

**A SOFTWARE PACKAGE FOR  
SYSTEM IDENTIFICATION**

**BY**

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## CHAPTER I

### INTRODUCTION

System identification is the statistical modeling of dynamic systems based on observed data. Modeling such systems or processes can provide a probabilistic structure of the future behavior of the systems. In system identification one first identifies the structure of a model and then estimates its parameters.

Processes such as stock market prices or ozone pollution levels are much more useful if expressed recursively in a finite series of past observations and noise. The mathematical model can be expressed as

$$Z_t = \phi_1 Z_{t-1} + \dots + \phi_p Z_{t-p} + e_t \quad (1.1)$$

Let us define a backward shift operation,  $B$ , such that

$$B^k Z_t = Z_{t-k} \quad (1.2)$$

Then the above AR model may be expressed as

$$\phi(B)Z_t = e_t \quad (1.3)$$

where

$$\phi(B) = 1 - B\phi_1 - \dots - B^p\phi_p$$

Equation (1.2) is called the AutoRegressive ,  $AR(p)$ , process with

order  $p$ . The AR model contains  $p+1$  unknown parameters, one of which is the variance of the noise,  $e_t$ . An AR process can be stationary or nonstationary. For AR( $p$ ) process to be stationary, the impulse response must form a convergent series.

If  $Z_t$  is expressed in a finite number of previous  $e$ 's, then the process would be called a Moving Average, MA( $q$ ) with order  $q$ , where  $q$  is the number of previous  $e$ 's used to express  $Z_t$

$$Z_t = e_t - \theta_1 e_{t-1} - \dots - \theta_q e_{t-q} \quad (1.4)$$

If we make use of the B operator (1.4) becomes

$$Z_t = \theta(B)e_t \quad (1.5)$$

where

$$\theta(B) = 1 - B\theta_1 - \dots - B^q\theta_q$$

A reasonable extension to the AR and MA models is the mixed model of the form

$$Z_t = \phi_1 Z_{t-1} + \dots + \phi_p Z_{t-p} + e_t - \theta_1 e_{t-1} - \dots - \theta_q e_{t-q} \quad (1.6)$$

and is called ARMA( $p,q$ ) model of order  $p$  and  $q$ . It is more flexible to use ARMA in modeling an actual time series. Again using the B operator we can simplify the ARMA equation as

$$\phi(B)Z_t = \theta(B)e_t \quad (1.7)$$

Another way of looking at (1.7) is by saying that  $Z_t$  and  $e_t$  are the output and input of a digital filter with  $\phi^{-1}(B)\theta(B)$  as the transfer function, where the roots of  $\phi(B)$  are the poles and the roots of  $\theta(B)$

are the zeros of the filter. This filter is stable and the process is stationary only if the poles are inside the unit circle. Throughout this thesis, unless otherwise indicated, all processes are assumed to be stationary and zero mean.

In process identification we are concerned with estimating the orders  $p$  and  $q$  as well as the parameters  $\phi$ 's and  $\theta$ 's. Figure 1.1 shows a flowchart that can be used as a guide for process identification. This thesis will exhibit several procedures for ARMA identification and will describe an application program to implement these procedures. The application (MacModel) is a user-friendly menu-driven program for Macintosh computer systems. It has been designed for easy expandability. New identification procedures can be added simply.

Chapter II depicts the program flowchart and details its general structure. The examples included in chapter II provide information about start-up and use, and expansion of the program.

Chapter III includes discussion of the simulation of the ARMA process and white noise. It also contains examples on using the List, Plot, Print Text, and Print Graphics menus.

Chapter IV contains the theoretical derivation for the various order estimation methods, as well as the sub-program structure that is related to these methods. Examples are also provided to show the utilization of these methods using the program.

Parameter estimation methods are detailed in chapter V. Related program structure is described along with examples on parameter estimation.

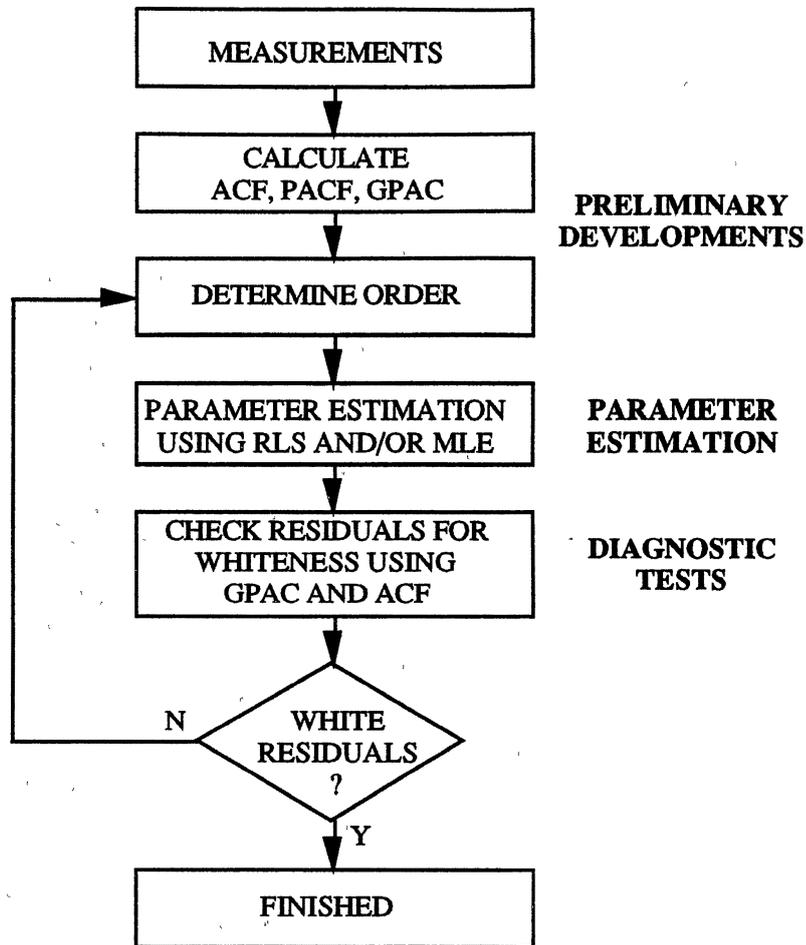


Figure 1.1. A guide for system identification

Chapter VI contains theory and examples of diagnostic testing. This chapter contains methods for checking the validity of the model obtained using the methods described in chapters IV and V. It also contains examples of processes that were overestimated or underestimated. Conclusions and recommendations are included in chapter VII.

## CHAPTER II

### PROGRAM STRUCTURE

Until April 1981, when Xerox introduced the 8010 "STAR", computers had unfriendly user interfaces where commands, with strict syntax, had to be typed in for every action needed. STAR introduced a bitmapped screen, windows, a mouse driven interface, and icons which were adopted later by others. Today mice, windows and icons are more common and are used by computer experts as well as casual users. This chapter discusses briefly the Macintosh structure, application programs structure, window structure, in addition to the expansion of the application program.

Logically the Macintosh is divided into sections as shown in Figure 2.1 [1]. Applications programs typically call the operating system and User Interface Toolbox routines. The routines available for use are divided according to function, into what are in most cases called "managers" of features that they support. Most managers are in the ROM part of the operating system and User Interface Toolbox.

