# ON THE EFFECTS OF QUANTIZATION ON MISMATCHED PULSE COMPRESSION FILTERS DESIGNED USING L-p NORM MINIMIZATION TECHNIQUES

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#### **Abstract**

In [1] the authors introduced a technique for generating mismatched pulse compression filters for linear frequency chirp signals. The technique minimizes the sum of the pulse compression sidelobes in an  $L_p$ -norm sense. It was shown that extremely constant sidelobe levels (better than 60 dB) can be achieved for minimal mismatch loss and broadening of the compression peak. This paper reports on an investigation into the effect of quantization on pulse compression filters designed using the abovementioned technique. Simulation results for 8-bit and 16-bit implementations of a pulse compressor system are presented.

#### 1 Introduction

Pulse compression gives radar designers the ability to obtain sufficient energy on a target for target detection without decreasing the range resolution of the system or resorting to the use of very high power transmitters. Pulse compression thus permits the use of lower power transmitters with longer pulse lengths to maintain the energy content of a pulse. A matched filter is used on reception to maximize the signal to noise ratio of the received signal [3]. The actual transmitted waveforms are chosen so as to have an Autocorrelation Function (ACF) with a narrow peak at zero time shift and sidelobe values as low as possible at all other times. The sidelobes have the undesirable effect of masking smaller targets in close proximity to larger targets, such as clutter returns.

No direct design techniques exist for the generation of pulse compression waveforms with optimally low sidelobe levels. This has resulted in several approaches to the problem of designing "good" pulse compression waveforms. Early pulse compression systems were based on linear frequency modulated waveforms [4], [5] so several techniques have been developed to reduce the sidelobe levels of this broad class of pulse compression waveforms. These include amplitude windowing of the signal and the dual thereof which is frequency windowing. Notably De Witte and Griffiths [6] achieved sidelobe levels of approximately 70 dB by using

non-linear frequency chirp waveforms.

Optimal binary phase shift codes have been found by means of exhaustive search techniques [7],[8],[9],[10]. Searches for good quadriphase codes have been reported in [11] and [12]. Gartz [13] and Nunn [14] have addressed the search for polyphase codes. Code searches are constrained by the computational complexity of the search process, which limits the lengths of codes which can be found using this technique. This has lead some authors to develop techniques for constructing codes which have close to optimal sidelobe levels. The Frank codes [15] and P(n,k) codes developed by Felhauer [16] are well known codes in this category.

Post-processing of the pulse compressor output such as sidelobe cancellation [17] and sidelobe smoothing [18] have also been reported.

Alternatively the pulse compression filter can be deliberately mismatched to reduce the sidelobe levels, but this implies a loss in signal to noise ratio and broadening of the compression peak as reported in [1]. An overview of the sidelobe reduction technique presented in [1] is given in the following section.

## 2 Sidelobe level reduction by application of norm minimization to the sidelobes

The mismatched pulse compression filter can be designed by minimizing the sum of the magnitudes of the complex sidelobe values ( $L_2$  –norm). This leads to the minimization of the energy in the sidelobes, whereas minimization of the  $L_{\infty}$  –norm will minimize the peak sidelobe level. The  $L_{\infty}$  –norm is not a well behaved function, so  $L_p$  –norms with p=2P were used in [1] and the solutions were found by means of numerical techniques.

Given the discrete time transmit sequence  $\{a_n\}$  and filter coefficients  $\{x_n\}$ , the output of the filter is given by

$$b_i = \sum_k a_{i+1-k} h_k \,, \tag{1}$$

where for the matched filter case  $h_n = a_{N-n}^*$ . The output of the

pulse compression filter can be written in matrix form as

$$\mathbf{b} = \mathbf{A}_{\mathbf{F}} \mathbf{x} \,, \tag{2}$$

where

$$\mathbf{b} = \begin{bmatrix} b_1 & b_2 & \cdots & b_{2N-1} \end{bmatrix}^T, \tag{3}$$

$$\mathbf{x} = \begin{bmatrix} x_1 & x_2 & \cdots & x_N \end{bmatrix}^T \tag{4}$$

and

$$\mathbf{A}_{\mathbf{F}} = \begin{bmatrix} a_1 & a_2 & \cdots & a_N & 0 & 0 & \cdots & 0 \\ 0 & a_1 & a_2 & \cdots & a_N & 0 & \cdots & 0 \\ \vdots & \ddots & \ddots & \ddots & \ddots & \ddots & \vdots \\ 0 & \cdots & 0 & a_1 & a_2 & \cdots & a_N & 0 \\ 0 & \cdots & 0 & 0 & a_1 & a_2 & \cdots & a_N \end{bmatrix}^T . (5)$$

