

AR(p)

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p

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p

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(1992-

2007)

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Estimations of AR(p) Model using Wave Shrink

Abstract

In this research, A proposed method was used to shrink the wavelet, in order to deals with the problem of noise (or contamination) that may encounter the time series data, and trying to find the best estimation for the parameters of the autoregressive model of order (p) by getting the least possible value (best value) of the estimated statistical

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criteria's values for the proposed models (of less contamination) as the final prediction error, loss function and The Mean Absolute Prediction Error, and comparing them with the estimated statistical criteria's for the autoregressive model from order (p) that estimated by the classical method.

In the application side of the research, the analysis of the time series observations of the quantity of the annual rainfall in Erbil city for the period (1992-2007) was discussed depending on the use of MATLAB software, in addition to write code using MATLAB language.

: : 1

(Time Series Analysis)

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(Wavelet Shrinkage)

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(Filtering)

()

(Universal Threshold)

(Wavelet Transformation)

,

(Autoregressive

. p Model)

: 2 :

AR(p) p : {3}

$$y_t = \theta_0 + \sum_{k=1}^p \theta_k y_{t-k} + \varepsilon_t \quad \dots (1)$$

(p ≠ 0) θ_k

ε_t ,

σ_ε²

(Uncorrelated random variables)

(Stationary) y_t , (White Noise)

... (Yule-Walker)

) (1)

(-

(Akaike) (FPE) (Final Prediction Error)

(Akaike)

: {4} (FPE)

$$FPE = LF \cdot \left(\frac{1 + p/N}{1 - p/N} \right) \quad \dots (2)$$

(Loss LF , N
, function)

(Mean Absolute
 . (MAPE) Prediction Error)

: : 3

,
(Scaling function)
(Dilation equation) (Father function)
: {6}

$$\phi(x) = \sum_{k=0}^N c(k) \phi(2x - k) \quad \dots (3)$$

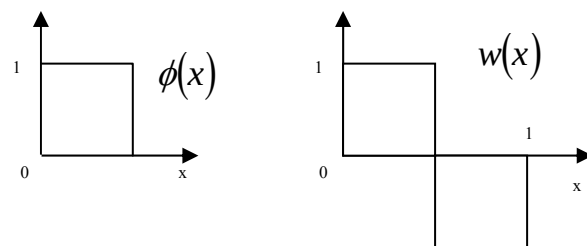
, (Low-pass Filter) - $C(k)$
(Wavelet function)

(Wavelet equation) (Mother function)
: {7}

$$w(x) = \sum_{k=0}^N d(k) \phi(2x - k) \quad \dots (4)$$

(High-pass Filter) - $d(k)$
 $C(0) = C(1) = 1$ N=1 (Haar Wavelet)

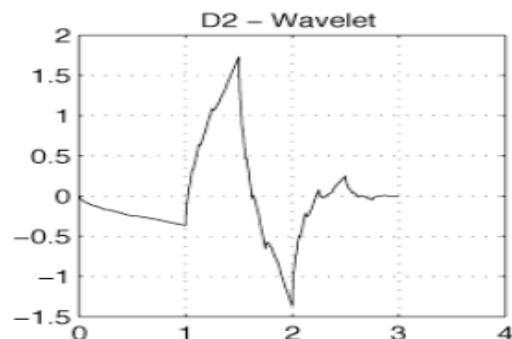
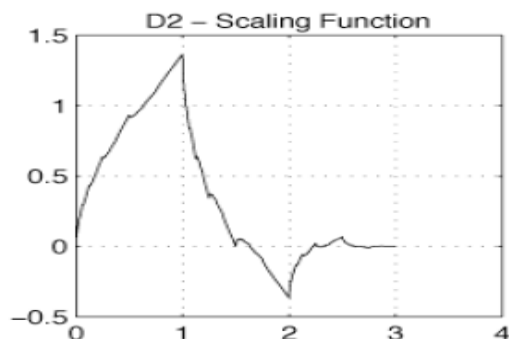
($d(0) = -d(1) = 1/2$)
:



(1)

(Daubechies)

(N=3 ((db2
: {1}



(2)

(db2)

: {2}

: (Orthogonality) -1

$$\int_{-\infty}^{\infty} w_{jk}(x) w_{JK}(x) dx = 0 \quad \dots (5)$$

j (Time and scale) -2

. (Time index) k (Scale index)

$$w(x) \quad \phi(x) \quad d(k) \quad c(k) \quad -3$$

(Support interval)

