Delay Power Efficient DLMS Adaptive Filter With Low Adaptation Delay Using Kogge Stone Adder

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Abstract - In this paper, we introduce an effective architecture and silicon area without expanding the number of adaptation for the implementation of a delayed least mean square adaptive delays. filter. For accomplishing lower adaptation delay and delay power efficient architecture, we utilize a novel partial product adaptation delay, in spite of the fact that they specifically generator and propose a technique for advanced adjusted pipelining over the time consuming combinational blocks of the structure. From synthesis comes about, we find that the large adaptation delay issues are with the energy utilization. The proposed configuration offers less delay and power product

Additionally, we have proposed the Kogge Stone adder is a parallel prefix shape carry look-ahead adder. The Kogge Stone adder takes more area to implement than the Brent Kung adder, yet has a lower fan-out at each stage.

Keywords: adaptive filter, least mean square(LMS) algorithms, ripple carry adder, kogge stone adder

I INTRODUCTION

The least mean square (LMS) adaptive filter is the most famous and most generally utilized adaptive filter, in view of its simplicity as well as in view of its satisfactory convergence performance. The direct-form LMS adaptive filter includes a long critical path because of an inner-product computation to acquire the filter output. The critical path is required to be diminished by pipelined implementation when it transcend the desired sample period. Since the normal LMS algorithm does not bolster pipelined usage on account of its recursive direct, it is changed as per a form called the delayed LMS (DLMS) algorithm, which allow pipelined usage of the filter.

A great deal of work has been done to implement the DLMS algorithm in systolic designs to increases the maximum usable frequency in any case, they include an adaptation delay of ~N cycles for filter length N, which is high for extensive order filter. Since the convergence performance reduces significantly for a large order delay. A transpose-form LMS adaptive filter is recommended in High speed FPGA-based implementations of delayed LMS filters, where the filter output at any moment depends on the delayed version of weights and the number of delays in An effective systolic architecture for the DLMS adaptive filter and its applications weights change from 1 to N. Van and Feng have proposed systolic architecture, where they have utilized generally large processing elements (PEs) for accomplishing a lower adaptation delay with the critical path of one MAC operation.

Ting et al. have proposed a fine-grained pipelined design to constrain the critical path to the maximum of one addition time, which support high sampling frequency, however includes a considerable measure of area overhead to pipelining furthermore, higher power utilization than in , because of its huge number of pipeline latches. Further exertion has been made by Meherand Maheshwari to diminish the number of adaptation delays. Meher and Park have proposed a 2-bit multiplication cell, and utilized that with a capable adder tree for pipelined inner-product computation to keep the critical path

The current work on the DLMS adaptive filter having large influence the convergence performance, especially because of the recursive behavior of the LMS algorithm. Consequently, proposed design is observed to be moreproficient as far as the power-delay product (PDP) contrasted with the existing structures.

In Section II, we survey the DLMS algorithm, and in Section III, we describe the proposed optimized architecture for its usage. Section IV discuss simulation studies of the convergence of the algorithm. In Section V, we consider the synthesis of the proposed architecture and comparison with the existingarchitectures. Conclusions are given in Section V

II. REVIEW OF DELAYED LMS ALGORITHM

The weights of LMS adaptive filter throughout the nth iteration are updated by the accompanying conditions [2]:

 $W_{n+1}=w_n+\mu \cdot e_n \cdot x_n(1a)$ Where $e_n = d_n - y_n$ and $y_n = w_n^T \cdot x_n(1b)$

where the input vector x_n , and the weight vector w_n at the nth iteration are, separately, given by

$$\mathbf{x}_{n} = [\mathbf{x}_{n}, \mathbf{x}_{n-1}, \dots, \mathbf{x}_{n-N+1}]^{T}$$

