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II. SOME THEORETICAL ASPECTS

Consider a simple two-sensor model for estimating time delay, which is

$$x(k) = s(k) + n_1(k)$$

 $y(k) = s[k - D(k)] + n_2(k)$ (1)

where k is the time index; x(k) and y(k) denote the sensor outputs; s(k) is the source signal; $n_1(k)$ and $n_2(k)$ are zero mean, Gaussian and mutually uncorrelated random variables; and D(k) is the time-varying delay function related to the two sensors.

For time delay estimation applications, these two sensor outputs become the inputs to an adaptive time domain filter, as shown in Fig. 1. The time-varying delay function D(k) can be estimated by finding the location of the peak of the adaptive filter coefficient vector [4], i.e., the location of the peak value of the filter impulse response.

In practice the inputs are sampled. Thus the adaptive filter is discrete in time, and has finite length. Thus the peak of the impulse response at a given iteration is determined by interpolating between discrete—time sample points to provide the delay values which are non-integer multiples of the sampling rate [8]. Thus we have

$$h_{I}(n,k) = \sum_{m=-P_3}^{P_3} \hat{h}(m,k) \frac{\sin 2\pi\beta(n-m)}{2\pi\beta(n-m)}$$
 (2)

where β denotes normalized bandwidth of the signal and $h_{\hat{I}}(n,k)$ denotes the smoothed impulse response value corresponding to the estimated value $\hat{h}(m,k)$ at time n. For adaptive time-varying delay estimation, the location of the peak of $h_{\hat{I}}(n,k)$ yields $\hat{D}(k)$.

For simulation purposes we need the time-varying delay signal s[k-D(k)]. It has been shown that this can be obtained via a bank of

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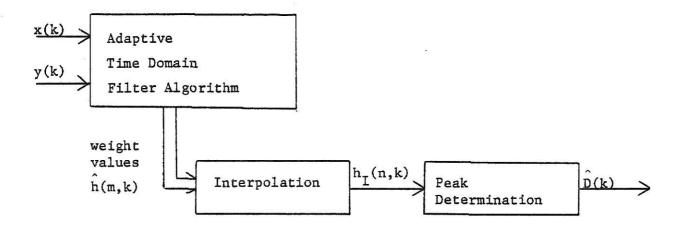


Fig. 1. A block diagram for adaptive time delay estimation.

time-invariant finite impulse response FIR filters, whose k-th filter has the transfer function [7]

$$H(\omega,k) = e^{-j\omega D(k)}$$
 (3)

where ω is the radian frequency with $|\omega|<\pi$. Using (3) and truncating the filter length, we obtain

$$s[k-D(k)] = \sum_{m=P_1}^{P_1} g(m,k) s(k-m)$$
 (4)

where $g(m,k) rianleq F^{-1} \{H(\omega,k)\} = sinc [m-D(k)], F^{-1} \{\cdot\}$ denotes the inverse Fourier transform, sinc $(\cdot) = \frac{sin\pi(\cdot)}{\pi(\cdot)}$, and $(2p_1 + 1)$ is the total number of coefficients g(m,k). Details of these interpolation and timevarying delayed signal are discussed in Appendix.

A. LMS Algorithm

Consider a two-element adaptive filter model which uses a tapped-delay-line structure to provide the adaptive weight adjustment, as shown in Fig. 2. If H(k) is the column vector of filter weights h(i,j), $R_{xx}(k)$ is the correlation matrix of input signals at time k, and $R_{xy}(k)$ is the cross correlation vector between the received reference signal x(k) and the primary signal y(k), then the optimum filter weight vector that minimizes the expected value of $e^2(k)$ in Fig. 2 is given by [1]

$$H(k) = R_{xx}^{-1}(k)R_{xy}(k)$$
 (5)

Where, $H^{T}(k) = [h(-p_2,k)...h(0,k)...h(p_2,k)].$

Thus H(k) is a $2p_2+1$ vector consisting of the filter weights at time k.

The error output, e(k) is then

$$e(k) = y(k) - HT(k)X(k)$$
(6)

where X(k) is input data vector given by

$$X^{T}(k) = [x(k) \ x(k-1)....x(k-2p_{2})]$$

The LMS algorithm which is an implementation of the steepest descent method [1] updates the weight vector at each k via the relation

$$H(k+1) = H(k) + \mu e(k)X(k)$$
 (7)

where μ is a parameter that controls the rate of convergence of the algorithm.

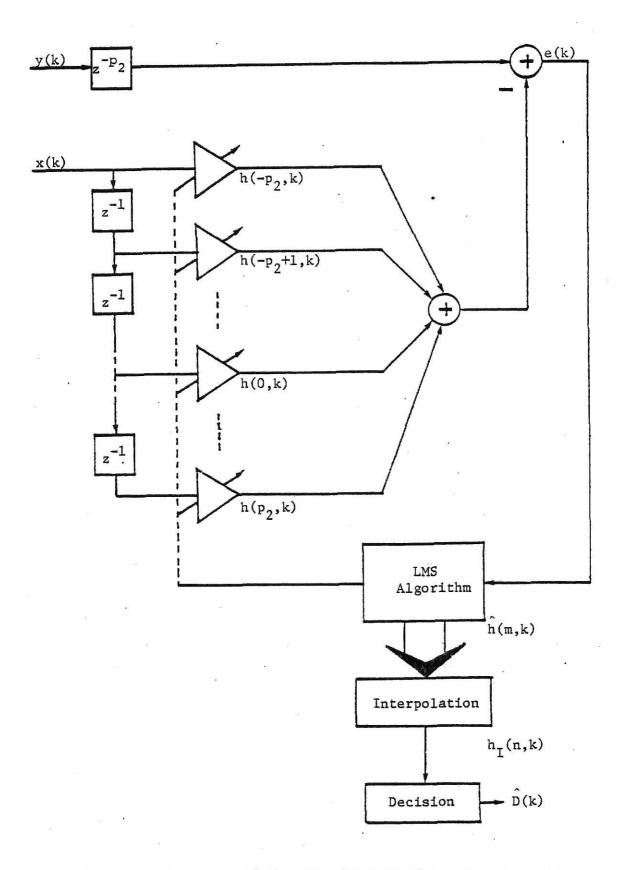


Fig. 2: Structure of the LMS algorithm for time delay estimation

B. ASC Algorithm

Consider the real-valued correlated data sequences x(k) and y(k), where k is the time index. The cross-correlation $R_{xy}(m)$ of x(k) and y(k) is

$$R_{xy}(m) = E[x(k) y(k-m)]$$

= $E[s(k) s(k+D-m)] + E[n_1(k)n_2(k-m)]$ (8)

where E denotes statistically expectation. Since $n_1(k)$ and $n_2(k)$ are independent and zero mean noise sequences, we can show that

$$R_{xy}(m) = R_{ss}(m-D)$$
.

