# Low-Power, High-Throughput and Low-Area Adaptive Fir Filter **Based On Distributed Arithmetic Using FPGA**

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Abstract: A unique pipelined architecture implementation of adaptive filter based on Distributed Arithmetic (DA) for low-power, high-throughput and low-space. Filtering process involves more space and is not used for higher order filters, therefore it provides a great attrition in the throughput. These are problems that have been overcome by effectual DA formulation of adaptive filters. Distributed Arithmetic is an efficacious procedure for calculating the inner products between a fixed and a variable data vector. Equivalent appliance of 4-point inner product and coefficients increments units to produce immense throughput rate. Carry-save accumulation is used in order to rebate the sampling period and expanse complication for DA-based inner-product estimation. Power drain is reduced by using bit clock for carry-save accumulation when compared to all other process. To amend the weights by using least mean square (LMS) adaption and also attenuate the mean square error between the calculated and desired output. It rebate the LUT's, available flip-flop slices for this approach.

*Keywords:* Adaptive FIR filter, Carry save accumulation, DA, Least Mean Square theorem. \_\_\_\_\_

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#### I. Introduction

The proliferation of Adaptive filters find wide appliances in several digital signal processing (DSP) areas, like noise and echo cancellation, system identification, channel equalization and calculation. Generally, filter plays a major sole for removal of unwanted signal/ noise from the original signal, specifically, Adaptive FIR filter is simple to attract for many applications, where it is needed to reduce process requirement.

The operation of adaptive filter is based on the calculation of the statistical properties of the signal in the environment while modifying the value of its parameters in order to rebate a such criterion function. the statistical parameters vary with time. It consists of two process i.e., filtering process and the coefficients updating process. The Adaptive filter theorems are Least Mean Square (LMS), Recursive Least Square (RLS), Normalized Least Mean Square (NLMS). The LMS algorithm is a class of adaptive filter to mimic a desired filter by finding the filter coefficients that relate to producing the least mean squares of the error signal. The RLS algorithm includes many complicated mathematical procedure and NLMS algorithm is used in system in order to elevate the voice quality. Finally, LMS algorithm is most suitable for reducing the power and space. The mien features that attracted the use of the LMS algorithms are computational complexity and also it imply a feedback connection. The mien asset of LMS algorithm is its simplicity in terms of memory requirement. DA is basically a bit serial computation process that forms an inner product of pair of vectors in a single direct step. DA efficiently implements the MAC using basic building blocks in FPGAs. By using DA instead of traditional way, a huge abatement in area can be achieved.

DA-based scheme of adaptive filter has been suggested by Surya Prakash and Rafi Ahamed Shaik [10], have evaluated the design by using two LUTs to store weights and input samples during each iteration and also Mohanty and Meher [13] proposed a BLMS algorithm, in which this design makes use of a LUT sharing technique to get filter output.

#### II. **Adaptive Lms Algorithm**

Adaptive filters are dynamic filters which change their characteristics to achieve desired yield. Adaptive filter also has a various parameters which need to be changed in order to maintain optimal filtering. An adaptive filter may be understood as a self-modifying digital filter that adjust its coefficients in order to minimize an error function. This error function, also referred to as cost function, is a distance measurement between the reference or desired signal and output of the adaptive filter. LMS algorithms have been applied to an extensive number of problems including signal prediction, adaptive arrays e.tc., The basic configuration of an adaptive filter is shown in fig.1 shows which consists of general Adaptive FIR filter block and weight update block. In such a scheme, the input signal is denoted by x(k), the reference signal d(k) represents the desired output signal, y(k) is the output of the adaptive filter.

The error signal e(k) is used by the adaption algorithm to update filter coefficients vector w(k) according to equation (1a),

 $w(k+1)=w(k)+\mu .e(k).x(k)$  (1a)

where,

 $\begin{array}{c} e(k)=d(k)-y(k) & (1b) \\ y(k)=w^{qt}(k).x(k) & (1c) \\ \mathbf{S} \text{ adaptive filter at the nth iteration respectively} \end{array}$ 

x(k) and w(k) of an N<sup>th</sup> order LMS adaptive filter at the nth iteration respectively and is given by,

$x(k) = [x(k), x(k-1)x(k-N+1)]^{1}$	(2a)
$w(k) = [w_0(k), w_1(k), \dots, w_{K-1}(N)]^T$	(2b)

e(k) is the error computed during the k<sup>th</sup> iteration, which is used to update the weights,  $\mu$  is the convergence factor and N is the length of filter.