 $\mathbf{w}_{n} = [\mathbf{w}_{n}(0), \mathbf{w}_{n}(1), \dots, \mathbf{w}_{n}(N-1)]^{T}$

 d_n is the desired response, y_n is the filter output, and e_n indicates the error computed amid the nth iteration. μ is the step size, and N is the number of weights utilized as a part of the LMS adaptive filter. On account of pipelined design with m pipeline stages, the error e_n winds up plainly accessible after m cycles, where m is known as the "adaptation delay." The DLMS algorithm consequently utilizes the delayed error en-m, i.e., the error relating to (n - m)th iteration for updating the present weight rather than the current most error. The weight-update condition of DLMS adaptive filter is given by

$$\mathbf{w}_{n+1} = \mathbf{w}_n + \boldsymbol{\mu} \cdot \mathbf{e}_{n-m} \cdot \mathbf{x}_{n-m}. \tag{2}$$

The block diagram of the DLMS adaptive filter is appeared in Fig. 1, where the adaptation delay of m cycles adds up to the delay presented by the entire of adaptation filter structure comprising of finite impulse response (FIR) filtering and the weight-update process. It is appeared in that the adaptation

delay of traditional LMS can be decomposed into two parts: one part is the delay presented by the pipeline stages in FIR filtering, and the other part is because of the delay associated with pipelining the weight updated process. In light ofsuch decomposition of delay, the DLMS adaptation delay can be actualized decomposition of delay, the DLMS adaptation delay can be actualized by a structure appeared in Fig. 2.Expecting that the delay of computation



1. Construction of the conventional delayed LMS adaptive filter.



Fig. 2.Construction of the modifieddelayed LMS adaptive filter.

of error is n_1 cycles, the error figured by the structure at the nth cycle is e_{n-n_1} , which is utilized with the input samples delayed by n_1 cycles to produce the weight-increase term. The weight-update condition of the modified DLMS algorithm is given by $w_{n+1} = w_n + \mu \cdot e_{n-n_1} \cdot x_{n-n_1}$ (2a)

where

$$e_{n-n1} = d_{n-n1} - y_{n-n1}$$
 (2b)

also,

$$\mathbf{y}_{n} = \mathbf{w}_{n-n2}^{\mathrm{T}} \cdot \mathbf{x}_{n} \tag{2c}$$

We notice that, throughout the weight update, the error with n_1 delays is utilized, while the filtering unit utilizes the weights delayed by cycles. The modified DLMS algorithm decouples calculations of the error-computation and the weight-update block and enablesus to perform ideal pipelining by feed forward cut-set retiming of both these areas independently to limit the number of pipeline stages and adaptation delay. The adaptation filter with various n_1 and n_2 are simulated for a system distinguishing proof issue.

III. PROPOSED ARCHITECTURE

As appeared in Fig. 2, there are two fundamental main blocks in the adaptive filter design: 1) the error computation block and 2) weight update block

In this Section, we talk about the design procedure of the proposed structure to limit the adaptation delay in the error computation block, come after by the weight-update block

A. Pipelined Structure of the Error-Computation Block

The proposed structure for error-computation unit of an N-tap DLMS adaptive filter is appeared in Fig. 3. It comprises of N number of 2-b partial product generators (PPG) comparing to N multipliers and a group of L/2 binary addertrees, come after by a single shift-add tree. Each sub block is portrayed in detail

1) **Structure of PPG**: The structure of each PPG is appeared in Fig. 4. It comprises of L/2 number of 2-to-3 decoders and a similar number of AND/OR cells (AOC).1 Each of the 2-to-3 decoders takes a 2-b digit (u_1u_0) as input and produces three output $b_0 = u_0 \cdot \bar{u}_1$, $b_1 = \bar{u}_0 \cdot u_1$, and $b_2 = u_0 \cdot u_1$, to such an extent that $b_0 = 1$ for $(u_1u_0) = 1$, $b_1 = 1$ for $(u_1u_0) = 2$, and $b_2 = 1$ for $(u_1u_0) = 3$. The decoder output b_0 , b_1 and b_2 alongside w, 2w, and 3w are sustained to an AOC, where w, 2w, and 3w are in 2's complement representation and sign-reached out to have (W + 2) bits each. To take care of the indication of the input samples while figuring the partial product be consistent with the most significant digit (MSD), i.e., $(u_{L-1}u_{L-2})$ of the input sample, the AOC (L/2 - 1) is sustained with w, -2w, and -w as input since $(u_{L-1}u_{L-2})$ can have four conceivable values 0, 1, -2, and -1.