The auto-correlation, R_{ss}, has the property that [10]

$$R_{ss}(0) \ge |R_{ss}(m)|$$
.

So R_{xy} will attain a maximum value at m=D.

If x(k) and y(k) are known only over a finite length of time, the estimation of R_{xy} (m) is [5, 10]

$$R_{xy}(m) = \frac{1}{N-m} \sum_{k=0}^{N-m} x(k) y(k+m) , |m| \le M$$
 (9)

where m is the shift index, R_{xy} (m) is the desired estimate, M is the maximum shift and N is the number of points in x(k) and y(k).

The basic idea is to estimate $R_{xy}(m,k)$ using the ASC algorithm which is defined as [5,11]

$$R_{xy}(m,k) = \beta R_{xy}(m,k-1) + (1-\beta) x(k) y(k-m)$$

$$= \beta [R_{xy}(m,k-1) - x(k) y(k-m)] + x(k)y(k-m) (10)$$

where $0 < \beta < 1$ is a smoothing parameter which determines the convergence rate.

The recursive equation in (10) can be modeled using the structure shown in Fig. 3. It consists of a bank of first-order infinite impulse

response (IIR) filters. From (10) we can obtain the transfer function which related x(k), y(k-m) and $R_{xy}(m,k)$ as

$$H(Z) = \frac{1-\beta}{1-\beta z^{-1}}$$

If the unit of time is considered to be the iteration cycle, the related time constant which represents the number of data samples require to attain its steady-state value for each k is given by [5]

$$\tau = \frac{1}{1-6}$$
 samples.

If x(k) and y(k) are jointly stationary Gaussian processes, the ASC algorithm is unbiased [5,10], i.e.,

$$\lim_{k \to \infty} E[\hat{R}_{xy}(k,m)] = R_{xy}(m). \tag{11a}$$

And it has been also shown that

$$\lim_{k \to \infty} \left\{ \sigma_{R_{xy}}^{2}(k, m) \right\} = \frac{1-\beta}{2} \left[\hat{R}_{xx}(0) \hat{R}_{yy}(0) + R_{xy}^{2}(m) \right]$$
 (11b)

From (11b) it is apparent that the related variance goes zero as β close to 1 [5].

The ASC algorithm can be used for time display estimation as depicted in Fig. 4. This is because the time delay function estimate D(k) can be easily determined from the peak value of the impulse response function $\hat{h}(m,k)$ [4].

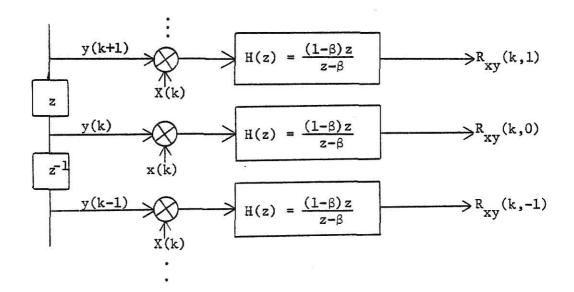


Fig. 3. Structure of the ASC algorithm

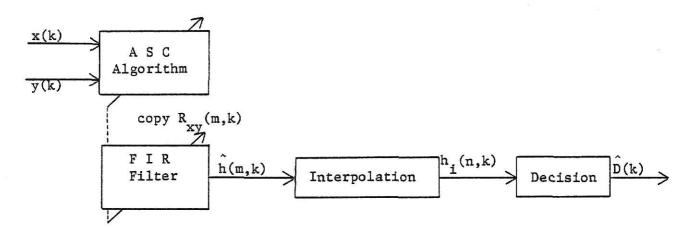


Fig. 4. Block diagram of the ASC algorithm for Time Delay Estimation.

III. SIMULATION DETAILS

The entire computer simulation considered the two sensor model in (1). The block diagram to generate the pertinent signals is depicted in Fig. 5, where $\mathbf{n}_0(\mathbf{k})$, $\mathbf{n}_1(\mathbf{k})$ and $\mathbf{n}_2(\mathbf{k})$ are mutually uncorrelated real white Gaussian noise sequences. The sampling frequency was 2048 samples per second (sps). Two of these sequences were used to represent the additive noises. The first noise sequence, $\mathbf{n}_0(\mathbf{k})$, was processed through a pair of tenth-order and second-order Butterworth digital filters to generate the low-passed and the band-passed source signals, respectively which had the following characteristics:

$$|H_1(f)| = \begin{cases} 1, & 0 \le f \le 100 \text{ Hz} \\ 0, & \text{elsewhere} \end{cases}$$

and

$$|H_2(f)| = \begin{cases} 1, & 100 \le f \le 200 \text{ Hz} \\ 0, & \text{elsewhere} \end{cases}$$

The noise sequences $n_1(k)$ and $n_2(k)$ were added to the resulting low-passed and band-passed signals which were used as input data sequences x(k) and y(k) after having been scaled to realize different signal-to-noise ratios (SNRs). In this simulation SNRs of -3dB, -10dB, and -13dB were considered. Note that the SNR is estimated as the ratio of the total power (variance when mean is zero) of the signal to that of the noise.

In Fig. 5, D(k) is the time-varying delay parameter which has a constant or a linearly varying value. A delayed signal s[k-D(k)] was generated using (4) by truncating the filter length to 61 (i.e., p_1 =30) to obtain

$$s[k-D(k)] = \sum_{m=-30}^{30} sinc[m-D(k)] s(k-m)$$
 (12)

The various parameters pertaining to the simulation are summarized in

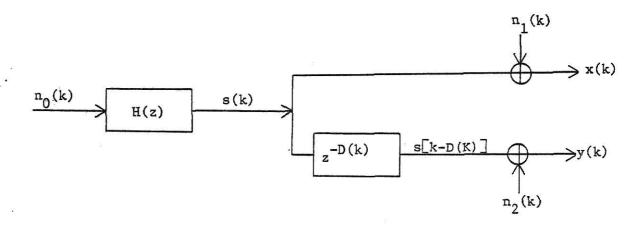


Fig. 5. Block diagram to generate signals

Table 1, where $(2p_1 + 1)$ is the number of filter weights for generating time-varying delayed signal in (4); $(2p_2 + 1)$ is the number of weights used for estimating time delay using the LMS and ASC algorithms; and $(2p_3 + 1)$ denotes the number of interpolation points to estimate the delay which is a non-integer multiple of sampling interval; see (2).

The input data sequences, x(k) and y(k), were processed using the LMS and ASC algorithms. A total of 24 trials were used in each case. Each trial employed 3.9 sec. (8000 data points) to estimate the time delay parameter, D(k), which had constant or a linearly varying value.