The above formulation leads to the following convenient expression for the sum-of-squares of the convolution sequence:

$$\mathbf{b}^{H}\mathbf{b} = \|b_{1}\|^{2} + \|b_{2}\|^{2} + \dots + \|b_{2N-1}\|^{2}.$$
 (6)

The sidelobe measure function can now be formulated by defining a new matrix A which is similar to  $A_F$ , except that the rows in  $A_F$  which produce the compression peak are removed.

The method of Lagrange multipliers [2] is used to find a solution for  $\mathbf{X}$  that will minimize the sidelobe measure cost function while satisfying the constraint that a pulse compression peak with amplitude  $b_{peak}$  must be produced.

The analytical solution for the  $L_2$  case is given by

$$\mathbf{x} = \frac{b_{peak} \mathbf{C}^{-1} \mathbf{a}^{H}}{\mathbf{a} \mathbf{C}^{-1} \mathbf{a}^{H}},\tag{7}$$

where

$$\mathbf{C} = \mathbf{A}^H \mathbf{A} \,. \tag{8}$$

Numerical techniques had to be used to solve the  $L_{2P}$ -norm case. The following set of simultaneous equations have to be solved together with the constraint given in Equation (10).

$$\frac{\sum_{i=1}^{2N-1} \left( \left[ \mathbf{x}^{H} \mathbf{C}_{i} \mathbf{x} \right]^{P-1} \mathbf{C}_{i} \mathbf{x} \right)}{\left( \sum_{i=1}^{2N-1} \left( \left[ \mathbf{x}^{H} \mathbf{C}_{i} \mathbf{x} \right]^{P} \right) \right)^{1-\frac{1}{2P}}} + \lambda \mathbf{a}^{H} = \mathbf{0}, \quad (9)$$

$$g\left(\mathbf{x}\right) = \mathbf{a}\mathbf{x} - b_{peak} = 0. \tag{10}$$

An example of a solution for a linear frequency chirp transmit pulse with a time-bandwidth product (TBWP) of 50 is given in Figure 1.

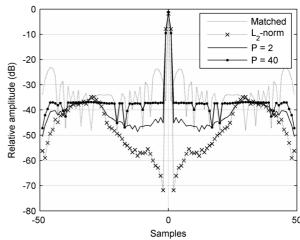


Figure 1: Pulse compression response for a linear frequency chirp transmit pulse with a TBWP of 50.

#### 2.1 Additional non-zero coefficients

To reduce the sidelobe level further, the pulse compression filter was symmetrically extended in time to be longer than the transmitted pulse. The extra coefficients are referred to as additional non-zero coefficients (ANZC). An example of the result achieved using 100 ANZC (i.e. 50 before and 50 after the standard matched filter length) is shown in Figure 2. By comparing Figure 1 and Figure 2 it can be seen that the ANZC's have allowed the sidelobe level to be significantly reduced.

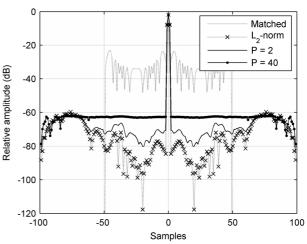


Figure 2: Pulse compression response for a linear frequency chirp transmit pulse with a TBWP of 50 and 100 ANZC's.

#### 3 Effect of coefficient quantization

Most radar systems utilise fixed point arithmetic in the implementation of signal processing algorithms due to realtime processing constraints. This prompted the authors to investigate the effect of coefficient quantization on the extremely low sidelobe levels obtained in [1], an example of which is shown in Figure 2. The transmit and receive waveforms were quantized to 8 and 16 bits and the pulse compressor outputs were simulated with the assumption that all bit growth was retained in the FIR filter implementation. Some example results are depicted in the figures that follow. For all the figures the transmit waveform was a linear frequency chirp with a TBWP of 50.