2) Structure of AOCs: The structure and function of an AOC are represented in Fig. 6. Each AOC comprises of three AND cells and two OR cells. The structure and function of AND cells and OR cells are represented by Fig. 5(b) and (c), individually. Each AND cell takes an n-bit input D and a single bit input b, and comprises of n AND doors. It disperses all the n bits of input D to its n AND gates as one of the inputs. The other input all the n AND gates are encouraged with the single-bit input b. As appeared in Fig. 5(c), each OR cell likewise takes a couple of n-bit input words and has n OR gates. A couple of bits in a similar piece position in B and D is bolstered to the same OR gates. The output of an AOC is w, 2w, and 3w comparing to the decimal values 1, 2, and 3 of the 2-b input (u_1u_0) , individually. The decoder alongside the AOC performs a multiplication of input operand w with a 2-b digit (u_1u_0) , to such an extent that the PPG of Fig. 5 performs L/2 parallel multiplication of input word w with a 2-b digit to create L/2 partial product of the product word wu.

3) Structure of Adder Tree: Based on, we need have performed the shift-add operation on the partial products of each PPG independently to get the product value and after that included all the N product values to figure the desired inner product. Although, the shift-add operation to acquire the product value expands the word length and subsequently increments the adder size of N - 1 additions of the product values.

To keep away from such increment in word size of the adders, we include all the N partial products of a similar place an incentive from all the N PPGs by one adder tree. All the L/2 partial products created by each of the N PPGs are therefore included by (L/2) binary adder trees. The output of the L/2



Fig:3 Proposed structure of the error computation block



Fig: 4 Proposed structure of the PPG. AOC remains for AND/OR

Adder trees are then included by a shift-add tree as indicated by their place values. Each of the binary adder trees require $\log_2 N$ stages of adders to include N partial products, and the shift-add tree requires $\log_2 L - 1$ stages of adders to include L/2 output of L/2 binary adder trees.

The addition scheme for the error-computation block for a four-tap filter and input word size L = 8 is appeared in Fig. 8. For N = 4 and L = 8, the adder network requires four binary adder trees of two stages each and a two-stage shiftadd tree. In this figure, we have demonstrated all conceivable locations of pipeline latches by dashed lines, to diminish the critical path to one addition time. The last adder in the shiftadd tree add to the maximum delay to the critical path. Based on that perception, we have recognized the pipeline latches that don't contribute fundamentally to the critical path and would bar those with no observable increment of the critical path. The location of pipeline latches for filter lengths N = 8, 16, and 32 and for input size L = 8. The pipelining is performed by a feed forward cut-set retiming of the error computation block.

3A.Structure of adder: The proposed structure for adder tree and shift-add tree both are utilizing adder. In that adder place we are placing Ripple carry adder and Kogge stone adders. Kogge stone adder has high performance and lower delay compared with Ripple carry adder. The Kogge Stone adder is a parallel prefix frame carry look-ahead adder.



Fig. 5. Structure and function of AND/OR cell. Binary operators .and + in (b) and (c) are implemented utilizing AND as well as OR gates, separately.

the delay input samples xi come after by the addition with the comparing old weight values w_i . All the N multiplications for the MAC operations are performed by N PPGs, come after by N shift add trees. Each of the PPGs produces L/2 partial product relating to the product of the as of late shifted error value $\mu \times e$ with L/2, the number of 2-b digits of the input word xi , where the sub expression $3\mu \times e$ is shared within the multiplier. Since the scaled mistake ($\mu \times e$) is multiplied with all the N delayed input values in the weight-update block, this sub expression can be shared over every one of the multipliers also. The last output of MAC units constitute the desired updated weights to be utilized as inputs to the error-computation block as well as the weight-updated block for the following iteration.