The operating system is at the lowest level; it does basic tasks such as input and output, memory management, and interrupt handling. The User Interface Toolbox is a level higher above the operating system; it helps implement the standard Macintosh user interface applications. Users sometimes call the operating system

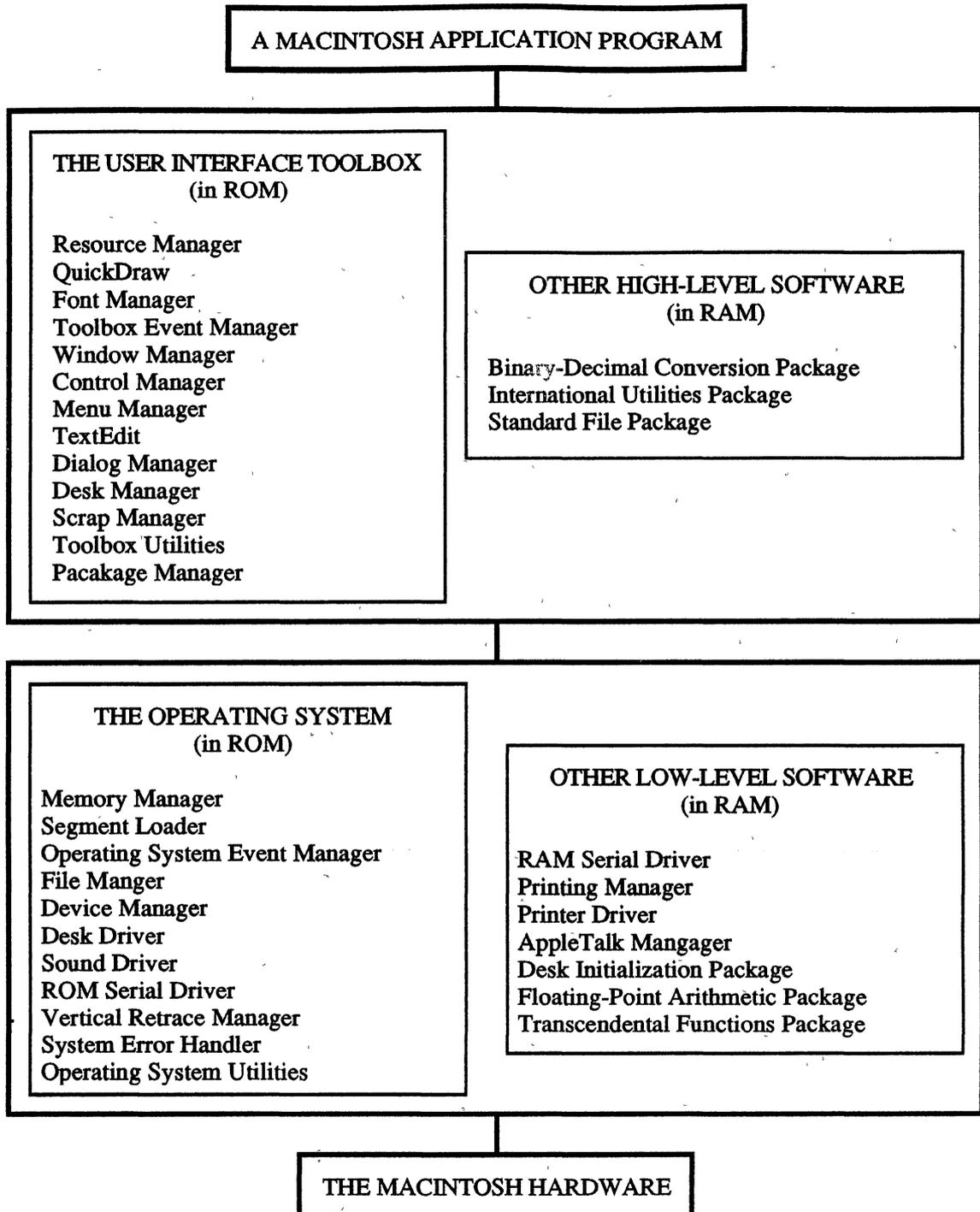


Figure 2.1 Overview of the Macintosh

directly, but for the most part the Toolbox calls the operating system to do low-level operations.

RAM-based software is available as well. In most cases this software performs specialized operations (such as floating-point arithmetic) that are not integral to the user interface but may be useful to some applications. For detailed description of the function of each manager and how managers interact see [1].

The Fortran Toolbox Interface, `Toolbx`, is a procedure that allows the access of about 500 different Macintosh resources. `Toolbx` may have different numbers of parameters when accessing different resources, as shown in the following two calls

```
call toolbx(NEWMENU, menuid, menutitle)
call toolbx(SELECTWINDOW, window)
```

the first parameter is reserved and is used to address the resource.

The first step in any Macintosh application is to initialize and allocate the menus (program `main.for` in Appendix B contains the menu initialization for the application `MacModel`). To allocate space for the first menu (the  menu) the `NEWMENU`, `ADDRESMENU` and `INSERTMENU` functions of `toolbx` are called. For all of the other menus (such as file, edit,...etc) `NEWMENU`, `APPENDMENU`, AND `INSERTMENU` are called in the listed order.

Windows, which can be used for both text editing and displaying graphics, can be easily created and disposed of as the application runs. The characteristics of a window (such as if the window is highlighted, if it is visible, etc.) are stored in a record proprietary to that window (see Table A.1 for complete list of the window record).

The first part (the first 108 bytes) of any window record is reserved for the window's grafport. The grafport is a complete drawing environment that defines where and how graphic operations will take place in the window (see Table A.2 for grafport declaration and contents).

Changing any variable in the window record directly affects the corresponding window. Window records are also helpful in reading current information about a window such as window size as illustrated below

```

window_width = portrect(3) - portrect(1)
window_height = portrect(4) - portrect(2)

```

with the portrect variable as defined in Table A.2. Or to check if the window is visible simply check if the variable "visible" is true (see Table A.1 for "visible").

The heart of every application program is its main event loop, which repeatedly calls the toolbox Event Manager to get events and then responds to them as appropriate. The most common event is a press of a mouse button; various actions are performed depending on where the mouse was pressed. Every event is represented internally by an event record containing all pertinent information about that event. The event record includes information such as the type of event and the mouse location (see Table A.3 for event record structure). The following example shows how to get the next event

```

toolbox(GETNEXTEVENT, eventmask, eventrecord)

```

eventmask = -1 to check all events (to filter in only certain events, check the corresponding value for eventmask in A.4). The programmer checks the "what" variable of the eventrecord to know

what type of event had occurred and the "where" variable for the location of the mouse.

After detecting an event one should call the FINDWINDOW function

```
mouseloc=toolbx(FINDWINDOW,where>window)
```

to find out where the event occurred. See Table A.5 in Appendix A for interpretation of "mouseloc". The "window" parameter in the FINDWINDOW call is a returned pointer to the window (if any) that the event occurred in. The "where" parameter, obtained above from GETNEXTTEVENT, is the location of the mouse at time of the event. Action should be taken according to which event occurred. For example, if the mouse was in a window, that window should be highlighted; or if the mouse was in the grow region of a window, action should be taking to resize that window.