#### 3.1 Results with no additional non-zero coefficients

In this subsection three figures are presented showing the output of the optimized pulse compression filter as well as that of the matched filter for reference. No ANZC's were used and P was set to 1, 2 and 40.

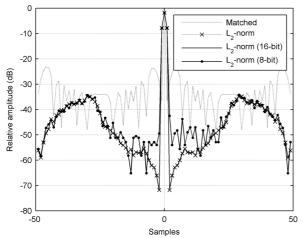


Figure 3: Comparison of sidelobe responses for receive filters with P = 1 and ANZC = 0.

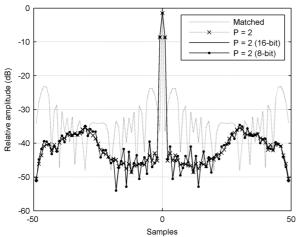


Figure 4: Comparison of sidelobe responses for receive filters with P = 2 and ANZC = 0.

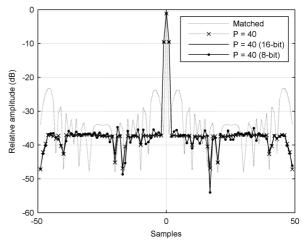


Figure 5: Comparison of sidelobe responses for receive filters with P = 40 and ANZC = 0.

The results presented in this subsection show that 16-bit quantization has a negligible effect on the resulting sidelobe response as compared to the floating point version of the filter (the two traces are indistinguishable). The 8-bit quantization adds a small amount of high frequency noise to the sidelobe response, approximately 45 dB below the pulse compression peak. This degradation in achievable sidelobe level should be tolerable for many applications.

#### 3.1 Results using additional non-zero coefficients

In this subsection three more figures are presented showing the output of the optimized pulse compression filter as well as that of the matched filter for reference. For these figures 100 ANZC's were used and P was set to 1, 2 and 40.

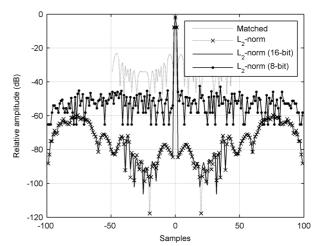


Figure 6: Comparison of sidelobe responses for receive filters with P = 1 and ANZC = 100.

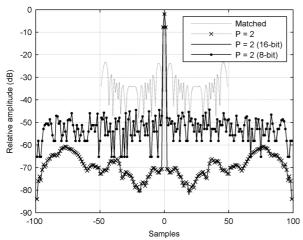


Figure 7: Comparison of sidelobe responses for receive filters with P = 2 and ANZC = 100.

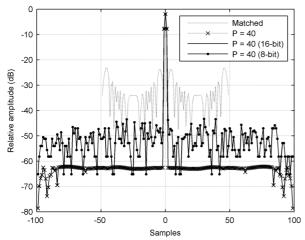


Figure 8: Comparison of sidelobe responses for receive filters with P = 40 and ANZC = 100.

The results presented in this subsection show that 16-bit quantization has negligible effect on the resulting sidelobe response as compared to the floating point version of the filter. The only exception to this is the sidelobe levels in Figure 6 which are below -100 dB, which would be inconsequential given the -60 dB peak sidelobe level.

#### 4 Discussion

This paper has shown that the achievable sidelobe level for mismatched pulse compression filters designed using the minimization of  $L_p$ -norms is relatively insensitive to quantization of the filter coefficients and transmit coefficients. It was shown that 16-bit quantized filters produce sidelobe levels which match the floating point versions very well. Filters with no ANZC's are relatively insensitive to 8-bit quantization.

The use of 8-bit quantization for filters with 100 ANZC's however limits the achievable sidelobe level to approximately -55 dB. This represents an increase of at least 7 dB in

sidelobe level for the floating point case. It might be possible to improve this figure if use is made of optimization algorithms which have been designed to search discrete spaces. This is a topic for further research.

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