C. Adaptation Delay

As appeared in Fig. 2, the adaptation delay is divided into n_1 and n_2 . The error-computation block produces the delayed error by n_1 -1 cycles as appeared in Fig. 4, which is boost to the weight-updated block appeared in Fig. 9 in the wake of scaling by μ ; at that point the input is delayed by 1 cycle before the PPG to make the total delay presented by FIR filtering be n_1 .



Fig 6: 8bit ripple carry adder



Fig 7: kogge stone parallel prefix adder

B. Pipelined Structure of the Weight-Update Block

The proposed structure for the weight-update block is appeared in Fig.9. It performs N multiply- accumulate operations of the form $(\mu \times e) \times x_i + w_i$ to update N filter weights. The step size μ is taken as a negative power of 2 to understand the multiplication with as of late accessible error just by a shift operation. Each of the MAC units in this way performs the multiplication of the shifted value of error with

In Fig.9, the weight-updated block produce w_{n-1-n^2} , and the weights are delayed by n_2+1 cycles. Although, it should be this prompts significant reduction of the adder complexity. noticed that the delay by 1 cycle is because of the latch before the PPG, which is involved into the delay of the error computation block, i.e., n_1 . Consequently, the delay produced in the weight updated block moves toward becoming n_2 . In the event that the location of pipeline latches are chosen as inTable I, n_1 moves

IV. SIMULATION RESULTS

toward becoming 5, where three latches are in the error computation block, one latches is after the subtraction in Fig. 3, and the other latch is before PPG in Fig. 9. Additionally, n_2 is set to 1 from a latch in the shiftadd tree in the weight-updated block.

The proposed designs were also implemented on the field programmable gate array (FPGA) platform of Xilinx devices. The number of slices (NOS) and the maximum usable frequency (MUF) using two different devices of Spartan-3A (XC3SD1800A-4FG676) and Virtex-4 (XC4VSX35-10FF668)



Fig. 8. Adder construction of the filtering unit for N = 4 and L = 8.



Fig: 9. Proposed structure of the weight-updated block

TABLE I

LOCATION PIPELINE LATCHES FOR L=8

	Error-Comp	outation Block	Weight-Update Block		
Ν	Adder Tree	Shift-add tree	Shift-add tree		
8	Stage-2	Stage-1 and 2	Stage-1		

are listed in Table II. The proposed design-II, after the pruning, offers nearly 11.86% less slice-delay product, which is calculated as the average NOS/MUF, for N = 8, 16, 32, and two devices.

Na	me	Value	1,999,995 ps	1,999,996 ps	1,999,997 ps	1,999,998 ps	1,999,999 ps	ŀ
▶	u[7:0]	10101010			10101010			T
-	w[7:0]	01010101			01010101			1
▶ .	W1[9:0]	001010101			0010101010			1
-	W2[9:0]	001010101			0010101010			1
-	😸 W3[9:0]	001010101			0010101010			1
-	W4[9:0]	111010101			1110101011			ł
٦	ь ьо	0	 					ľ
٦	ы Ы	1						1
٦	b2	0	 					4
٦	ь 601	0	 					4
٦	ь ь11	1						1
٦	b21	0	 					4
٦	b02	0	 					4
٦	b12	1						1
٦	b22	0	 					4
٦	b03	0	 					4
٦	b13	1						1
٦	b23	0	 					4
▶ !	w1[9:0]	000101010			0001010101			1
▶ !	w2[9:0]	001010101			0010101010			1
▶ .	w3[9:0]	001111111			0011111111			1
▶ .	w11[9:0]	111010101			1110101011			1
-	10-9151w	110101011	 1		1101010110		1	1