	Fixed Source					Moving Source						
Signal	Low Pass B			Ва	ind Pa	ss	Low Pass			Band Pass		
H(z)	10th order LPF f = 100Hz (cutoff frequency)		2nd order BPF f ₁ = 100Hz f _h = 200Hz		10th order LPF f = 100Hz			2nd order BPF f ₁ = 100Hz f _h = 200Hz				
D(k)	12			12			-4 + 0.001 k			-4 + 0.001 k		
(S/N)dB	-3	-10	-13	-3	-10	-13	-3	-10	-13	-3	-10	-13
$\sigma_{\mathbf{s}}^2$	0.5	0.1	0.05	0.5	0.1	0.05	0,5	0.1	0.05	0.5	0.1	0.05
$\sigma_{n_1}^2 = \sigma_{n_2}^2$	1	1	1	1	1	1	1	1	1	1	1	1
β = 1 - μ	0.9999			0.9999		0.999			0.999			
2p ₁ + 1		00	Ÿ		∞		Market	61		, n	61	
2p ₂ + 1	61			61		21		21				
2p ₃ + 1	10			10		5		5				

Table 1. Parameters pertaining to the simulation.

IV. SIMULATION RESULTS

A. Fixed Source

Here the time delay function D(k) = 12. A total of 8000 data points were used, and the related parameters that were used are listed in Table 1. The means and variances associated with the delay estimates were obtained using 24 trials from 100 resulting measurements of each trial as follows:

$$\overline{D}_{i} = \frac{1}{100} \sum_{k=1}^{100} \hat{D}_{i}$$
 (50k + 3001)

and

$$\sigma_{\overline{D}_{i}}^{2} = \frac{1}{100} \sum_{k=1}^{100} \left[\hat{D}_{i} \left(50k + 3001 \right) - \overline{D}_{i} \right]^{2}$$
 (13)

for the i-th trial, with

$$\overline{D} = \frac{1}{24} \sum_{i=1}^{24} \overline{D}_i$$

and

$$\sigma_{\overline{D}}^2 = \frac{1}{24} \sum_{i=1}^{24} (\overline{D}_i - \overline{D})^2$$
 (14)

where $\hat{D}_{\mathbf{i}}(k)$ denotes the estimated time delay at k-th iteration of the i-th trial. The corresponding results are summarized in Table 2.

Examination of Table 2 reveals that the mean values of the delay estimates compare very closely for the LMS and ASC algorithms for low-pass and band-pass cases, at each of the three SNRs. However, we observe that the variance of the delay estimate is substantially less for the ASC method, especially for band-pass signals.

SIGNAL		LOW PASS		BAND PASS			
SNR	-3dB	-10dB	-13dB	-3dB	-10dB	-13dB	
MEAN	LMS 11.9691	11.9349	11.8743	12.0255	12.0414	11.8744	
MEAN	ASC 11.9528	11.9060	11.8601	12.0074	12.0092	12.0226	
VARIANCE	LMS 0.07629	0.26559	0.69601	0.01249	0.03147	2.70762	
VARIANCE	ASC 0.02804	0.18045	0.50993	0.00368	0.01795	0.13169	

Table 2. Simulation results for fixed source.

B. Moving Source

Linearly-varying time delay function $D(k) = -4 + 0.001 \, k$. The time delay function D(k) was increased linearly from -4 to 3.8 over 8000 data points. Other parameters used for the simulation are listed in Table 1. The desired delay estimate is given by the value of lag which yields the peak value of the impulse response $\hat{h}(m,k)$; see Fig. 1. This aspect is illustrated in Fig. 6 which shows the impulse response function $\hat{h}(m,k)$ and its smoothed function $h_{I}(n,k)$ by interpolation at 3000, 5000 and 7000 iterations at a SNR of -3dB and a delay function varying at a 0.001 unit/iteration. It is instructive to observe that the peak values of the impulse response functions adapt well with time.

The time-varying delay function D(k) was estimated every 50 sample points from k=3001 to k=8000 for 24 trials. The bias which denotes the time difference between true delay and estimated delay was considered. The bias increases with increases in the changes of D(k), and decreases as the smoothing parameter β is decreased [9]. The bias and its variance were computed as follows:

$$\overline{B}_{i} = \frac{1}{100} \sum_{k=1}^{100} (D(50k + 3001) - \hat{D}_{i}(50k + 3001))$$

for i-th trial, with

$$\overline{B} = \frac{1}{24} \sum_{i=1}^{24} \overline{B}_i$$

$$\sigma_{\overline{B}} = \frac{1}{24} \sum_{i=1}^{24} (\overline{B}_i - \overline{B})^2$$

where D(k) and $\hat{D}_{i}(k)$ denote true and estimated delay, respectively. The results for the case of SNR -3, -10, and -13db are summarized in Table 3.

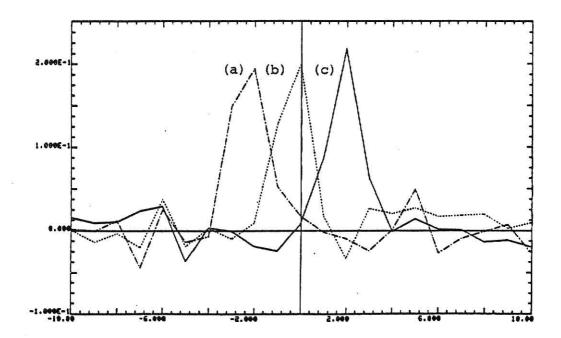


Fig. 6-1. $\hat{h}(m,k)$ without interpolation with 61 weights; (a) k=3000, (b) k=5000, and (c) k=7000.

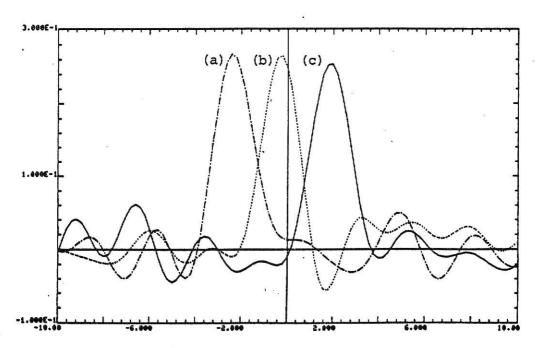


Fig. 6-2. $h_I(n,k)$ with 5 point interpolation with 61 weights; (a) k=3000, (b) k=5000, and (c) k=7000.

From Table 3, it is apparent that the LMS method is a smaller bias for the delay estimate, especially at -3dB. This difference in bias becomes less significant as the SNR is decreased further. On the other hand, the ASC method yields a variance (of the delay estimate) that is consistently better than that obtained via the LMS method.

SIGNAL		LOW PASS	BAND PASS			
SNR	-3dB	-10dB	-13dB	-3dB	-10dB	13dB
BIAS	LMS -0.3234	-0.6159	-0.8266	-0.3041	-0.5623	-0.7762
DIAS .	ASC -0.9557	-0.9946	-1.0428	-0.8826	-0.8875	-0.9074
VARIANCE	LMS 0.24094	0.82397	2.14786	0.04479	0.13826	1.40289
VARIANCE	ASC 0.08923	0.47559	1.51040	0.02188	0.08932	0.49422

Table 3. Simulation results for moving source.