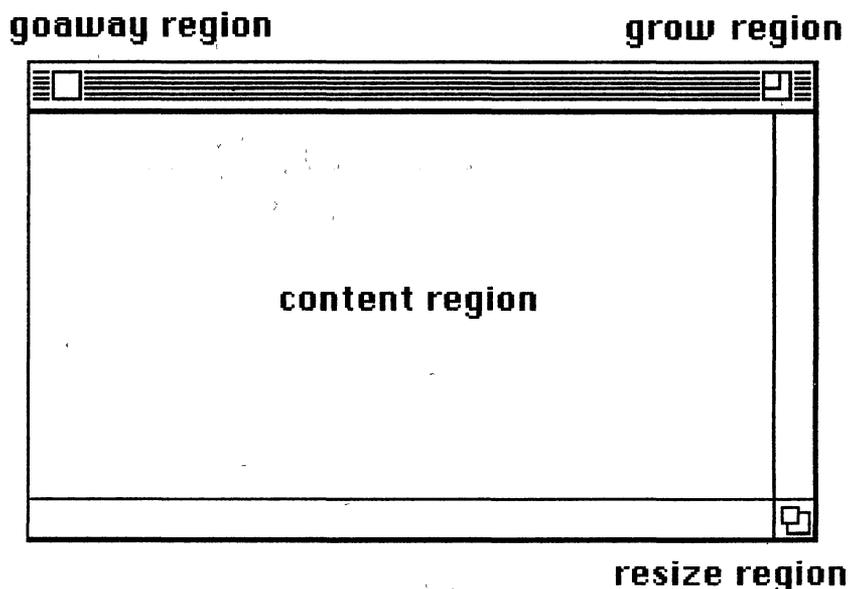


Figure 2.2 Window characteristics that can be accessed from a window record.

If `mouseloc = 1` (i.e. mouse in menu bar) a user written subroutine should be called to display the pull-down menu and to select an item of the pull-down menu. In MacModel, `menus.for` (in Appendix B) is written for that purpose. Once a mouse-down event is detected in the menu bar area, the `Menus` subroutine takes care of displaying the pull-down menus and all the subsequent events.

The `menus` subroutine should first call the `MENUSELECT` function (or the `MENUKEY` function if command-key is hit) of the `toolbx`. `MENUSELECT` keeps control until the mouse button is released, tracking the mouse, pulling down menus as needed, and highlighting the menu item under the mouse cursor. Once the mouse button is released over a highlighted menu item, `MENUSELECT` returns the `menuid` (e.g. of File or Edit). With `menuid` and menu item at hand, the application should execute the desired routine or codes.

## 2.1 Program Structure and Flowchart

MacModel consists of a main routine and several subroutines. Most of the subroutines are executed in correspondence to a menu selection from the menu bar (see Figure 2.3). Each of the main-menu items has sub-menu items associated with it. Following is a brief description of each menu's contents:

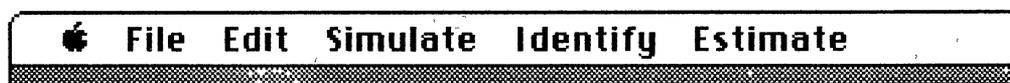


Figure 2.3 MacModel menu bar

🍏: Contains desk accessories. The list of accessories is expanded or reduced according to what is available, in the system folder. See Figure 2.4 for an 🍏 menu.

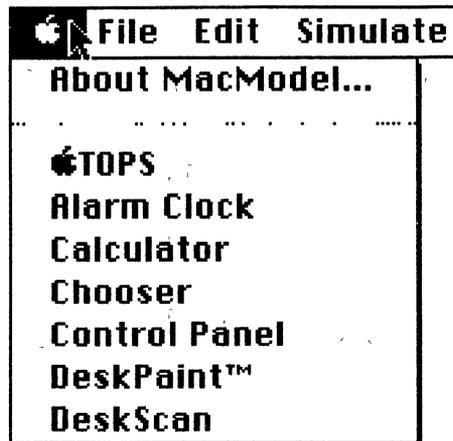


Figure 2.4 An 🍏 menu

**File:** Contains List, Plot, Print Text, Print Graphics, Transfer and Quit. See Figure 2.5.

**List:** Lists a file to screen.

**Plot:** Plots a data file to screen.

**Print Text:** Sends a file (text) to printer.

**Print Graphics:** Sends the last graph or grayscale map to the printer (inactive initially until a graphic operation takes place).

**Transfer:** Allows the user to exit MacModel permanently to another application.

**Quit:** Permanently leaves MacModel and returns to Finder.



Figure 2.5 The File menu

**Edit:** Contains commands to manipulate text. See Figure 2.6.

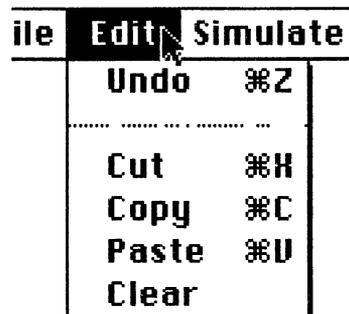


Figure 2.6 The Edit menu

**Simulate:** Contains commands to generate noise, gaussian or uniform, and to simulate ARMA processes. See Figure 2.7.

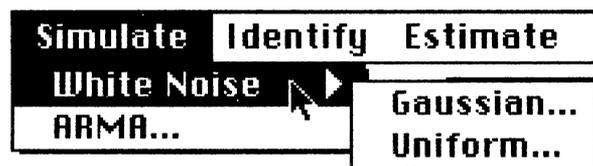


Figure 2.7 The Simulate menu and its submenu

**Identify:** Contains commands to generate autocorrelation,

crosscorrelation and partial autocorrelation sequences as well as commands to generate generalized partial autocorrelation, S-array and R-array. See Figure 2.8.

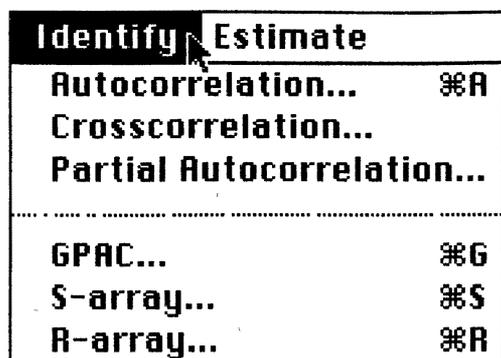


Figure 2.8 The Identify menu

**Estimate:** Contains commands to estimate parameters (using the Maximum Likelihood algorithm) of an ARMA process with known order. See Figure 2.9.



Figure 2.9 The Estimate menu

The main routine is basically divided into four sections which have been discussed previously:

- 1- Type definitions
- 2- Menu initialization and allocation
- 3- Windows creation
- 4- Main event processing loop.

The flowchart of the main program is shown in Figure 2.10

## 2.2 Start-Up and Use

To start up MacModel just select it using the mouse (click twice on the application icon). Make sure that the Macfortran run-time Libraries f77.rl and m81.rl are in the system folder or in the same folder with the application. MacModel is a standard Macintosh application, i.e. it has the same user interface any Macintosh application has.

## 2.3 Expansion of Program

There are two kinds of expansion possible; adding a new menu (pull-down menu), or adding a menu item in an already existing menu.