. (Normalization) (Smoothness)

: (Wavelet Transform)

$$b_{JK} = \int_{-\infty}^{\infty} f(x) \cdot w_{JK}(x) dx \quad \dots (6)$$

:

$$f(x) = \sum_{j=k} b_{jk} \cdot w_{jk}(x) dx \quad \dots (7)$$

b_{jk} (Efficiently)

(Multi-resolution decomposition)

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$$w_{jk}(x) = 2^{j/2} w(2^j x - k) \quad \dots (8)$$

:

$$b_{jk} = \int_{-\infty}^{\infty} f(x) 2^{j/2} w_{jk}(2^j x - k) dx \quad \dots (9)$$

:

$$\phi(x) = \phi(2x) + \phi(2x - 1)$$

$$\Rightarrow \phi_{j-1,k}(x) = \frac{1}{\sqrt{2}} [\phi_{j,2k}(x) + \phi_{j,2k+1}(2x - 1)]$$

:

$$w(x) = \phi(2x) - \phi(2x - 1)$$

$$\Rightarrow w_{j-1,k}(x) = \frac{1}{\sqrt{2}} [\phi_{j,2k}(x) - \phi_{j,2k+1}(2x - 1)]$$

:

$$a_{j-1,k} = \frac{1}{\sqrt{2}} (a_{j,2k} + a_{j,2k+1}) \quad \dots (10)$$

:

$$b_{j-1,k} = \frac{1}{\sqrt{2}} (a_{j,2k} - a_{j,2k+1}) \quad \dots (11)$$

(db2)

.

: 4

(Non-linear (Shrinkage
: {5} thresholding)

(-1

:

$y^* = W(y) \dots (12)$

: (Threshold Estimation) - 2

$\lambda = Est(y^*) \dots (13)$

: , λ - 3

$y^{*'} = D(y^*, \lambda) \dots (14)$

(Inversion -4

: , (reconstruction) Transformation)

$\hat{y} = W^{-1}(y^{*'}) \dots (15)$

(Universal threshold)

:

$\lambda = \sigma \sqrt{2 \log N} \dots (16)$

, (Hard)

: (Mid) (Soft)

: *

$$\begin{aligned}
 & \dots \quad \quad \quad ((4) \quad \quad \quad d_{j,k}) \\
 & \quad \quad \quad : \quad \quad , \lambda \\
 \eta(d_{j,k}) = & \begin{cases} 0 & \text{if } |d_{j,k}| \leq \lambda \\ d_{j,k} & \text{if } |d_{j,k}| > \lambda \end{cases} \quad \dots (17)
 \end{aligned}$$

$$\begin{aligned}
 & \quad \quad \quad : \quad \quad \quad * \\
 & \quad \quad \quad \lambda \\
 & \quad \quad \quad , \\
 & \quad \quad \quad : \\
 \eta(d_{j,k}) = & \begin{cases} 0 & \text{if } |d_{j,k}| \leq \lambda \\ \text{sign}(d_{j,k}) (|d_{j,k}| - \lambda) & \text{if } |d_{j,k}| > \lambda \end{cases} \quad \dots (18)
 \end{aligned}$$

$$\begin{aligned}
 & \quad \quad \quad : \\
 \text{sign}(d_{j,k}) = & \begin{cases} +1 & \text{if } d_{j,k} > 0 \\ 0 & \text{if } d_{j,k} = 0 \\ -1 & \text{if } d_{j,k} < 0 \end{cases} \quad \dots (19)
 \end{aligned}$$

$$\begin{aligned}
 & \quad \quad \quad : \quad \quad \quad * \\
 & : \\
 \eta(d_{j,k}) = & \text{sign}(d_{j,k}) (|d_{j,k}| - \lambda)_{++} \quad \dots (20)
 \end{aligned}$$

$$\begin{aligned}
 & \quad \quad \quad : \\
 (|d_{j,k}| - \lambda)_{++} = & \begin{cases} 2(|d_{j,k}| - \lambda)_+ & \text{if } |d_{j,k}| < 2\lambda \\ |d_{j,k}| & \text{otherwise} \end{cases} \quad \dots (21)
 \end{aligned}$$

$$\left(\left| d_{j,k} \right| - \lambda \right)_+ = \begin{cases} 0 & \text{if } \left(\left| d_{j,k} \right| - \lambda \right) < 0 \\ \left(\left| d_{j,k} \right| - \lambda \right) & \text{otherwise} \end{cases} \quad \dots (22)$$