In the DLMS algorithm, instead of using the recent-most feedback error e(k) corresponding to the n<sup>th</sup> iteration for updating the filter weights, it uses the delayed error e(k-m), that is the error corresponding to (k-m)<sup>th</sup> iteration for updating the current weight. The coefficient-update equation of such delayed LMS adaptive filter is given by,

 $w(k+1)=w(k)+\mu.e(k-m).x(k-m).$  (3) where m is the "adaption delay".



Fig.1.General Adaptive Filter

#### **III.** Distributed Arithmetic

Distributed Arithmetic is generally used for signal processing theorems where computing the inner product of two vectors comprises most of the computational work load. Ironically, many DSP designs have never heard of this algorithm. Inspired by the potential of the Xilinx FPGA look up table architecture, the DA was resurrected in the early 90's and shown to produce very effectual filter design. It is one of the efficacious approach for realization of high order filters as it can achieve the large throughput without the help of hardware multiplier.

The LMS adaptive filter, is necessary to perform an inner product computation in each cycle, the most of the critical path is contributed by this. DA inner product generation considers the estimation of the following sum of products,

$$y = \sum_{k=0}^{N-1} w_k \cdot x_k \tag{4}$$

where  $w_k$  denotes the coefficients of the filter,  $x_k$  denotes the inputs of the filter. If we consider bit width of the coefficient is L, each component in the weight vector may be represented by two's complement form, such that  $|w_k| < 1$ , then we may express  $w_k$  as,

$$w_k = -w_{k0} + \sum_{l=1}^{L-1} w_{kl} \cdot 2^{-l}$$
(5)

Now by combining the equations (4) and (5) the expression y in terms of bits of  $w_k$  are shown below: Equation (6) is the conventional form of expressing the inner product computation. By interchanging the summation order, we get,

$$y = -\sum_{k=0}^{N-1} x_k \cdot w_{k0} + \sum_{k=0}^{N-1} x_k \cdot \sum_{l=1}^{L-1} w_{kl} \cdot 2^{-l}$$
(6)

The following equation defines a distributed arithmetic computation.

$$y = \left[\sum_{l=1}^{L-1} 2^{-l} \cdot y_l\right] - y_0 \tag{7}$$

Because each  $w_k$  may be take on values of 0 and 1 only, equation (5) may have only 2k possible values. Rather than compute these the values and store in a ROM. The input data can be used directly to address the memory. After N such cycles, the memory contains the result.

## IV. Proposed Schemes

In the proposed approach, for the implementation of the DA based adaptive filter, we make use of the DA-table structure that makes use of the 8 delay elements. Hence by using the proposed configuration, we can reduce the original DA-table structure that increases the area efficiency of the design. The proposed structure of D-table which makes use of 8 delay elements is shown in Fig.4. Therefore, we are designing a advanced DA based architecture for 4bit and 16bit LMS adaptive filters.

### 4.1.Proposed structure of DA Based Adaptive Filter of filter length N=4

The DA based adaptive filter of length N=4 consists of inner product block of four points, additional circuitry for coefficient increment block, computation of error value e(k), and the circuitry to generate the control word 't' which is further used by the barrel shifter are shown in Fig.2. The 4-point inner product block which was shown in Fig.3, consists of a DA-table which is used in this consists of a 15 register array. The existing DA-based LMS adaptive filter design requires 16 delay element DA table structure. But the same structure can be implemented with the help of 8 delay elements.



Fig.2. Proposed structure of DA based adaptive filter of filter length N=4.





DA table is used to reduce the number of clock cycles required to compute the the sum of input words. It is capable of storing the partial inner products  $y_l$  for  $0 < l \le 15$ . In order to store the pre-computed sums of partial products of input words, it contains only 15 registers. And a 16:1 multiplexer is used to select the contents present in the register and also the weights or Coefficients A={ $w_{3l}, w_{2l}, w_{1l}, w_{0l}$ } are fed to the multiplexer as control bits in the LSB-MSB order. The yield of the MUX is then connected to the CSA block, after every L bit cycles. The inner products can be calculated in L cycles by shift and accumulation, followed by look up table operations corresponding to L number of bit slices { $w_{kl}$ } and all the partial inner products which are fed from the MUX and it fructifies a sum and a carry words. The sum words are shifted and then added with the carry words and an input carry '1' to generate the filter output. This filter yield is subsequently subtracted from the wanted signal d(k) to obtain the error e(k). After that the sign-magnitude separator is used to separate the sign bit and magnitude bits from the obtained error.

The magnitude bits are used by the control word generator to shifter. The logic used for the procreation of control word 't' for barrel shifter is shown in Fig.5. The convergence factor ' $\mu$ ' is taken as 1/N. Generally, we can take  $\mu$  as 2<sup>-i</sup>/N, where 'i' is a small integer. The coefficient increment unit for N=4 consists of four barrel shifters and four adder/subtractor cells. The configuration of coefficient increment block is shown in Fig.6.