### 2.3.1 Add a New Menu

Allocate the new menu (in the main program) using the `NEWMENU` function of the `toolbx`, then append the menu items to that menu using `APPENDMENU`. Insert the menu anywhere you desire after the Apple menu. Now in the `menus` subroutine declare the needed variables (the best way to do this is to follow one of the other menu declarations), then insert in the `Case` statement the menu name. Code under the new menu a `Case` statement that has the menu items as the 'Case selectors' (e.g. the Edit menu would have Cut, Copy, Paste... as case selectors). The programmer is responsible for

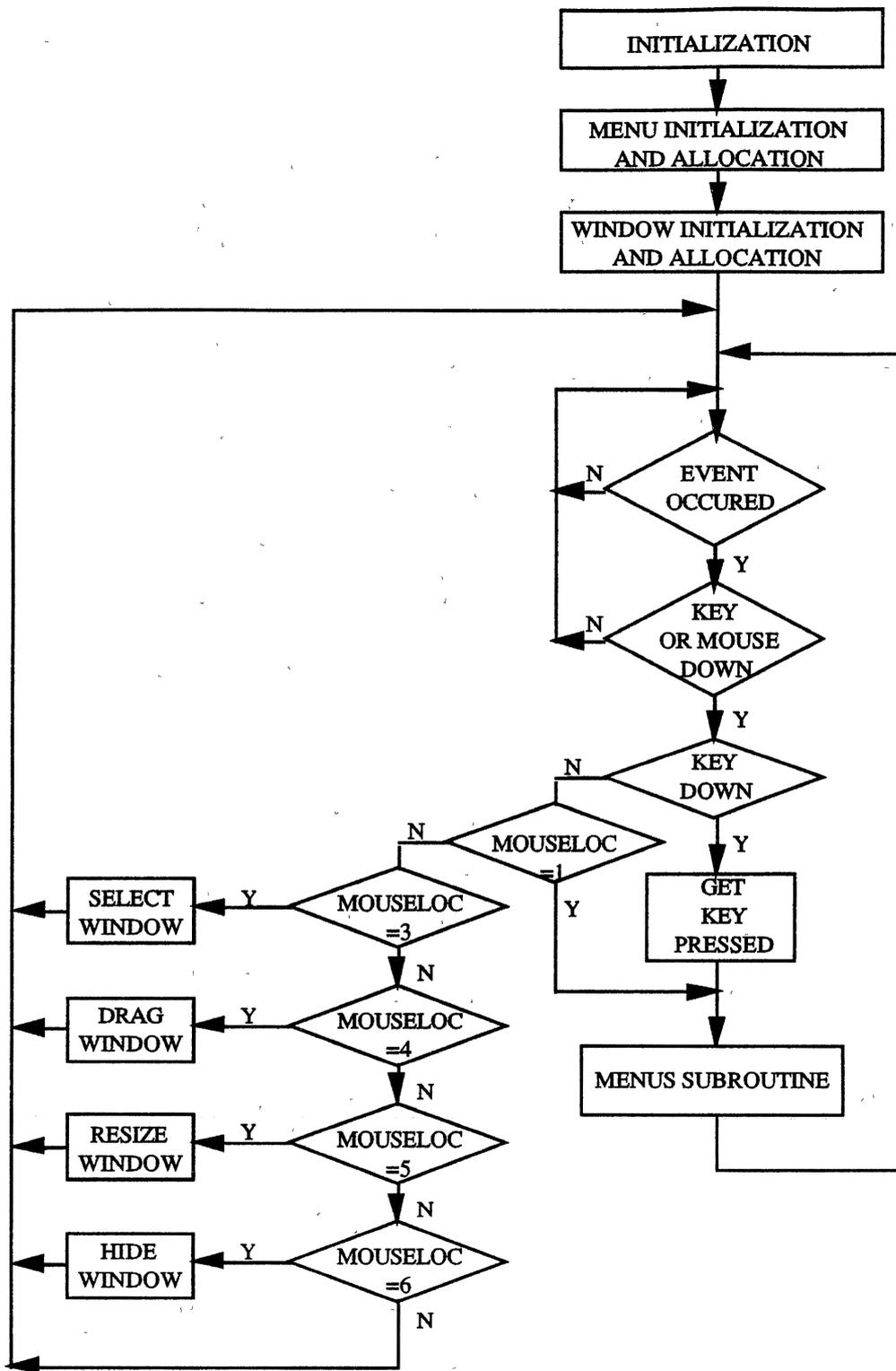


Figure 2.10 The main program flowchart

coding statements, or perhaps calling a subroutine to perform whatever is needed, inside the Case statement.

Let us assume that we want to add a new menu called NewMenu on the menu bar between the File menu and the Edit menu. Also assume that NewMenu has two menu items; Item1 and Item2. The first step is to declare the NewMenu right after the File menu in the main program as shown below

```

menuhandel(8) = toolbox(NEWMENU, 36, str255("NEWMENU"))
call toolbox(APPENDMENU, menuhandel(8),
              str255("Item1/1;Item2"))
call toolbox(INSERTMENU, menuhandel(8),0)

```

the '/1' after Item1 in the second call assigns the keys ⌘1 to this item. The second step is to declare NewMenu in the menu.for subroutine and assign it to 36 (or what ever number you used in the first call above. This number should be unique in the NEWMENU function calls). Then declare Item1 and Item2 and assign them to 1 and 2 as shown

```
parameter(Item1=1,Item2=2) .
```

Now go to the event loop in the menu.for subroutine, and insert between the File and Edit Case statements the following:

```

case(NewMenu )
    case(Item1)
        call do_Item1()
    case(Item2)
        call do_Item2()
end select

```

### 2.3.2 Add a New Item to Existing Menu

Make the appropriate declaration, in the main program, and insert the new menu name where needed (e.g. between List and Plot in the File menu). Then in the menus subroutine (after the appropriate declarations) insert an additional Case selector in the Case statement that follows the menu name. Again code the appropriate statements after the new menu item selector of the Case statement. Let us say we want to add a menu item called Type between List and Plot in the File menu (see Figure 2.4). First make the following change in the main program

```
call toolbox(APPENDMENU, menuhandel(2),str255("List/L;
Type;Plot/P;Print Text;Print Graphics;Transfer;Quit/Q"))
```

Then in the menu.for subroutine change the declaration from

```
parameter (List=1,Plot=2,Print=3,Printg=4,
           Transfer=5,Quit=6)
```

to

```
parameter (List=1,Type=2,Plot=3,Print=4,Printg=5,
           Transfer=6,Quit=7)
```

Finally change the Case statement to

```
case (List)
    call do_list()
case (Type)
    call do_type()
case (Plot)
    call do_plot()
```

## CHAPTER III

### SIMULATION

Simulation is an important part of any system identification package. This chapter introduces the concept of simulation, in addition to instructions on plotting graphics and listing text to the screen or printer. The first menu, in MacModel, after the three standard menus (Apple, File, and Edit) is the Simulate menu. Under this menu, there are commands to simulate noise, Gaussian or Uniform, ARMA, AR, and MA processes. List, Plot and print commands are in the File menu.

#### 3.1 Simulation of Processes

The most basic use of a system description is to simulate the systems response to various input sequences, e.g. an input sequence  $e_t$  chosen by the user is applied to (1.6). Subroutine doarma.for, listed in Appendix B, does the ARMA, AR or MA processes simulation for a maximum AR order of 12 and a maximum MA order of 12. The input of the system is usually a white noise process. The noise is realized via a pseudo random number generator which is generated by subroutine downit.for that is also listed in Appendix B.

A commonly applied procedure that can be regarded as a test of the model validity, is to simulate the system, if feasible, with the actual

input and compare the simulated output with the actual output. Experimenting with models, is perhaps the most common use for simulation especially if the system in question is difficult to experiment on directly, such as aircraft or nuclear power stations.