V. CONCLUSIONS

We have compared two adaptive methods for estimating time delay functions between a pair of sensor outputs. The ASC algorithm was found to significantly reduce the variance of delay estimate and the computation time for all the cases that were considered. It is straight foreward to determine the total number of arithmetic operations (multiplications and additions) required by LMS and ASC algorithms are 6N and 4N, respectively, at every iteration, where N is the number of weights. Also, the ASC algorithm gave better results for the fixed source case when the signals were band-passed. However, when the source is moving, the bias between the actual and estimated time delays is more than for the LMS algorithm. The main advantages of the ASC algorithm are its computational simplicity and the fact that it consistently yields time delay estimates which have a smaller variance.

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APPENDIX

A. A Method for Interpolation [A1, A2]

Restriction on the sample spacing arises if we want to reconstruct the continuous signal x(t) for all time t from its sampled value x(kT_S) for k = 0, 1, 2... Discrete signals which vary slowly enough as functions of the time can be reconstructed uniquely from their samples taken at intervals of T_S. The sampling theorem states that x(t) can be reconstructed precisely for all t is the sampling rate is f_S = $\frac{1}{T_S}$ is at least twice the signal bandwidth B. Such signals are said to be bandlimited to B Hz which is less than $\frac{1}{2T}$.

The continuous signal x(t) can be obtained by passing its sampled values $x(kT_s)$ through an ideal low-pass filter whose bandwidth is B Hz. A general formula for the interpolated signal can be derived by carrying out the operation depicted in Fig. A-1 where $\bar{x}(t)$ denotes the <u>sampled</u> signal corresponding to the sampled values $x(kT_s)$ -- i.e., [A1]

$$\overline{x}(t) = \sum_{m=-\infty}^{\infty} x(mT_s) \delta(t - mT_s)$$
(A.1)

where $\delta(t)$ denotes the impulse function.

If $H(\omega)$ is the transfer function of the ideal filter, then

$$\hat{X}(\omega) = H(\omega)\bar{X}(\omega) \tag{A.2}$$

where $\bar{X}(\omega)$ denotes the Fourier transform of $\bar{x}(t)$.

In the time domain, $\hat{x}(t)$ is given by

$$\hat{x}(t) = \int_{-\infty}^{\infty} h(a)\overline{x}(t-a) da$$
 (A.3)

where

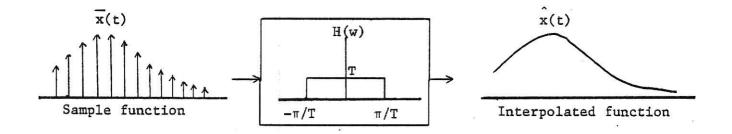


Fig. A-1. An interpolation scheme

$$h(t) = F^{-1}\{H(\omega)\}$$

$$= \int_{-\infty}^{\infty} H(\omega) e^{j\omega t} d\left(\frac{\omega}{2\pi}\right)$$

$$= \frac{T}{2\pi} \int_{-\pi/T}^{\pi/T} e^{j\omega t} d\omega$$

$$= \frac{\sin\left(\frac{\pi t}{T}\right)}{\left(\frac{\pi t}{T}\right)}$$
(A.4)

Using (A.1) and (A.4) we can obtain

$$\hat{\mathbf{x}}(t) = \int_{-\infty}^{\infty} \mathbf{h}(\mathbf{a}) \sum_{\mathbf{m}=-\infty}^{\infty} \mathbf{x}(\mathbf{m}) \, \delta(t - \mathbf{a} - \mathbf{m}T_{\mathbf{S}}) \, d\mathbf{a}$$

$$= \sum_{\mathbf{m}=-\infty}^{\infty} \mathbf{x}(\mathbf{m}T_{\mathbf{S}}) \, \mathbf{h}(t - \mathbf{m}T_{\mathbf{S}})$$

$$= \sum_{\mathbf{m}=-\infty}^{\infty} \mathbf{x}(\mathbf{m}T_{\mathbf{S}}) \, \frac{\sin \pi(t - \mathbf{m}T_{\mathbf{S}})/T}{\pi(t - \mathbf{m}T_{\mathbf{S}})/T}$$
(A.5)

which is the desired result.

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B, A Method for Generating Time-Delayed Signal [B1, B2]

Consider the signal s(k) and its constant delayed version s(k-D). We can obtain s(k-D) by passing s(k) through a time-invariant filter whose transfer function is $H(\omega)$ as

$$F\{s(k-D)\} = S(\omega)H(\omega)$$
 (B.1)

where F{ \cdot } denotes the Fourier transform, and w is the radian frequency with $|\omega| < \pi$.

The time shift property of Fourier transfer states that

$$F\{s(k-D)\} = s(\omega)e^{-j\omega D}$$
 (B.2)

Thus (B.1) and (B.2) yield

$$H(\omega) = e^{-j\omega D}$$
 (B.3)

which implies that the impulse response function of $H(\boldsymbol{\omega})$ is

$$h(k) = F^{-1}\{H(\omega)\}$$

$$= F^{-1}\{e^{-j\omega D}\}$$

$$= sinc (k - D), |k| < \infty$$
(B.4)

where

$$\operatorname{sinc}(\cdot) \triangleq \frac{\sin \pi(\cdot)}{\pi(\cdot)}$$
.

Thus, s(k-D) can be obtained by the filter which has infinite number of weights as

$$s(k - D) = \sum_{m=-\infty}^{\infty} sinc(m - D) s(k - m)$$
 (B.5)

However, in a practical situation the filter length has to be finite. Since the function s(m-D) in (B.5) approaches zero as |m| increases, truncation can be carried out to obtain

$$\hat{s}(k-D) = \sum_{m=-P}^{P} sinc(m-D) s(k-m)$$
 (B.6)

Now considering the case when the delay function is time-varying. The the desired delayed signal can be obtained via a bank of time-invariant filters as shown in Fig. B-1. If the time-varying delay function is D(k), then the n-th filter has the transfer function

$$H(\omega,n) = e^{-j\omega D(n)}$$
.

From (B.5) we have

$$s[k - D(n)] = \sum_{m=-\infty}^{\infty} h(m,n) s(k - m)$$

$$= \sum_{m=-\infty}^{\infty} sinc[m - D(n)] s(k - m)$$
(B.7)

The desired delay signal is obtained by sampled values of s[k - D(n)] at k = n for $|n| < \infty$; see Fig. B-1.

Substituting n=k in (B.7) and using finite filter weights, we obtain

$$\hat{s}[k - D(k)] = \sum_{m=-P}^{P} sinc(m - D(k)) s(k - m)$$
 (B.8)

From (B.8), sinc(m - D(k)), |m| < p can be interpreted as a weighting function whose maximum value occurs at m = D(k).