: AR(p) : 5

AR(p)

((db2))
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(λ

MAPE FPE , LF , AR(p)

: 6

AR(p)

(1992-2007) (ملم)

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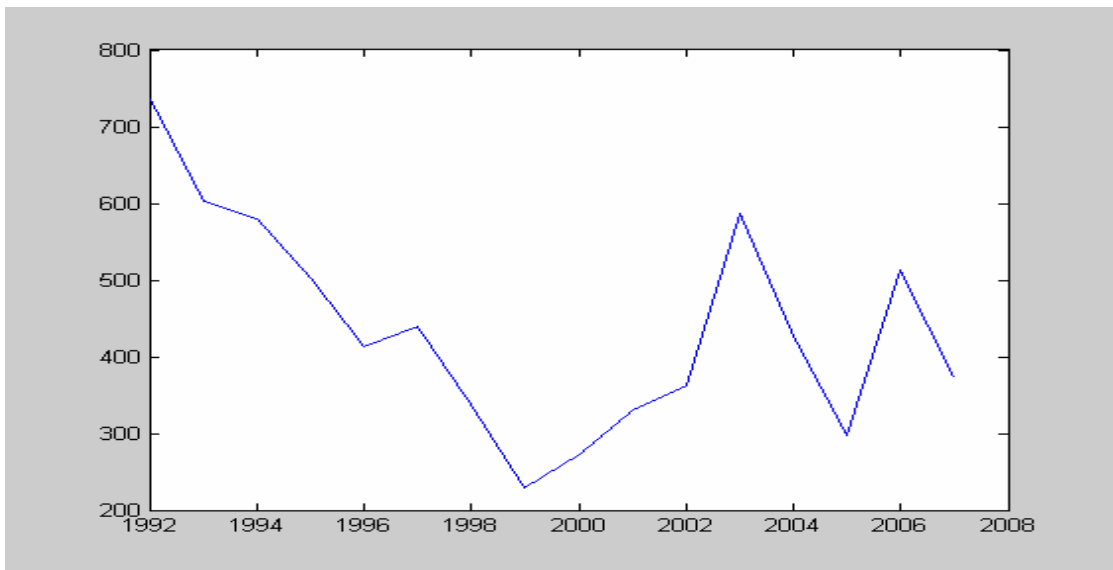
() : (1)

(1992-2007)

السنة	كميات تساقط الأمطار السنوية (ملم)	السنة	كميات تساقط الأمطار السنوية (ملم)
1992	736.700	2000	272.300
1993	602.700	2001	330.900
1994	580.400	2002	361.500
1995	502.200	2003	587.654
1996	412.590	2004	427.000
1997	440.100	2005	297.500
1998	337.200	2006	514.000
1999	229.200	2007	273.400

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(3)

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AR(p)

(A)