### 3.2 Simulation Examples Using MacModel

The Simulate menu contains menu entries for generating noise and ARMA processes.

#### 3.2.1 Noise Simulation

Choose "White Noise" from the "Simulate" menu; then select the desired noise distribution from the White Noise submenu. See Figure 3.1.

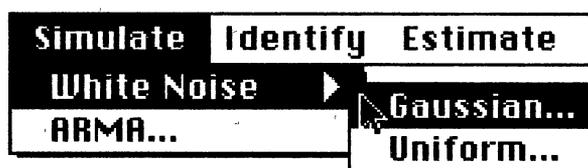
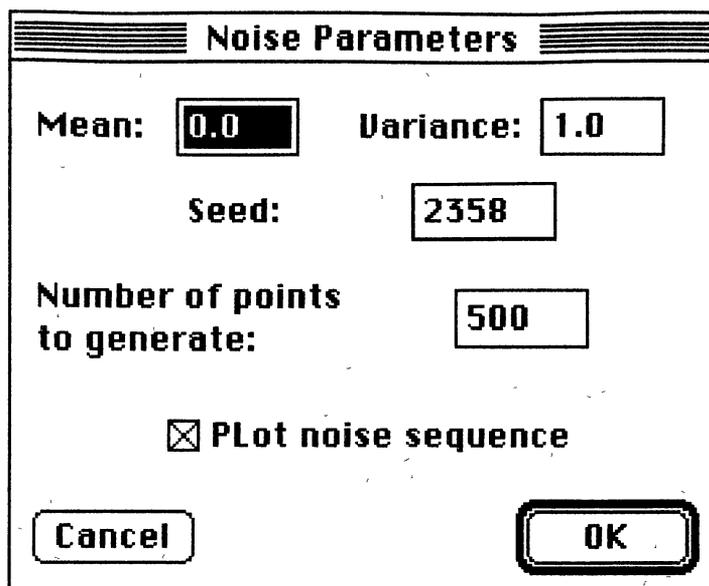


Figure 3.1 Selecting Gaussian noise from the Simulate menu

The user is next presented with the "Noise Parameters" dialog box as depicted in Figure 3.2. The shown values for the variance, mean, seed, and the number of points to be generated are set to the defaults and can be changed. The variance is restricted to be positive, and the maximum number of points is 4000. Exceeding the limit on the number of points causes a dialog box to be displayed



The image shows a dialog box titled "Noise Parameters". It contains several input fields and a checkbox. The "Mean" field is set to 0.0, "Variance" is 1.0, "Seed" is 2358, and "Number of points to generate" is 500. The "Plot noise sequence" checkbox is checked. There are "Cancel" and "OK" buttons at the bottom.

Parameter	Value
Mean:	0.0
Variance:	1.0
Seed:	2358
Number of points to generate:	500
Plot noise sequence	<input checked="" type="checkbox"/>

Figure 3.2 Noise Parameters dialog box

informing the user of the limit and setting the number of points to that limit. The "Plot noise sequence" check box in the Noise Parameters dialog box, if it remains selected, causes the subroutine `dowhit.for` to call subroutine `plot.for` (listed in Appendix B) which in turn plots the noise sequence to the screen as depicted in Figure 3.3. If the OK button is hit, the user is then prompted for saving the noise sequence to a file. If a cancel is hit at this point the sequence will not be saved and the user is given the option to plot it.

Pressing and dragging the lower-right corner of the window titled "Plot" (not the "TTY" window) causes the last graph to be resized and repainted to the screen. If a plot of another process is desired, choose plot from the File menu then select the process file from the File-Input Interface dialog box (see Figure 3.4). The user is next presented with the "Plot Parameters" dialog box and a choice to

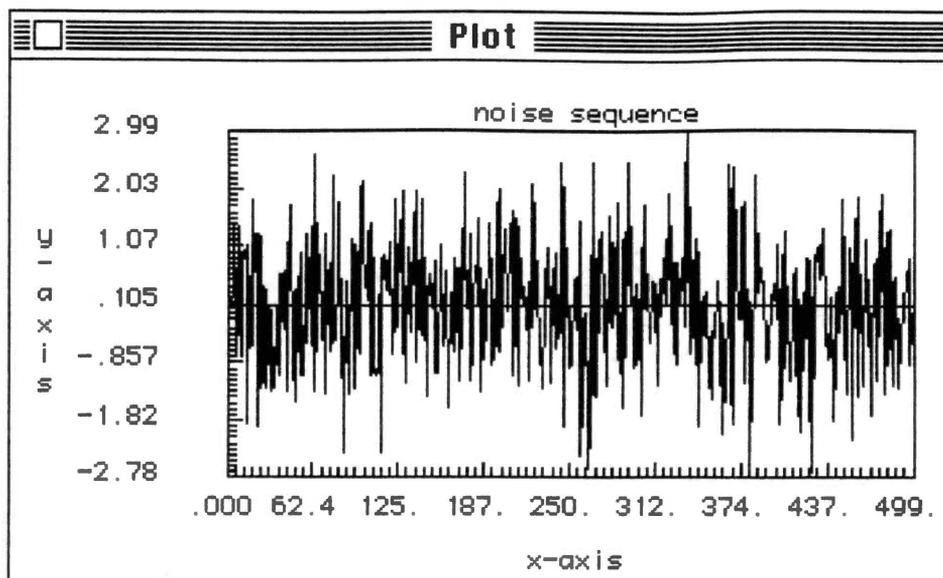


Figure 3.3 A Noise sequence

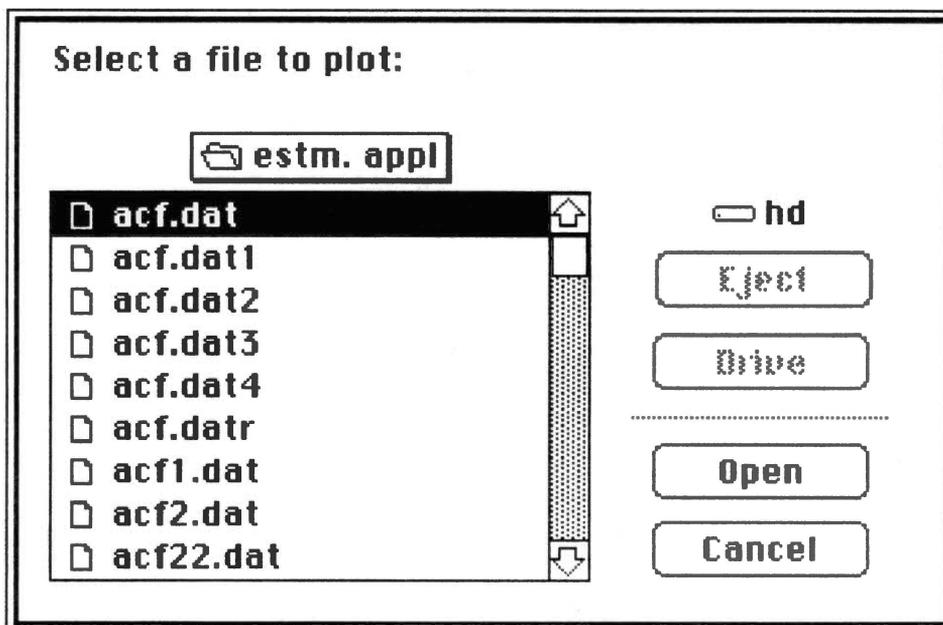


Figure 3.4 The File-Input Interface dialog box

plot any part of the process (see Figure 3.5). Clicking on the OK causes the data points to be plotted to the screen. If a hard copy is

Plot Parameters	
X-axis	Y-axis:
MIN: <input type="text" value=".000"/>	<input type="text" value="-1.73"/>
MAX: <input type="text" value="699."/>	<input type="text" value="1.72"/>
LABEL <input type="text" value="x-axis"/>	<input type="text" value="y-axis"/>
PLOT TITLE: <input type="text" value="noise.dat"/>	
<input type="button" value="Cancel"/>	<input type="button" value="OK"/>

Figure 3.5 Plot Parameters dialog box

desired, choose Print Graphics from the File menu. This should print out the last graph displayed to the Plot window (even if the plot or graph is not currently shown in the window).