Therefore $\hat{s}[k-D(k)]$ in (B.8) can be viewed as being the output of the time-varying filter which is generating a time-varying delay signal. Details of this truncation process are discussed in [B2].

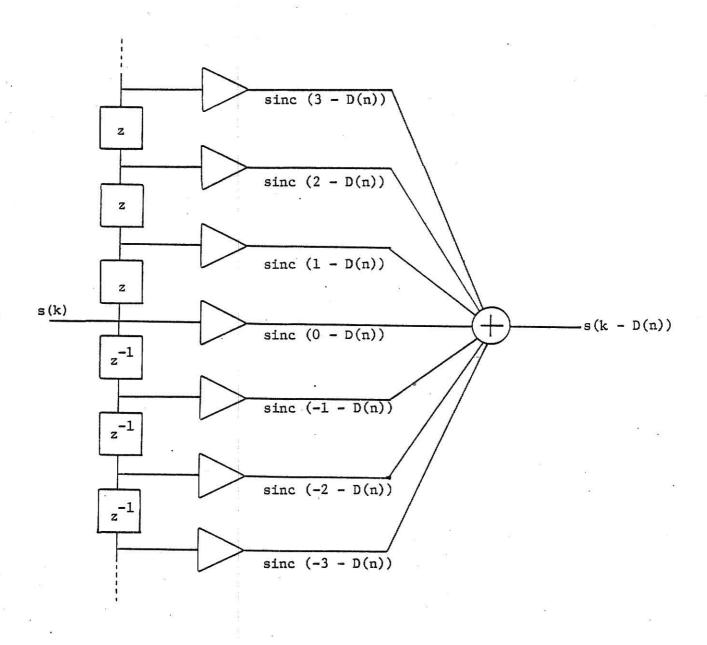


Fig. B-1. Structure for generating delayed signal when the delay is time varying.

REFERENCES

- [B1] D. Youn, N. Ahmed, and G. C. Carter, "A method for generating a class of time-delayed signals," in Proc. ICASSP, Atlanta, GA, Mar. 1981, pp. 1257-1260.
- [B2] D. Youn, N. Ahmed, and G. C. Carter, "On Using the LMS algorithm for time delay estimation," <u>IEEE Trans. Acoust., Speech and Signal Proc.</u>, Vol. ASSP-30, No. 5, pp. 788-801, Oct. 1982.

C. Computer Programs

- 1. Adaptive least mean square (LMS) filter routine
- 2. Adaptive short term correlator (ASC) filter routine
- 3. Time varying delay signal generator routine
- 4. Interpolation subroutine

LMSTDE.FR

5/ 3/1983 10:31:56 DIR \$PARK

Pase

1

C

C

C

C

C

C GENERAL ADAPTIVE LMS-WIDROW FILTER ROUTINE

LMSTDE.FR

PROGRAMMER

SOURCE FILE NAME

SANGIL PARK

DATE

PURPOSE

JUNE 25,1982

C

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C

THIS PROGRAM IMPLEMENTS THE WIDROW LMS ALGOLITHM FOR TIME DELAY ESTIMATION IN FILTER MODE, INTERPOLATES THE DISCRETE DATA, AND OBTAINS THE TRANSIENT MAXIMUM VALUES OF FILTER COEFFICIENTS OR DUMPS COEFFICIENT VALUE.

REFERENCE

WIDROW ET AL. FROC. IEEE, DEC. 1975

COEF(N+1)=COEF(N)+(ALPHA/VAR)*ER(N)*REF(N)

ROUTINES CALLED BY THIS PROGRAM

OPENW QUERY RESET INTPL.RB OPENW READR WRITR APPEND

DESCRIPTION OF I/O FILES

INPUT: PRIMARY INPUT FILE

REFERENCE INPUT FILE

OUTPUT: MAXIMUM VALUE OUTPUT FILE

COEFFICIENT OUTPUT FILE

```
LMSTDE.FR
```

C C

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Page
```

```
2
C
C
        COMMON /OPN/ IFILE(18), NAME(13)
        REAL COEF(256), PRI(-63:1088), REF(-255:512), EST(512), ERR(512)
        REAL RCOEF (1271), VALUE (512)
C
C
        PARAMETER NSIZE=512
                   RSIZE=FLOAT(NSIZE)
                   NBYTE=NSIZE*4
C
C
C
        ** READ IN PARAMETERS **
C
\mathbb{C}
. 1
        CALL QUERY("WANT COEFFICIENT EY3 OR MAX. VALUE [N=CR] ? = ",1QC)
        ACCEPT " ENTER THE START POINT = ",DP1
        ACCEPT " ENTER THE
                              INTERVAL = ",DP2
        ACCEPT "PRIMARY INPUT DELAY DISTANCE [-64:64] ? = ", IDELAY
        ACCEPT "# OF COEFFICIENT(WEIGHT) (1-255, ODD #)? = ",NCO
        ACCEPT "THE VALUE OF SMOOTHING PARAMETER: BETA ? = ",BETA
        CALL QUERY("FIXEDCY" OR TIME VARYINGEN=CRT VARIANCE? = ",IQV)
        VARIANCE=0.0
        IF (IQV,NE,1) GOTO 4
C
        ACCEPT "ENTER THE FIXED INPUT VARIANCE VALUE ? = ", VARIANCE
        GOTO 5
C
Д
        ACCEPT "ENTER MINIMUM INPUT VARIANCE VALUE:EPS ? = ",EPS
5
        ACCEPT *THE NUMBER
                             OF
                                   ITERATION (DATA) ? = ",DATA
C
        CALL QUERY("WANT INTERPOLATION(Y/N=CR) ? = ",IQIN)
        IF (IQIN.NE.1) GOTO 8
        ACCEPT " SAMPLING FREQUENCY ? =
                                                 " , SAMP
        ACCEPT * SIGNAL BAND-WIDTH T =
                                                 ",BAND
        ACCEPT " # OF INTPOL EACH INTERVAL ? = ", NINT
        BN=2.*BAND/SAMP
C
8
        ICENTER=(NCO-1)/2
        IBLK=IFIX(DATA/RSIZE)
        IRES=IFIX(DATA-FLOAT(IBLK)*RSIZE)
        ID=IDELAY+ICENTER
        NRECORD=NCO*4
        IF(IQIN, EQ.1) NRECORD=((NCD-1)*NINT+1)*4
C
15
        VAR=VARIANCE
C
C
C
        ** OPEN I/O FILES **
C
C
        CALL OPENR(1, "PRIMARY
                                 INPUT FILE NAME = ", NBYTE, SIZE1)
        CALL OPENR(2, "REFERENCE INPUT FILE NAME = ", NBYTE, SIZE2)
        IF(IQC.EQ.1) CALL OPENW(4, "COEFFS OUTPUT FILE NAME = ", NRECORD, SIZ
        IF(IQC.NE.1) CALL OPENW(3, "MAX VAL. OUTPUT FILE NAME = ", NBYTE, SIZE3
```