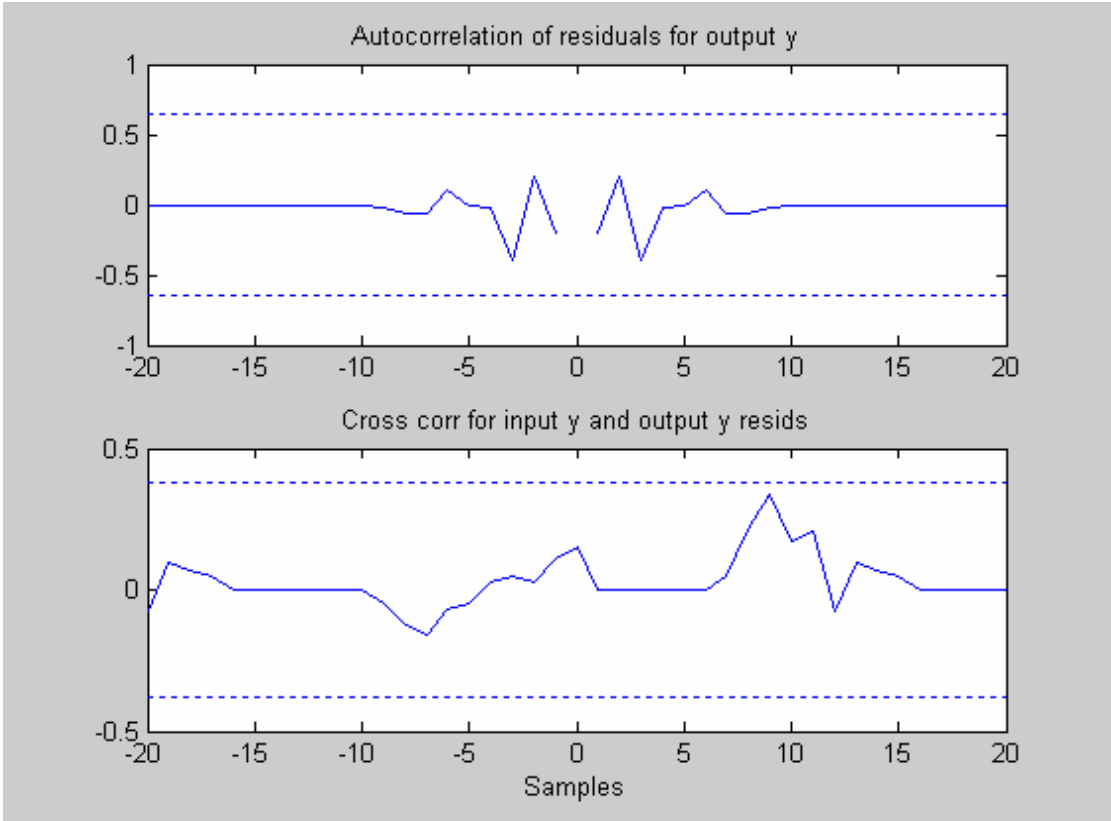
, (3)

, (Yule-Walker)

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(0.05)



(4)

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(4)

AR(6)

) MAPE FPE , LF

. (4) , (

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hh , (B)

hm , hs ,

(db2) dh ,

dm (db2) ds ,

: , (db2)

(2)

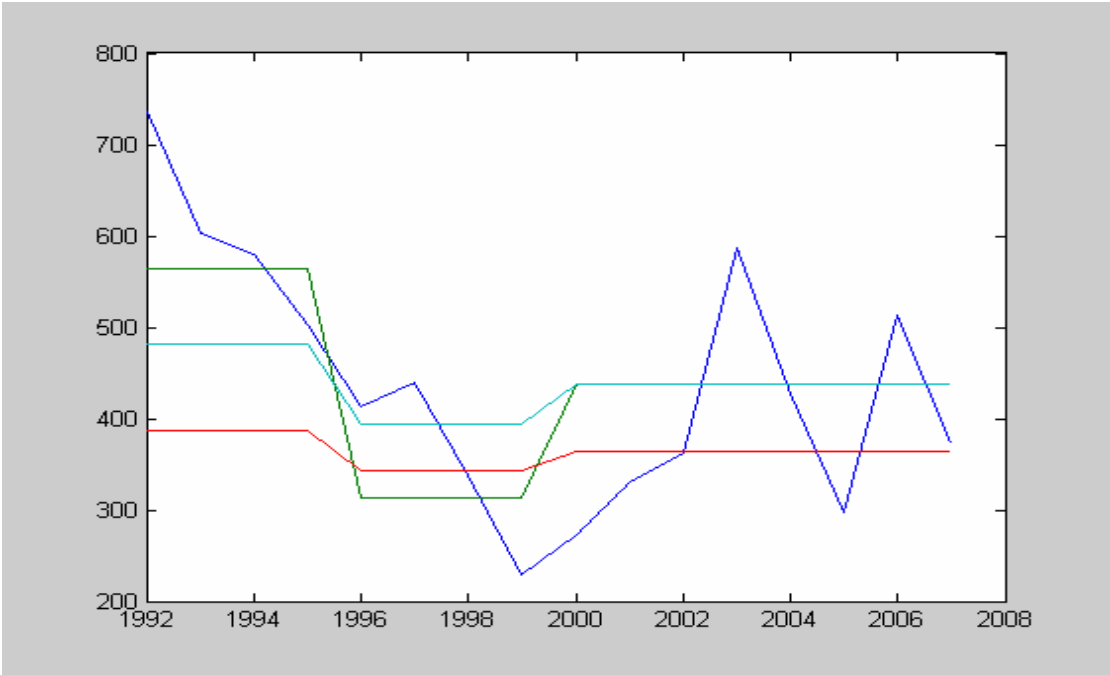
(db2)