Simulation waveform:1 for PPG structure

Name	Value		3,351,500 ps	3,352,000 ps	3,352,500 ps	3,353,000 ps	3,353,500 ps	3,354,000 ps	3,354,500 ps	3,355,000 ps	3,355,500 ps	3,356,000 ps
▶ <table-of-contents> x[7:0]</table-of-contents>	10101010						1010	1010				
lin cik	0	JUUL	hunun	hunu	mm	·····		hunu	hhhh	hunu	h	huuu
la rst	0											
▶ <table-of-contents> d[7:0]</table-of-contents>	10101111						1010	1111				
▶ <table-of-contents> w1[7:0]</table-of-contents>	10101000						1010	1000				
▶ <table-of-contents> w2[7:0]</table-of-contents>	10101011						1010	1011				
▶ <table-of-contents> w3[7:0]</table-of-contents>	11010101						1101	0101				
▶ 👫 w4[7:0]	10101011						1010	1011				
▶ 🎽 e[7:0]	00101011						0010	1011		<u> </u>		
▶ 駴 ×1[7:0]	10101010						1010	1010		PG.		
▶ 😻 ×2[7:0]	10101010						1010	1010				
▶ 😻 ×3[7:0]	10101010						1010	1010				
▶ 😻 p00(9:0)	010101000						01010	10000				
▶ 😻 p01[9:0]	010101000						01010	10000				
▶ 🍀 p02[9:0]	010101000						01010	10000				
▶ 😻 p03(9:0)	110101100						11010	11000				
▶ 💐 p10(9:0)	010101011						01010	10110				
p11[9:0]	010101011						01010	10110				
▶ 饕 p12[9:0]	010101011						01010	10110				
▶ 😻 p13(9:0)	110101010						11010	10101				
▶ 🌿 p20(9:0)	011010101						01101	01010				
p21[9:0]	011010101						011010	01010				
▶ 10 n22(9-01	811818181						011010	01010				

Simulation waveform:2 for Error-Computation Block structure

Name	Value	2,915,800 ps	2,915,900 ps	2,916,000 ps	2,916,100 ps	2,916,200 ps	,916,300 ps	2,916,400 ps	2,916,500 ps	2,916,600 ps	2,916,700 ps	2,916,800 ps
▶ <table-of-contents> x[7:0]</table-of-contents>	10101010						10101010					
la cik	1											
gi rst	0											
▶ 🎽 e[7:0]	10001000						10001000					
▶ 🎽 w1[7:0]	11101110	01100010	01111110	10011010	10110110	11010010	11101110	00001010	00100110	01000010	01011110	01111010
▶ 🎽 w2[7:0]	11111100	01110000	10001100	10101000	11000100	11100000	11111100	00011000	00110100	01010000	01101100	10001000
▶ 幡 w3[7:0]	11100000	01010100	01110000	10001100	10101000	11000100	11100000	11111100	00011000	00110100	01010000	01101100
▶ 幡 w4[7:0]	00001110	10000100	00000110	10001000	00001010	10001100	00001110	10010000	00010010	10010100	00010110	10011000
▶ 🍀 e1[7:0]	10001000						10001000					
▶ 🦬 e11[7:0]	00010000						00010000					
▶ 🥵 e12[7:0]	10011000						10011000					
▶ 👹 e13[7:0]	10011000						10011000					
▶ 🦉 e14[7:0]	01111000						01111000		N			
▶ 🦉 e15(7:0)	01111000						01111000		16			
▶ 👹 e16[7:0]	11110000						11110000					
▶ 😻 x1[7:0]	10101010						10101010					
▶ 👹 x2[7:0]	10101010						10101010					
▶ 😻 x3(7:0]	10101010						10101010					
▶ 駴 x4[7:0]	10101010						10101010					
▶ 100(9:0) ►	010011006						0100110000	1				
r01(9:0)	010011006						0100110000	1				
r02(9:0)	010011000						0100110000	1				
► M +03(9-01	118118168						1101101000					