```
C
C
        ** MEMORY INITIALIZATION **
C
        DO 41 I=1,NSIZE
          PRI(-64+I)=0.
          FRI(I+64)=0.
          PRI(I+576)=0.
          REF(I)=0.
          EST(I)=0.
          ERR(I)=0.
          VALUE(I)=0.
41
        CONTINUE
C
        DO 42 I=1,256
          COEF(I)=0.
          REF(1-I)=0.
42
        CONTINUE
C
        N=1
        NN=1
        ALPHA=1.-BETA
        DF3=DF1
                         # MAX. VALUE DUMP COUNTER
        KOUNT=0
                         ; SYSTEM COUNTER
        COUNT=0.
        NCOUNT=0
                         # COEF. DUMP COUNTER
C
        TYFE
        TYPE " DATA = " , DATA
        TYPE " DELAY=", IDELAY
        TYPE " BETA = ", BETA
        TYPE
C
        IF (IBLK) 222,222,333
222
        CONTINUE
        LOOP=IRES
        GOTO 25
\mathbb{C}
333
        CONTINUE
        LOOP=NSIZE
C
25
        DO 26 I=0,NCO-1
          REF(-I)=REF(NSIZE-I)
26
        CONTINUE
        IF(ID.LE.O) GOTO 100
        DO 27 I=1, ID
          PRI(I)=PRI(NSIZE+I)
27
        CONTINUE
C
C
C
        *********
C
             MAIN PROGRAM
C
        ************
C
C
100
        CALL READR(1,N,PRI(ID+1),2,LCNT,TERR)
        CALL READR(2,N,REF(1),1,LONT, IERR)
C
```

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LMSTDE.FR
```

```
C
C
C
        ** MAIN LOOP *
C
C
        DO 1000 I=1,LOOF
C
          COUNT=COUNT+1.0
           EST(I)=0.
          DO 51 II=1, NCO
             EST(I)=EST(I)+COEF(II)*REF(I-II+1)
51
           CONTINUE
C
          ERR(I) = PRI(I) - EST(I)
C
C
C
           ** UPDATE FILTER COEFFICIENTS **
C
           IF (IQV,EQ,1) GOTO 55
           VAR=BETA*VAR+ALPHA*REF(I)*REF(I)
           IF (VAR.LE.EPS) VAR=EPS
C
55
           DO 44 II=1, NCO
             COEF(II)=COEF(II)+ALPHA*ERR(I)*REF(I-II+1)/VAR
44
           CONTINUE
C
           IF(COUNT.NE.DP3) GOTO 1000
          DP3=DP3+DP2
C
C
C
           * DUMP COEFFICIENT VALUE *
           IF(IQC.NE.1) GOTO 60
           NCOUNT=NCOUNT+1
           IF(IQIN, EQ, 1) GOTO 61
           CALL WRITR(4, NCOUNT, COEF, 1, IER)
           GOTO 1000
C
61
           CALL INTPL(COEF, RCOEF, BN, NINT, NCO)
           CALL WRITR(4, NCOUNT, RCOEF, 1, IER)
           GOTO 1000
C
C
C
           * DUMP MAX. VALUE *
C
60
           KOUNT=KOUNT+1
           IF (IQIN.EQ.1)
                           GOTO 70
           MAX=1
           FMAX=COEF(1)
           DO 65 I2=2,NCO
             IF(COEF(I2), LE, FMAX) GOTO 65
             MAX=I2
             FMAX=COEF(I2)
65
           CONTINUE
           FM=FLOAT(MAX-ICENTER-1)
           GOTO 80
C
```

```
C
C
70
          CALL INTPL(COEF, RCOEF, BN, NINT, NCO)
          IMAX=1
          FMAX=RCOEF(1)
          DO 71 I2=2,(NCO-1)*NINT+1
            IF (RCOEF(I2), LE, FMAX) GOTO 71
             IMAX=12
             FMAX=RCOEF(I2)
71
          CONTINUE
          FM=FLOAT(IMAX-1)/FLOAT(NINT)-FLOAT(ICENTER)
C
          VALUE(KOUNT)=FM
80
          IF (KOUNT.LT.NSIZE) GOTO 1000
          CALL WRITR(3,NN, VALUE, 1, IERR)
          KOUNT=0
          NN = NN + 1
C
1000
        CONTINUE
C
C
        N = N + 1
        IF (IBLK+1-N) 105,102,333
102
         IF (IRES.GT.O.) GOTO 222
C
         IF (KOUNT) 106,106,107
105
107
         CALL CLOSE(3, IERR)
         CALL APPEND(3, NAME, 3, 4, IER)
         DC 110 II=1,KOUNT
           WRITE BINARY(3) VALUE(II)
110
         CONTINUE
C
         CALL RESET
106
         CALL QUERY (*<7>RE-EXECUTE LMSTDE(Y/N=CR) ? = *,IQ)
         IF (IQ) 200,200,201
         CALL QUERY("WANT SAME PARAMETERS (Y/N=CR)? = ",IQ1)
201
         IF (IQ1) 1,1,15
200
         STOP "* NORMAL TERMINATION OF LMSTDE **
         END
```

5/ 3/1983 10:33: 1 DIR #PARK STOTDE, FR Pase

C C C

ADAPTIVE SHORT TERM CORRELATOR ROUTINE

C C C

SOURCE FILE NAME STCTDE.FR

C C

SANGIL PARK PROGRAMMER

C C

DATE JAN. 25,1983

C

C C

C C

C

C

PURPOSE

THIS PROGRAM IMPLEMENTS THE SHORT TERM CORRELATOR ALGORITHM FOR TIME DELAY ESTIMATION. ONE CAN OBTAIN THE IMPULSE RESPONSE FUNCTION (THE COEFFICIENT VALUE) OR THE ESTIMATED DELAY(THE PEAK OF COEFFICIENT) VALUE.