dm	ds	dh	hm	hs	hh	
674.9990	612.7115	677.7594	481.2710	386.2642	563.1978	1992
674.6086	611.6447	677.5037	481.2710	386.2642	563.1978	1993
580.9124	538.2980	579.7541	481.2710	386.2642	563.1978	1994
512.2174	484.3187	508.1279	481.2710	386.2642	563.1978	1995
468.5236	449.7067	462.6251	394.3970	342.8272	312.4703	1996
418.1307	409.9052	410.1225	394.3970	342.8272	312.4703	1997
390.4356	388.3194	370.4843	394.3970	342.8272	312.4703	1998
356.6587	361.8527	327.3991	394.3970	342.8272	312.4703	1999
316.7999	330.5051	280.8669	437.8340	364.5457	437.8340	2000
278.5707	300.4654	235.2584	437.8340	364.5457	437.8340	2001
361.2683	337.7558	417.0182	437.8340	364.5457	437.8340	2002
411.5637	357.0051	537.8549	437.8340	364.5457	437.8340	2003
392.6014	339.7857	385.6229	437.8340	364.5457	437.8340	2004
392.1966	332.3381	306.5595	437.8340	364.5457	437.8340	2005
396.9834	325.6462	382.9680	437.8340	364.5457	437.8340	2006
400.3790	318.7518	417.7179	437.8340	364.5457	437.8340	2007

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(5)

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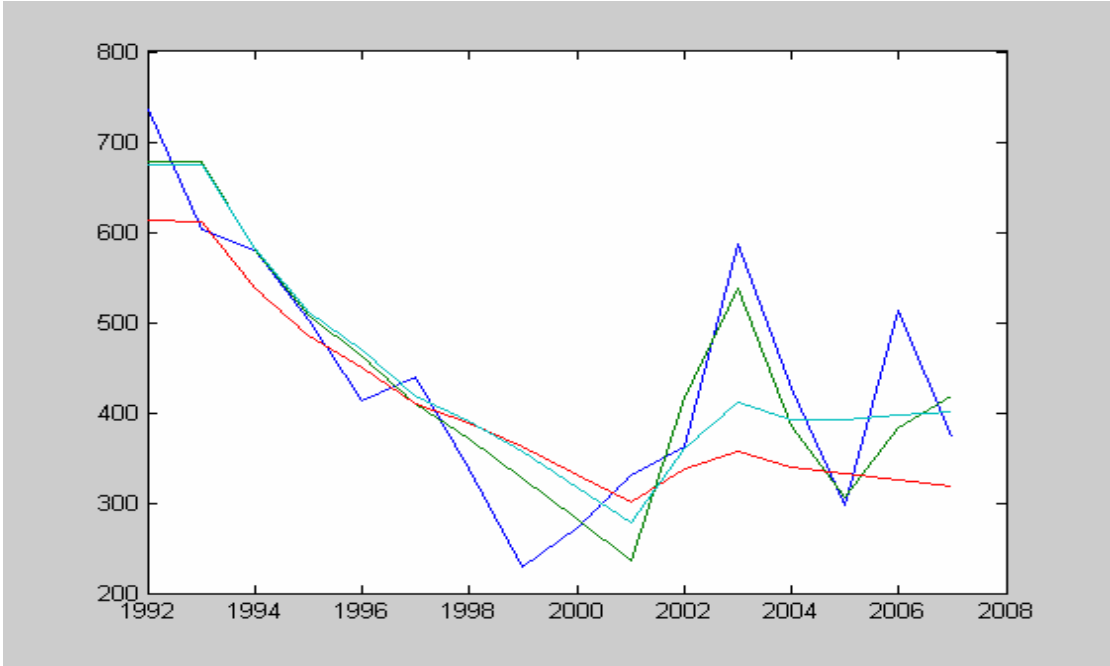
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(db2)

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(6)

(db2)

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) AR(6)

, (db2) (Yule-Walker

AR(6)

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(3)

AR(6)

