0.05	13.0055	

Table2: Response of FrFT+LMS based Bartlett window

N	FrFT+LMS		LMS
	Tuning parameter(a)	SNR in dB	SNR in dB
100	1*		11.4899
100	0.98	11.4898	
100	0.95	11.4899	
100	0.9	11.4905	
100	0.1	11.4895	
100	0.01	11.4898	
100	0.05	11.4896	

Table3: FT and FRFT Response of FrFT+LMS based hanning window

N	FrFT + LMS		LMS
	Tuning parameter(a)	SNR in dB	SNR in dB
100	1*		12.9468
100	0.98	12.9469	
100	0.95	12.9469	
100	0.9	12.9469	
100	0.1	12.9468	
100	0.01	12.9468	
100	0.05	12.9462	

Table4:Response of FrFT+LMS based hamming window

N	FrFT + LMS		LMS
	Tuning parameter(a)	SNR in dB	SNR in dB
100	1*		12.9312
100	0.98	12.9349	
100	0.95	12.9361	
100	0.9	12.9318	
100	0.1	12.9362	
100	0.01	12.9329	
100	0.05	12.9351	

Table5: Response of FrFT+LMS based Kaiser window

N	FrFT + LMS		LMS
	Tuning parameter(a)	SNR in dB	SNR in dB
100	1*		13.0252
100	0.98	13.0292	
100	0.95	13.0308	
100	0.9	13.0264	
100	0.1	13.0305	
100	0.01	13.0270	
100	0.05	13.0293	

### 6. CONCLUSION

The Implementation of Fractional Fourier Transform based Fir Filter using LMS Algorithm with Different Digital windows was performed. and we also applied a sample test noised signal to Adaptive filter and obtained denoised wave form at output which are shown in Fig-2 to Fig-8,and We compared SNR at input and Output for different window combinations which are shown from Table-1 to table-5. From the above discussions it is concluded that Fractional Fourier transform based Digital Filters with LMS Algorithm was given better Response in terms of SNR and Enhancement of Noise signal from noised input signal.

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