Simulation waveform:3 for Weight-Updated Block structure

Name	Value	1	2,001,000 ps	2,001,100 ps	2,00	L,200 ps	2,001,300 ps	2,001,400 ps	2,001,500 ps	2,001,600 ps	2,001,700 ps	2,001,800 ps	2,001,900 ps	2,002,000 ps
▶ 臂 x[7:0]	10101010								10101010					
▶ <table-of-contents> d[7:0]</table-of-contents>	10010110								10010110					
l <mark>e</mark> clk	1													
P rst	θ	4												
▶ <table-of-contents> y[7:0]</table-of-contents>	11101011	D	11111001	11110010		1101011	11100100	11011101	11010110	11001111	11001000	01000110	11000100	01000010
▶ 👹 x1[7:0]	10101010								10101010					
🕨 👹 e[7:0]	11116001		10010110	10111101		1110001	01000111	01011011	10010001	11000101	00101111	01111111	11101111	01011101
▶ 👯 e1[7:0]	10810110						10010110					1111	0001	
▶ 👯 w1[7:0]	01111011	D	00100111	11010001		1111011	00100101	11001111	01111001	00100011	11001101	10011000	10011110	10100100
▶ 👯 w2[7:0]	01111011	D	00100111	11010001		1111011	00100101	11001111	01111001	00100011	11001101	10011000	10011110	10100100
▶ 🍕 w3[7:0]	01111011	D	00100111	11010001		1111011	00100101	11001111	01111001	00100011	11001101	10011000	10011110	10100100
▶ 👯 w4[7:0]	11101011	D	11111001	11110010		1101011	11100100	11011101	11010110	11001111	11001000	01000110	11000100	01000010
▶ 💐 w4[7:0]	11101011	P	11111001	11110010	<u> </u>	1101011	11100100	11011101	11010110	11001111	11001000	01000110	11000100	01000010

Simulation waveform :4 for Adaptive filter using ripple carry adder

			2,001,113 ps					
Name	Value	<u> </u>	2,001,100 ps	2,001,200 ps	2,001,300 ps	2,001,400 ps	2,001,500 ps	2,001
▶ 📑 x[7:0]	10101010			· 1	0101010			
🕨 🃑 d[7:0]	10010110			1	0010110			
🔓 clk	1							
🔓 rst	0							<u> </u>
🕨 幡 y[7:0]	11110010	11111001	11110010	11101011	11100100	11011101	11010110	1
▶ 🍢 ×1[7:0]	10101010			1	0101010			
▶ 🎆 e1[7:0]	10010110			1	0010110			
🕨 🎆 e[7:0]	10111101	10010110	10111101	11110001	01000111	01011011	10010001	1
▶ 🎆 w1[7:0]	11010001	00100111	11010001	01111011	00100101	11001111	01111001	0
▶ 🎆 w2[7:0]	11010001	00100111	11010001	01111011	00100101	11001111	01111001	0
▶ 🎆 w3[7:0]	11010001	00100111	11010001	01111011	00100101	11001111	01111001	0
▶ 🍀 w4[7:0]	11110010	11111001	11110010	11101011	11100100	11011101	11010110	1
		X1: 2,001,113 ps						

Simulation waveform :5 for Adaptive filter using kogge stone adder

TABLE II

FPGA IMPLEMENTATION OF PROPOSED DESIGNS FOR L=8 AND

	19-0	
	Ripple carry adder	Kogge stone adder
NOS LUTs	1809	1034
NOS Registers	116	102
Delay	8.200ns	5.706ns

NOS stands for the number of slices

V. Conclusion:

We present a delay-power effective low adaptation delay design of LMS adaptive filter. We utilized a novel PPG for effective design of general multiplication and inner product computation by regular sub expression sharing. In addition, we have proposed kogge stone adder structure for effective addition scheme for inner-product computation to reduce the adaptation delay and to reduce the critical path to help high input sampling rates. Beside this, we proposed a methodology for advanced balanced pipelining over the time consuming blocks of the structure to decrease the adaptation delay and power utilization, too. The proposed structure included the less adaptation delay comparing with the existing structures.

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