C C C C

> C C

> C C

C C REFERENCE

N.AHMED ET AL. 82 MIDCON CONFERENCE NOV.30,1982

 $RXY(K_1L) = BETA1*RXY(K-1_1L)+(1-BETA1)*REF(K)*FRI(K+L)/(SX(K)*S)$

SX(K) = BETA2 * SX(K-1) + (1-BETA2) * ABS(REF(K))

C C C

ROUTINES CALLED BY THIS PROGRAM

C C C

C

C

OPENH OPENW QUERY READR RESET WRITE APPEND INTPL.RB

C C

C C C C

DESCRIPTION OF I/O FILES

C C C

C

C C

C

C

C

PRIMARY INPUT FILE INPUT:

REFERENCE INPUT FILE

OUTPUT: MAXIMUM VALUE OUTPUT FILE

COEFFICIENT OUTPUT FILE

Ü

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STCTDE.FR
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Page 2
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```
0
C
        COMMON /OPN/ IFILE(18), NAME(13)
        REAL PRI(-63:1088), REF(512), VALUE(512)
        REAL RXY(-64:64), RXYINT(1291)
C
C
        PARAMETER
                         NSIZE=512
                         RSIZE=FLOAT(NSIZE)
                         NBYTE=NSIZE*4
                         EPSILON=0.000001
C
C
1
        CALL QUERY("WANT CORRELATION(Y/N)? = ",ICOR)
        IF(ICOR.EQ.1) ACCEPT " AT MULTIPLE OF = ",DUMP
        CALL QUERY("WANT PEAK VALUE(Y/N)? = ",IMAX)
        IF(IMAX, NE.1) GOTO 11
        ACCEPT " START POINT?= ",DP1
        ACCEPT " INTERVAL?=
                                 " , DP2
C
        CALL QUERY("WANT NORMALIZATION(Y/N)? = ", NORM)
11
        IF(NORM.NE.1) GOTO 12
        ACCEPT " SMOOTH.PARA. FOR NORM = ", BETA2
        TYPE
C
12
        ACCEPT "PRI.INFUT DELAY UNITC-64:64] = ",IDELAY
        ACCEPT "SMOOTH, PARA, FOR CORRELATION = "/BETA1
        ACCEPT "NUMBER OF DATA ITERATION ? = ",DATA
        ITER=IFIX(DATA/RSIZE)
        IRES=IFIX(DATA-FLOAT(ITER)*RSIZE)
C
        ACCEPT "NUMBER OF SHIFTS (1 - 64) ? = ", LAG
        CALL QUERY("WANT INTERPOLATION(Y/N=CR) ? = ",IQIN)
C
        IF (IQIN.NE.1) GOTO 20
        ACCEPT * SAMPLING FREQUENCY ? =
                                                 * ,SAMP
        ACCEPT " SIGNAL BAND-WIDTH ? =
                                                 ", BAND
        ACCEPT " # OF INTPOL EACH INTERVAL ? = ", NINT
        BN=2.*BAND/SAMP
C
C
C
        ** I/O AND INIT. **
C
C
20
        DO 21 I=1, NSIZE
          PRI(I-64)=0.0
          PRI(I+64)=0.0
          PRI(I+576)=0.0
          REF(I) = 0.0
           VALUE(I)=0.0
21
        CONTINUE
         DO 22 I=-LAG, LAG
```

RXY(I)=0.0

CONTINUE

22

C

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STCTDE.FR
                        5/ 3/1983 10:33: 1
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                                                                      3
C
C
        SX = 1.0
        SY = 1.0
        LCOEF=2*LAG+1
C
        NB = LCOEF * 4
        IF(IQIN.EQ.1) NB=(2*LAG*NINT+1)*4
        IF(ICOR.EQ.1) SDUMP = DUMP
        IF(IMAX.EQ.1) DP3=DP1
C
        FDUMF = 0.0
                         JSYSTEM COUNTER
                         #COUNTER FOR MAXIMUM VALUE DUMP
        KOUNT=0
                         ; COUNTER FOR CORRELATION FUNCTION DUMP
        NCOUNT≕0
        JJ=1
                         FOR ITERATION BLOCK COUNTER
        NN=1
                         FOR VALUE BLOCK COUNTER
(:
C
C
        * OPEN I/O FILES *
C
C
        CALL OPENR(1, "PRIMARY
                                 INPUT FILE NAME : ", NBYTE, F2)
        CALL OPENR(O, "REFERENCE INPUT FILE NAME : ", NBYTE, F1)
        IF(ICOR.EG.1) CALL OPENW(4, "CORR. FUNCTION FILE NAME : ", NB, SIZE)
        IF(IMAX.EQ.1) CALL OPENW(3, "CORR.PEAK POINT FILE NAME
                                                                   : ", NBYTE, SIZE!
C
C
        TYPE
        TYPE "DATA =",DATA
        TYPE "DELAY=", IDELAY
        TYPE "BETA = " BETA1
C
Ĺ,
        IF(ITER) 999,222,333
222
        CONTINUE
        LOOP=IRES
        GOTO 401
C
333
        CONTINUE
        LOOP=NSIZE
C
401
        DO 402 I=0, LAG+IDELAY
          PRI(IDELAY-I)=PRI(NSIZE+IDELAY-I)
402
        CONTINUE
```

000

C

C

000

C

C

** MAIN PROGRAM **

* READ INPUT DATA *

CALL READR(O, JJ, REF, 1, IER)

CALL READR(1,JJ,PRI(IDELAY+1),2,IER)

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C
C
C
        * MAIN LOOP *
C
        DO 1000 I = 1,LOOP
C
          FDUMP = FDUMP + 1.
          IF(NORM.NE.1) GOTO 499
          SX = BETA2*SX + (1.-BETA2)*ABS(REF(I))
          SY = BETA2*SY + (1.-BETA2)*ABS(PRI(I))
          POWER=SX*SY
          IF(POWER.GT.EPSILON) GOTO 500
499
          POWER=1.0
          DO 501 L=-LAG, LAG
500
            RXY(L)=BETA1*RXY(L)+(1,-BETA1)*REF(I)*PRI(I+L)/FBWER
501
          CONTINUE
Ü
C
          * DUMP CORRELATION FUNCTION *
C
          IF(ICOR, NE.1.OR, FDUMP, NE.SDUMP) GOTO 400
          MCOUNT=MCOUNT+1
          SDUMP = SDUMP + DUMP
C
          IF(IQIN.EQ.1) GOTO 650
          CALL WRITE(4, NCOUNT, RXY(-LAG), 1, IER)
          GOTO 600
C
650
          CALL INTPL(RXY(-LAG), RXYINT, BN, NINT, LCOEF)
          CALL WRITR(4, NCOUNT, RXYINT, 1, IER)
C
C
           * DUMP PEAK POINT OF CORRELATION *
C
600
           IF(IMAX.NE.1.OR.FDUMP.NE.DP3) GOTO 1000
           DP3=DP3+DP2
          KOUNT=KOUNT+1
C
           IF(IQIN.EQ.1) GOTO 750
           MAX≔1
           FMAX=RXY(-LAG)
           DO 701 I2=-LAG+1, LAG
             IF(RXY(I2), LE, FMAX) GOTO 701
             MAX=I2
             FMAX=RXY(I2)
701
           CONTINUE
           FM=FLOAT(MAX)
           GOTO 800
750
           CALL INTPL(RXY(-LAG), RXYINT, BN, NINT, LCOEF)
           IPEAK=1
           FMAX=RXYINT(1)
           DO 751 I2=2,2*LAG*NINT+1
             IF(RXYINT(I2).LE.FMAX) GOTO 751
             IPEAK=12
             FMAX=RXYINT(I2)
751
           CONTINUE
           FM=FLOAT(IPEAK-1)/FLOAT(NINT)-FLOAT(LAG)
```

Page 5