A list of the data points to the "TTY" window can be achieved by choosing List from the File menu, then selecting the appropriate data file from the File-Input Interface dialog box (similar to that shown in Figure 3.4). A printout of the data file is accomplished by choosing Print Text from the File menu. The data files generated by MacModel can be edited by any text editor. MacModel can use any data file for plotting as long as it has (x,y) format.

### 3.2.2 ARMA Processes Simulation

ARMA process simulation is carried out in the same manner as the Noise Simulation. Upon choosing "ARMA" from the "Simulate"

menu, the "ARMA parameters" dialog box, containing the ARMA process order,  $p$  and  $q$ , and a plot check box, is displayed (see Figure 3.6).

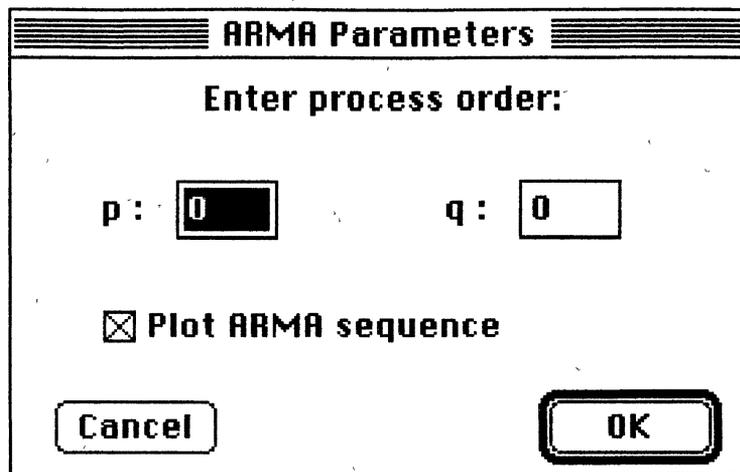


Figure 3.6 ARMA Parameters dialog box

Setting  $p$  to 0 simulates MA processes, and setting  $q$  to 0 simulates AR processes. The "Plot ARMA sequence" check button is dealt with in the same manner as the above mentioned "Plot Noise Sequence" button. Plotting, replotting, listing, printing, and editing the ARMA sequence are also possible, as they were with the noise sequence.

The user is responsible for checking the stability of the process. Unstable processes could cause numeric overflow when used as input to the ACF.

## CHAPTER IV

### MODEL IDENTIFICATION

Chapter I introduced the AR, MA, and ARMA models. Here we shall introduce the Autocorrelation Function (ACF), Partial Autocorrelation Function (PACF), Generalized Partial Autocorrelation function (GPAC) and S and R arrays, which are the tools for preliminary system identification. But first, let us touch on some material that deals with probability and statistical analysis which are crucial to preliminary system identification.

#### 4.1 Preliminary Definitions

##### Expectations (mean and variance):

The mean is defined

$$\begin{aligned}\mu_z &= E[Z] \\ &= \int_{-\infty}^{\infty} z f_z(z) dz\end{aligned}\tag{4.1}$$

where  $f_z$  is the probability density function of  $Z$ , and  $E[ ]$  is the expectation.

In practice, and in the absence of any probability density functions, we use the sample mean as shown in (4.2)

$$\hat{\mu}_z = \frac{1}{N} \sum_{t=1}^N Z_t \quad (4.2)$$

Equation (4.2) is a good estimator if enough independent samples were taken.

The variance is defined

$$\begin{aligned} \sigma_z^2 &= E[(Z_t - \mu_z)^2] \\ &= E[Z_t^2] - \mu_z^2 \end{aligned} \quad (4.3)$$

The sample variance can be expressed as

$$\hat{\sigma}_z^2 = \frac{1}{N-1} \sum_{t=1}^N (Z_t - \hat{\mu}_z)^2 \quad (4.4)$$

A process with constant statistics is said to be a stationary process. This is an important class of processes, and the preliminary system identification discussed in this chapter assumes stationarity. One way of testing for stationarity is by checking if the poles of the process are inside the unit circle. A nonstationary process can also be modeled by assuming some difference of the process to be stationary. Such models are called ARIMA, Autoregressive Integrated Moving Average, and will not be discussed here.

## 4.2 Model Identification Techniques

### 4.2.1 Correlation

The autocovariance of a process  $Z$  is defined

$$\begin{aligned}\gamma_z(k) &= \text{cov}[Z_t, Z_{t+k}] \\ &= E[(Z_t - \mu_z)(Z_{t+k} - \mu_z)]\end{aligned}\tag{4.5}$$

and the autocorrelation as the normalized autocovariance

$$\rho_z(k) = \frac{\gamma_z(k)}{\gamma_z(0)}\tag{4.6}$$

Notice that the autocovariance and autocorrelation functions are functions of the time difference,  $k$ , not the actual time. This is true only for stationary processes.

Some properties of  $\rho_z(k)$  which also apply to  $\gamma_z(k)$

$$\begin{aligned}1- \rho_z(k) &= \rho_z(-k) \\ 2- |\rho_z(k)| &\leq \rho_z(0)\end{aligned}$$

Also we have

$$\begin{aligned}\rho_z(0) &= 1 \\ \gamma_z(0) &= \sigma_z^2\end{aligned}$$

The sample autocovariance is defined as

$$\gamma_z(k) = \frac{1}{N-k} \sum_{t=1}^{N-k} (Z_t - \mu_z)(Z_{t+k} - \mu_z)\tag{4.7}$$

$N$  is the total number of observations.

The crosscovariance is defined

$$\gamma_{zx}(k) = E[(Z_t - \mu_z)(X_{t+k} - \mu_x)] \quad (4.8)$$

where  $X_t$  and  $Z_t$  are assumed to be stationary processes, some of  $\gamma_{zx}$  properties are

- 1-  $\gamma_{zx}(0) = \gamma_{xz}(0)$
- 2-  $\gamma_{zx}(k) = \gamma_{xz}(-k)$
- 3-  $|\gamma_{zx}(k)| \leq \sqrt{\gamma_z(0)\gamma_x(0)}$

If  $X_t$  and  $Z_t$  are two independent processes, then

$$\gamma_{zx}(k) = 0$$

The sample crosscovariance is defined as

$$\hat{\gamma}_{zx}(k) = \frac{1}{N-k} \sum_{t=1}^{N-k} (Z_t - \mu_z)(Z_{t+k} - \mu_z) \quad (4.9)$$

The sample autocorrelation and crosscorrelation algorithms are implemented in subroutine corlat.for which is listed in appendix B.