AR(6)	
$A(q) = 1 - 1.109 q^{-1} + 0.633 q^{-2} - 1.069 q^{-3} + 1.395 q^{-4} - 1.32 q^{-5} + 0.4734 q^{-6}$	
$A(q) = 1 - 0.7705 q^{-1} - 0.2609 q^{-2} - 2.644 e_{(-16)} q^{-3} + 0.4 q^{-4} - 0.3082 q^{-5} - 0.08456 q^{-6}$	
$A(q) = 1 - 0.7594 q^{-1} - 0.2599 q^{-2} - 2.54 e_{(-15)} q^{-3} + 0.4 q^{-4} - 0.3038 q^{-5} - 0.08182 q^{-6}$	
$A(q) = 1 - 0.7612 q^{-1} - 0.2601 q^{-2} - 1.421 e_{(-16)} q^{-3} + 0.4 q^{-4} - 0.3045 q^{-5} - 0.08231 q^{-6}$	
$A(q) = 1 - 0.442 q^{-1} + 1.388 q^{-2} - 1.395 q^{-3} + 0.7541 q^{-4} - 0.453 q^{-5} + 0.1744 q^{-6}$	(db2)
$A(q) = 1 - 0.359 q^{-1} + 0.7421 q^{-2} - 0.5492 q^{-3} + 0.1312 q^{-4} - 0.03078 q^{-5} + 0.07766 q^{-6}$	(db2)
$A(q) = 1 - 1.429 q^{-1} + 0.819 q^{-2} - 0.6135 q^{-3} + 0.1983 q^{-4} - 0.03118 q^{-5} + 0.05383 q^{-6}$	(db2)

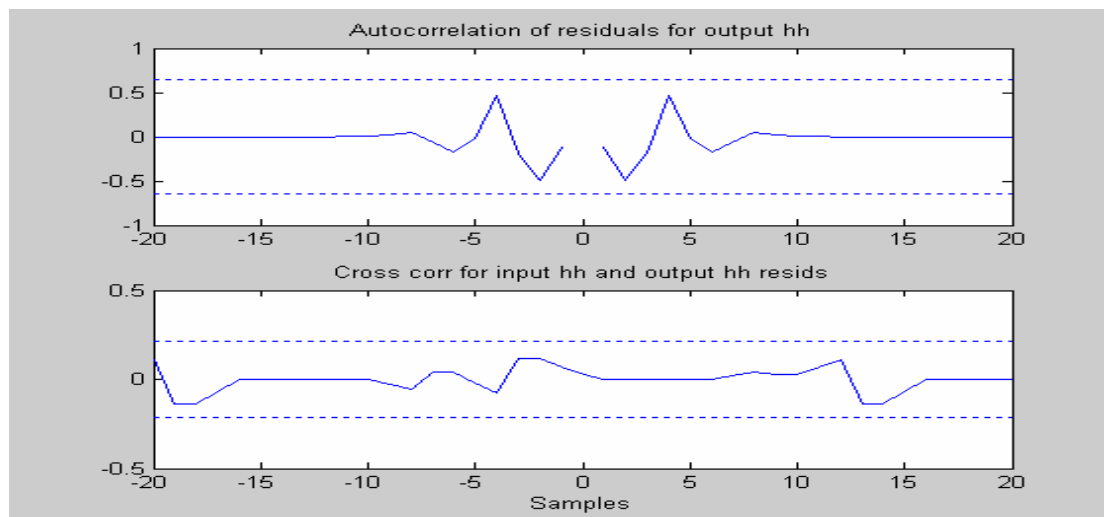
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(, (db2)

, (0.05)