```
C
C
800
          VALUE (KOUNT) = FM
          IF (KOUNT.LT.NSIZE) GOTO 1000
          CALL WRITE(3,NN, VALUE, 1, IERR)
          KOUNT=0
          1+NN=NN+1
C
1000
        CONTINUE
C
        JJ=JJ+1
        IF(ITER+1-JJ) 105,102,333
102
        IF(IRES.GT.0) GOTO 222
C
105
        IF(KOUNT) 106,106,107
107
        CALL CLOSE(3, IERR)
        CALL APPEND(3, NAME, 3, 4, IERR)
        DO 108 II=1,KOUNT
          WRITE BINARY(3) VALUE(II)
108
        CONTINUE
106
        CALL RESET
        CALL QUERY("<7><12>RE-EXECUTE STOTDE (Y/N) : "+IQ)
        IF(IQ.NE.1) GOTO 999
        CALL QUERY(" WANT SAME PARAMETERS (Y/N) :", IQQ)
        IF(IQQ.NE.1) GOTO 1
        GOTO 20
C
999
        STOP "** NORMAL TERMINATION OF STCTDE **
        END
```

DO 11 I=-63,1024 SIG(I)=0.0

CONTINUE

11

```
C
      TIME VARYING DELAY SIGNAL GENERATION ROUTINE
C
C
      SOURCE FILE NAME
                                 TVFILE.FR
C
C
      PROGRAMMER
                               - SANGIL PARK
C
C
      DATE
                                 JUNE 25,1982
C
C
C
C
      PURPOSE
C
             THIS PROGRAM MAKES THE INPUT SIGNAL TIME VARYING
C
             BY ARBITRARY DELAY FUNCTION,
C
C
C
             INFUT:
                    DATA INPUT FILE
C
                    DELAY INPUT FILE
C
C
             OUTPUT: TIME VARYING DATA OUTPUT FILE
C
C
C
      COMMON /OPN/ IFILE(18), NAME(18)
      REAL SIG(-63:1024), DSIG(512), DELAY(512)
C
      PARAMETER NSIZE=512
                RSIZE=FLOAT(NSIZE)
                NBYTE=NSIZE*4
                FI=3.1415927
C
C
      ** SET UP PARAMETERS **
C
1
      ACCEPT "NUMBER OF COEF( ODD ) ? = ", NCO
      ACCEPT "NUMBER OF ITERATON
                             ? = ",DATA
      IBLK=IFIX(DATA/RSIZE)
      TRES=IFIX(DATA-FLOAT(IBLK)*RSIZE)
      ICENTER=(NCO-1)/2
C
C
      ** OPEN I/O FILES **
C
      CALL OPENR(1, DATA INPUT FILE NAME ? = ", NBYTE, SIZE1)
      CALL OPENR(2, "DELAY INPUT FILE NAME ? = ", NBYTE, SIZE2)
      CALL OPENW(3, DATA OUTPUT FILE NAME ? = ", NBYTE, SIZE3)
C
C
      ** INITIALIZATION **
C
      DO 10 I=1, NSIZE
        DSIG(I)=0.0
        DELAY(I)=0.0
10
       CONTINUE
```

```
TVFILE, FR
```

END

```
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```

```
C
        N=1
        IF (IBLK) 222, 222, 333
222
        LOOP=IRES
        GOTO 444
C
333
        LOOP=NSIZE
444
        DO 21 I=0, ICENTER-1
          SIG(-I)=SIG(NSIZE-I)
21
        CONTINUE
C
C
        ***********
C
        ** MAIN PROGRAM **
C
        米本米本本本本本本本本本本本本本
C
        CALL READR(1,N,SIG(1),2,ICNT,IERR)
        CALL READR(2,N,DELAY,1,ICNT,IERR)
C
        DO 1000 K=1,LOOP
C
        DSIG(K)=0.0
          DO 1001 M=-ICENTER, ICENTER
            IF(M-DELAY(K)) 41,42,41
41
            DSIG(K)=DSIG(K)+BIG(K-M)*SIN(PI*(M-DELAY(K)))/(PI*(M-DELAY(K)))
            GOTO 1001
42
            DSIG(K)=DSIG(K)+SIG(K-M)
1001
          CONTINUE
C
1000
        CONTINUE
        IF(IBLK-N) 102,101,100
100
        CALL WRITR(3,N,DSIG,1,IERR)
        N = N + 1
        GOTO 333
C
101
        CALL WRITE(3,N,DSIG,1,IERR)
        N = N + 1
        IF(IRES) 555,555,222
102
        CALL CLOSE(3, IERR)
        CALL APPEND(3, NAME, 3, 4, IERR)
        DO 103 I=1, IRES
          WRITE BINARY(3) DSIG(I)
103
        CONTINUE
C
555
        CALL RESET
        CALL QUERY("<7>RE-EXECUTE TVDATA(Y/N=CR) ? = ",IQ)
        IF(IQ)999,999,1
999
        STOP *** NORMAL TERMINATION OF TUDATA ***
```

RCOEF(I)=RCOEF(I)+COEF(M)*SIN(3.14*BN*(TAU-M))/(3.14*BN*(TAU-M

DO 4 M=1, ICO

CONTINUE

CONTINUE RETURN END

11

12

3

IF(TAU-M) 11,12,11

RCOEF(I)=RCOEF(I)+COEF(M)

GOTO 4

ACKNOWLEDGMENTS

I am indebted to my major professor, Dr. Nasir Ahemd, for making my graduate work here at Kansas State University possible. His generous guidance and valuable suggestions in writing this thesis are greatly appreciated. To the members of my committee, Drs. D. R. Hummels and W. A. Parker, I am very grateful for their contributions. Thanks are also due to Dr. D. H. Youn, University of Iowa for his valuable suggestions.

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To my mother, grandparents, sister and brother whose love, trust and confidence saw me through while away from home.

To my beloved father, for being my inspiration and strength, this piece of work is heartly dedicated.

bу

Sangil Park

B.E., Yonsei University, Korea 1977

AN ABSTRACT OF A MASTER'S THESIS

submitted in partial fulfillment of the requirements for the degree of

MASTER OF SCIENCE

ELECTRICAL ENGINEERING

COLLEGE OF ENGINEERING

KANSAS STATE UNIVERSITY

MANHATTAN, KANSAS

ABSTRACT

The purpose of this paper is to compare the performances of two algorithms for adaptive time delay estimation. These are: (1) Widrow's least-mean-square algorithm, and (2) an adaptive short-term correlator algorithm. The desired comparison will be carried out via a digital computer simulation. Band-limited signals which are perturbed by white Gaussian noise and received at two sensors are considered at various bandwidths and signal-to-noise ratios.