Consider the moving average process of (1.4) (where  $e_t$  is a white gaussian noise, i.e.  $\rho_e(k) = 0$  for all  $k \neq 0$  and  $\rho_e(k) = \sigma_e^2$  for  $k=0$ )

$$Z_t = e_t - \theta_1 e_{t-1} - \dots - \theta_q e_{t-q}$$

Also consider a shifted version of (1.4)

$$Z_{t-k} = e_{t-k} - \theta_1 e_{t-1-k} - \dots - \theta_q e_{t-q-k}$$

Now take the expectation of  $Z_t Z_{t-k}$ . We get (assuming  $\mu_e=0$ )

$$\begin{aligned} \gamma_z(k) &= E[Z_t Z_{t-k}] = E[(e_t - \theta_1 e_{t-1} - \dots - \theta_q e_{t-q})(e_{t-k} - \theta_1 e_{t-1-k} - \dots - \theta_q e_{t-q-k})] \\ \gamma_z(k) &= \begin{cases} \sigma_e^2(-\theta_k + \theta_1 \theta_{k+1} + \dots + \theta_{q-k} \theta_q) & k = 1, 2, \dots, q \\ \sigma_e^2(1 + \theta_1^2 + \dots + \theta_q^2) & k = 0 \end{cases} \end{aligned} \quad (4.10)$$

Keeping in mind that  $e_t$  is white gaussian noise with zero mean, it can be easily shown that for an MA(q) process

$\begin{aligned} \gamma_z(k) &= 0 & k > q \\ \rho_z(k) &= 0 & k > q \end{aligned}$	(4.11)
--	--------

Equation (4.11) is very important because it indicates that any process with  $\rho_z(k)$ , or  $\gamma_z(k)$ , zero after certain time lag  $k = q$ , can be modeled as an MA(q) process. Figure (4.1) shows example of an autocorrelation function of an MA(2) process.

Now let us examine the autoregressive process (1.1)

$$Z_t = \phi_1 Z_{t-1} + \dots + \phi_p Z_{t-p} + e_t$$

A significant property, shown below, of the autocorrelation function

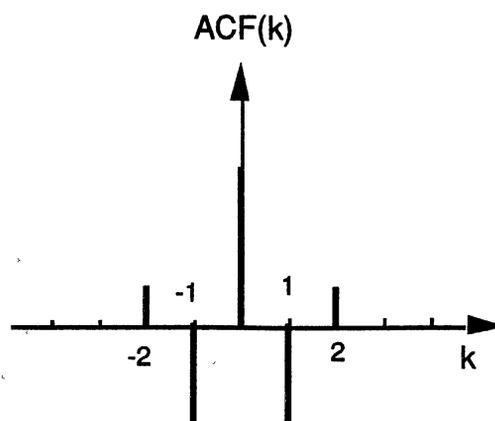


Figure 4.1 ACF of an MA(2) process

of the AR process is that it satisfies the same difference equation as does the AR process. By multiplying both sides of (1.1) by  $Z_{t-k}$  and taking the expectation we get

$$\gamma_z(k) = \phi_1 \gamma_z(k-1) + \dots + \phi_p \gamma_z(k-p) + \gamma_{z\epsilon}(k)$$

but

$$\gamma_{z\epsilon}(k) = 0 \quad k > 0$$

because  $Z_t$  is dependent on present value of  $e_t$  only, and because  $e_t$  is white. The above equations lead to

$\gamma_z(k) - \phi_1 \gamma_z(k-1) - \dots - \phi_p \gamma_z(k-p) = 0 \quad k > 0$	(4.12)
$\rho_z(k) - \phi_1 \rho_z(k-1) - \dots - \phi_p \rho_z(k-p) = 0 \quad k > 0$	

Equations (4.12) for  $k=1, 2, 3, \dots$  are called the Yule-Walker equations and they shall come up later in our definitions and derivations.

### 4.2.2 Partial Autocorrelation Function (PACF)

Using the Yule-Walker equations, the PACF sequence can be defined as

$$\begin{bmatrix} \rho_z(0) & \rho_z(1) & \cdots & \rho_z(k-1) \\ \rho_z(1) & \rho_z(0) & \cdots & \rho_z(k-2) \\ \vdots & \vdots & \ddots & \vdots \\ \rho_z(k-1) & \rho_z(k-2) & \cdots & \rho_z(0) \end{bmatrix} \begin{bmatrix} \phi_{k1} \\ \phi_{k2} \\ \vdots \\ \phi_{kk} \end{bmatrix} = \begin{bmatrix} \rho_z(1) \\ \rho_z(2) \\ \vdots \\ \rho_z(k) \end{bmatrix} \quad (4.13)$$

Let  $\phi_{kk}$  be the PACF by definition. Solving for the PACF using the above Yule-Walker equations and Cramer's rule we get

$$\phi_{11} = \frac{\rho_z(1)}{\rho_z(0)}$$

$$\phi_{22} = \frac{\begin{vmatrix} \rho_z(0) & \rho_z(1) \\ \rho_z(1) & \rho_z(2) \end{vmatrix}}{\begin{vmatrix} \rho_z(0) & \rho_z(1) \\ \rho_z(1) & \rho_z(0) \end{vmatrix}}$$

In general  $\phi_{kk}$  is nonzero for  $k \leq p$  and zero otherwise. Also  $\phi_{pp} = \phi_p$ , the last parameter in the AR process. Let us look at an example identifying an AR(1) process using the PACF

#### Example 4.2.2.1

$$Z_t = 0.5 Z_{t-1} + e_t \quad \sigma_e^2 = 1$$

The ACF sequence for this process is

$$\rho_k(k) = 1, .5, .25, .125, \dots \quad k = 0, 1, 2, 3, \dots$$

We know from (4.12) that the autocorrelation satisfies the above

difference equation. So we get

$$\rho_t(k) = 0.5 \rho_t(k-1) \quad k > 0$$

Now let us calculate the PACF sequence

$$\phi_{11} = \frac{.5}{1}$$

$$\phi_{22} = \frac{\begin{vmatrix} 1 & .5 \\ .5 & .25 \end{vmatrix}}{\begin{vmatrix} 1 & .5 \\ .5 & 1 \end{vmatrix}} = \frac{0}{.75} = 0$$

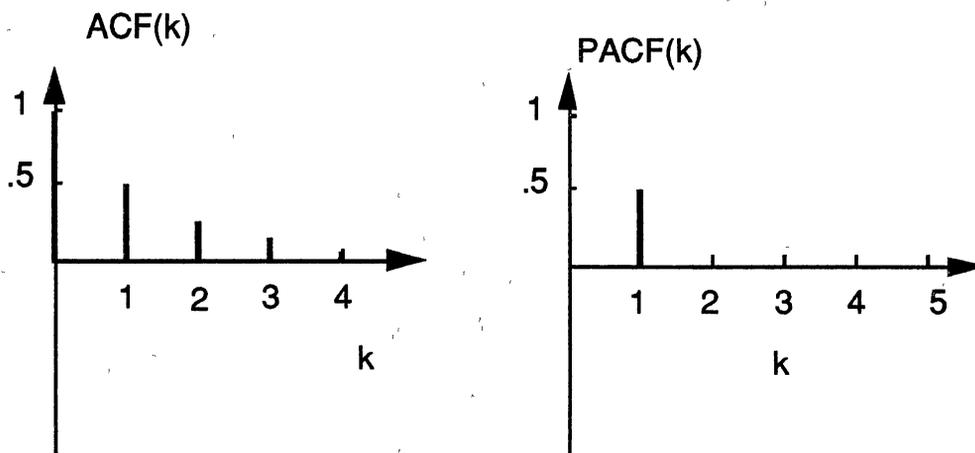


Figure 4.2 ACF and PACF of the AR(1) process in Example 4.2.2.1

This indicates that, theoretically at least, it suffices to examine the PACF to identify an AR process. The PACF function can be obtained recursively using Levinson's algorithm. Subroutine `pacf.for` contains the code for the algorithm and is listed in appendix B.