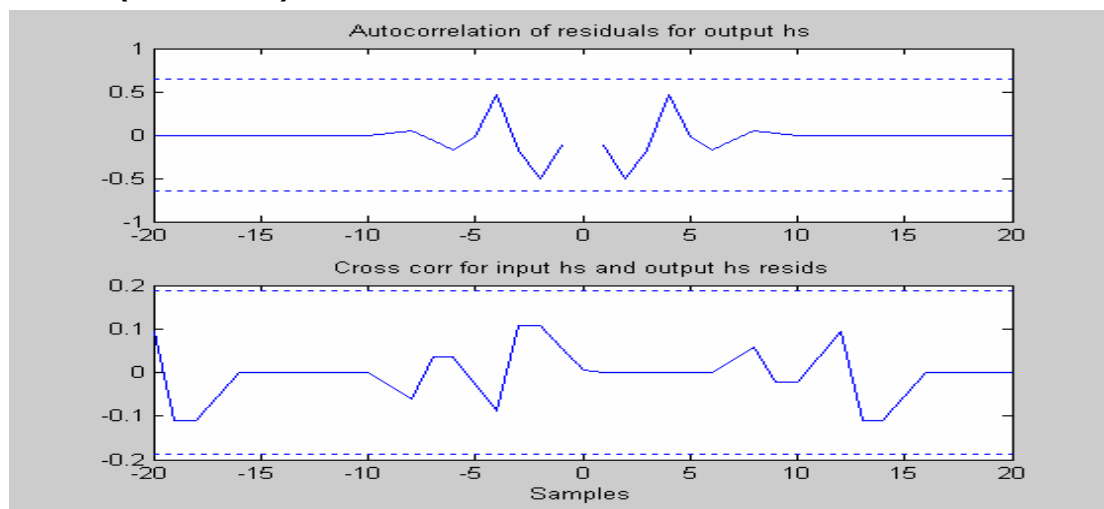
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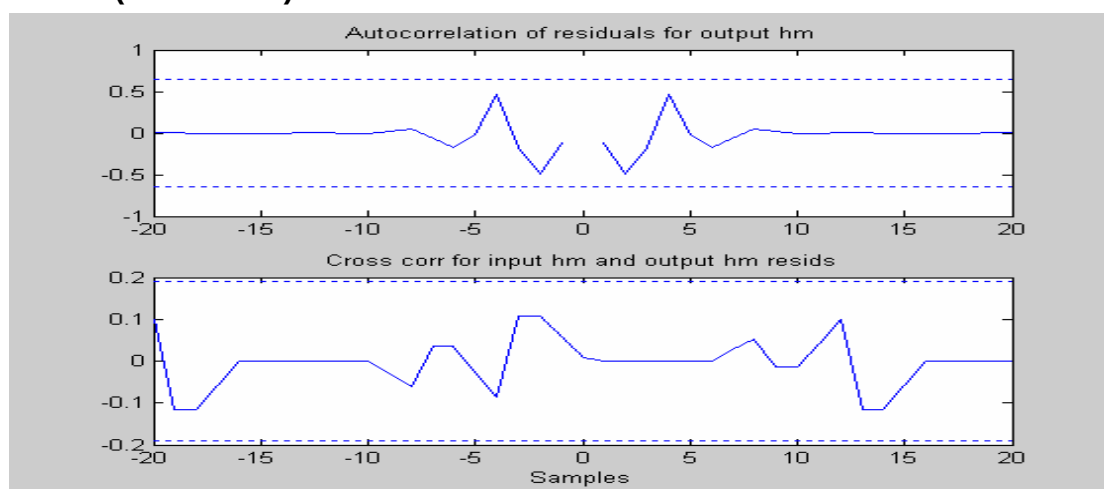
(5)

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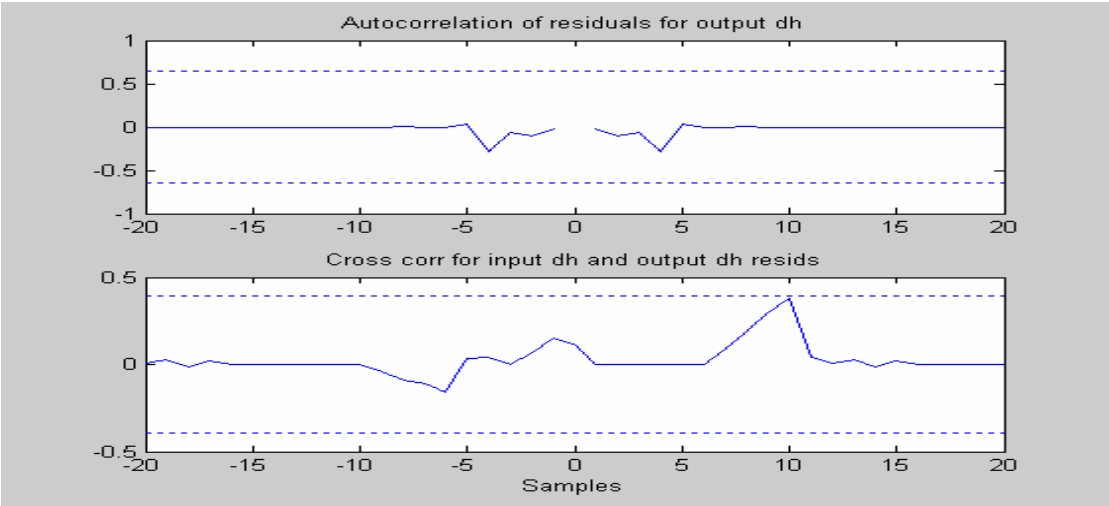
(6)