In general, Barrel Shifter is the most helpful unit in digital signal processing appliances. It performs multiplications just by right shifting the data in registers by required number of times. That means to multiply the data by 2 times, the data is shifted right by one position. Similarly, division can be performed by left shifting the data as per claim. Thus the barrel shifter reduces the complexity of operations there by area optimization has been achieved too. Here the barrel shifter shifts the input values  $x_k$ , where k=0,1,----N-1 by defined number of locations according to estimated error value. The barrel shifter produces the desired values that need to be added or subtracted from the content of the weight corresponding current value in register. The word parallel bit serial converter is used to convert the sum coming from the 4 adder and subtractor blocks load parallely and convert it into serial format which are used as weights to select the pre partial products from the DA table.



Fig.4. DA table for generation of possible sum of input samples block



Fig.5.Logic used for the control word t for BS



Fig.6.Structure of coefficient increment

### 4.2. Proposed structure of DA based Adaptive filter of filter length N=16

The architecture of DA based adaptive filter of N=16 is shown in Fig.7. This design includes four sets of 4-point inner product blocks and coefficients increment blocks. All the blocks are connected in proper manner in order to give wanted result. The four 4-point inner product blocks and coefficients increment blocks all together is known as 16-bit data computing block as this sub block computes 16-bit sum and carry words. These are used in further computations. As in the case of fourth order filter appliances, here also the sums and carry are produced by the four inner product blocks. And these will be added by using two binary adder trees. The output of four 4-point inner product blocks i.e., sum words are added with 4 carry in bits. Since the carry words are of double the coefficient compared to the sum words, 2 carry in bits are used as input carry at 1<sup>st</sup>level and carry words of binary adder tree, this contains a 4 carry in bits to sum words. Sign magnitude separator is used to divide the sign and magnitude are taken from the error which is calculated in case of filter N=4. The outputs that are obtained from the sign-magnitude separator and 't', which is used as a control word generator for barrel shifter are generally connected to all the coefficient increment blocks.



Fig.7.Proposed structure of DA based Adaptive filter of filter length N=16

# V. Synthesis & Simulation Results

The proposed design has been simulated using Xilinx 14.5 and ModelSim 6.8.b, the waveforms obtained after simulating is as shown in Fig.9,11, synthesis reports for 4-tap, 16-tap filters are shown in Fig.8,10., and also the proposed design simulated result is implemented on FPGA Spartan 3E board, is a high volume Starter board gives designers instant access to complete platform capabilities of Spartan 3E family.

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Project File:	as.xise		Parser Errors:		No Errors												
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Number of occupied Slices		:	296	4,656		6%											
Number of Slices containing only related logic		1	296	296	100%												
Number of Slices containing unrelated logic 0			296		0%												
Total Number of 4 input LUTs			477	9,312	5%												
Number used as logic			471														
Number used as a route-thru			6														
Number of bonded IOBs			30	190		15%											
Number of BUFGMUXs			3	24		12%											
Average Fanout of Non-Clock N	ets	3	.55														
<b>T</b> ! 0.0						0	1				a · _ 1				-		

Fig.8.Synthesis report for 4-tap adaptive filter

Fig.9. Simulation output for 4-tap adaptive filter

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Target Device:	xc3s500e-4ft256		•Errors:			No Errors					<b>N</b> 1		12 141 E00 mg	12 141 600		0 141 700 m	12 141 000 m
Product Version:	ISE 14.5		•Warnings:		394 Warnings (394 new)		Name		Value		2,141,500 fis	2,141,000 ms		2,141,700 fis	2,141,000116		
Design Goal:	Balanced		Routing Results:		All Signals Completely Routed		🗓 dk			100000000							
Design Strategy:	Xlinx Default (unlocked)		Timing Constraints:		All Constraints Met				1								
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Number used as logic		1	1,523														
Number used as a route-thru			21														
Number of bonded [OBs			34	190		17%											
Number of BUFGMUXs			6	24		25%											
Average Fanout of Non-Clock Ne	ets		3.15														

Fig.10.Synthesis report for16-tap adaptive filter

Fig.11.Simulation ouput for 16-tap adative filter

#### VI. Conclusion

In this paper, an adaptive FIR filter based on distributed arithmetic using FPGA for area efficacious method is implemented and also the reduction in power consumption is achieved too. High throughput is intensely enhanced by parallel LUT update and filtering and coefficient update operations performing synchronously. The carry save accumulation operation is used to produce the signed partial inner products, which compute the filter output very fast and also offset binary coding is popularly used to reduce the LUT size to half for area-efficient implementation of DA.

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