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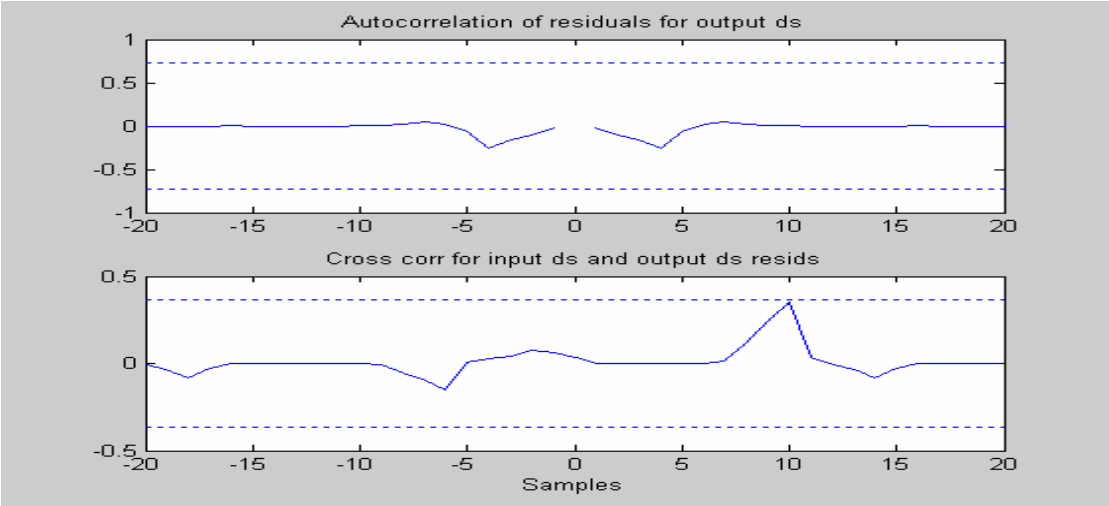
(7)

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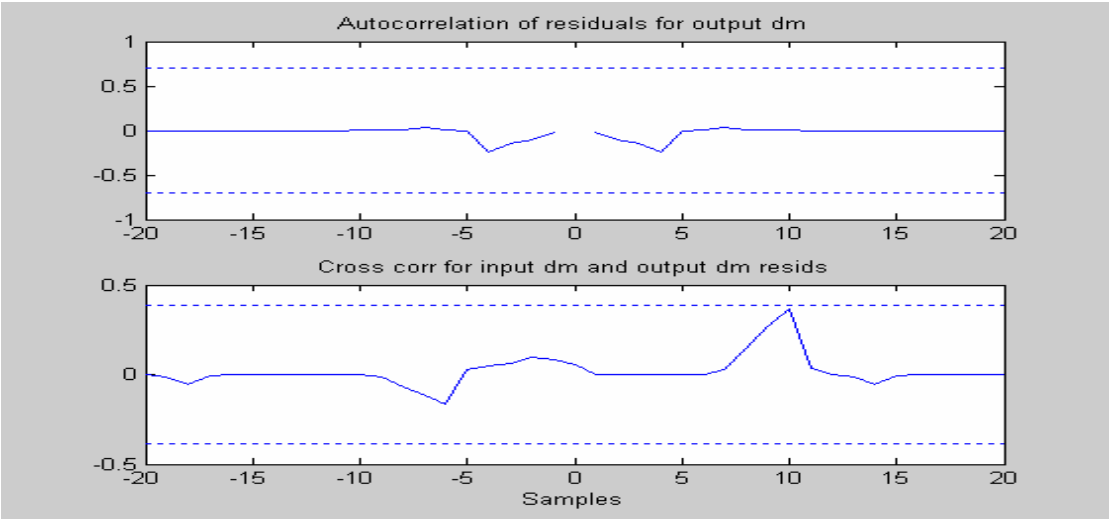
(8)

((db2)) -



(9)

((db2)) -



(10)

((db2)) -

AR(6)

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AR(6)

MAPE FPE , LF , (3)

(4)

AR(6)

MAPE	FPE	LF	
40.5701	10879.8	4945.38	
16.0703	333.0190	151.372	
15.5401	9.85084	4.47766	
15.6250	39.4982	17.9537	
36.8473	5786.95	2630.43	(db2)
19.9922	445.126	202.33	(db2)
21.8436	1518.62	690.281	(db2)

(4)

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. AR(6)	-3
. AR(6)	-4
AR(6)	-5
()	-6
	-7
. ARMA(p , q) MA(q)	

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