### 4.2.3 Generalized Partial Autocorrelation

#### Function (GPAC)

The previous two sections showed that it suffices to examine the ACF to identify an MA(q) process. Whereas for AR(p) processes it was enough to examine the PACF. For ARMA identification the GPAC is utilized. The GPAC is an extension of the PACF, in fact the first row of the GPAC is the PACF sequence. Using the actual autocorrelation sequence in the GPAC calculations, one can uniquely determine the order of a stationary process. The Yule-Walker equations are also used here to produce the GPAC array.

By multiplying both sides of (1.6) by  $Z_{t-k}$  and taking the expectation we get

$$\gamma_z(k) = \phi_1 \gamma_z(k-1) + \dots + \phi_p \gamma_z(k-p) + \gamma_{z\theta}(k) - \theta_1 \gamma_{z\theta}(k-1) - \dots - \theta_q \gamma_{z\theta}(k-q)$$

It can be easily shown that (discussions here apply to the autocovariance as well as to the autocorrelation)

$\rho_z(k) - \phi_1 \rho_z(k-1) - \dots - \phi_p \rho_z(k-p) = 0 \quad k > q$	(4.14)
---	--------

This is an important equation because it shows that the ACF sequence, for  $k > q$ , satisfies the difference equation of the AR part of the process (i.e. only the  $(q+1)^{\text{st}}$  and following of the Yule-Walker equations are satisfied).

Consider the following definitions

$$B(k,j) = \begin{bmatrix} \rho_z(j) & \rho_z(j-1) & \cdots & \rho_z(j-k+1) \\ \rho_z(j+1) & \rho_z(j) & \cdots & \rho_z(j-k+2) \\ \vdots & \vdots & \ddots & \vdots \\ \rho_z(j+k-1) & \rho_z(j+k-2) & \cdots & \rho_z(j) \end{bmatrix}$$

$$\phi(k,j) = \begin{bmatrix} \phi_{k1}^j \\ \phi_{k2}^j \\ \vdots \\ \phi_{kk}^j \end{bmatrix} \quad \rho(k,j) = \begin{bmatrix} \rho_z(j+1) \\ \rho_z(j+2) \\ \vdots \\ \rho_z(j+k) \end{bmatrix}$$

and let  $A(k,j)$  be equal  $B(k,j)$  with the last column replaced by  $\rho(k,j)$ . Using Cramer's rule the generalized partial autocorrelation function (GPAC) is defined

$$\phi_{kk}^j = \frac{|A(k,j)|}{|B(k,j)|}$$

where  $\phi_{kk}^j$  is the last autoregressive coefficient of an assumed ARMA(k,j) process. For an ARMA(p,q) process

$$\phi_{kk}^q = 0 \quad k > p \quad (4.15)$$

$$\phi_{kk}^q = \phi_p \quad k = p \quad (4.16)$$

For an ARMA(p,q) process we could use  $q+1$  through  $p+q$  of the Yule-Walker equations (4.12) to solve for the AR parameters. We could also use equations  $q+i$  through  $p+i+q$  to solve for the same parameters which would lead to

$$\phi_{pp}^j = \phi_p \quad j \geq q \quad (4.17)$$

Now if we were to construct an array, the GPAC array, using  $j = 0, 1, 2, \dots$  and  $k = 1, 2, \dots$ , it would have the patterns (as indicated by (4.15), (4.16), (4.17)) shown in Table 4.1.

	1	...	p-1	p	p+1	p+2
0	$\phi_{11}^0$	...	$\phi_{p-1,p-1}^0$	$\phi_{pp}^0$	$\phi_{p+1,p+1}^0$	$\phi_{p+2,p+2}^0$
:	:		:	:	:	:
q-1	$\phi_{11}^{q-1}$	...	$\phi_{p-1,p-1}^{q-1}$	$\phi_{pp}^{q-1}$	$\phi_{p+1,p+1}^{q-1}$	$\phi_{p+2,p+2}^{q-1}$
q	$\phi_{11}^q$	...	$\phi_{p-1,p-1}^q$	$\phi_p$	0	0
q+1	$\phi_{11}^{q+1}$	...	$\phi_{p-1,p-1}^{q+1}$	$\phi_p$	$u^*$	$u$
q+2	$\phi_{11}^{q+2}$	...	$\phi_{p-1,p-1}^{q+2}$	$\phi_p$	$u$	$u$

$u^* = \text{undefined}$

Table 4.1 GPAC array patterns

At this point it is instructive to look at an example identifying an ARMA(1,1) process.

#### Example 4.2.3.1

$$Z_t - 0.5 Z_{t-1} = e_t - 0.8 e_{t-1} \qquad \sigma_e^2 = 1$$

Using (4.14) we get

$$\rho_z(k) = 0.5 \rho_z(k-1) \qquad k > 1$$

The actual autocorrelation is

$$\rho_z(k) = 1, -.214, -.107, -.054, \dots \qquad k = 1, 2, \dots$$

calculating the GPAC leads to Table 4.2.

q \ p	1	2	3
0	-.214	-.16	-.124
1	.5	0	0
2	.5	0/0	0/0

Table 4.2 GPAC for ARMA(1,1)

$$Z_t - .5 Z_{t-1} = e_t - .8 e_{t-1}$$

Notice that the pattern is unique and clear when using the actual autocorrelation sequence.

Example 4.2.3.2 (from [2])

$$Z_t - 1.5 Z_{t-1} + 1.21 Z_{t-2} - .455 Z_{t-3} = e_t + .2 e_{t-1} + .9 e_{t-2}$$

Table 4.3 gives the GPAC of the above process. It is clear that this process is ARMA(3,2). The AR order,  $p$ , is seen to be 3 because  $\phi^2_{33}$ ,  $\phi^3_{33}$ , ... are equal and  $q$  must be 2 because of the zero pattern. The  $u$  pattern ( $u$  is actually 0/0, and in practice, where the autocorrelation is estimated, is a mix of large and small numbers) is also clear.

The GPAC can be calculated recursively using the  $S$  and  $R$  arrays. This will be discussed in the next section.

q \ p	1	2	3	4	5	6	7
0	.845	-.706	.414	.299	-.304	-.145	.245
1	.606	-.458	.836	.683	-.434	-.646	.279
2	.391	-.070	.455	.000	.000	.000	.000
3	.328	2.073	.455	u*	u	u	u
4	1.356	-.119	.455	u	u	u	u
5	1.632	5.367	.455	u	u	u	u

u\* = undefined

Table 4.3 GPAC of the above ARMA(3,2)

#### 4.2.4 S and R Arrays

In the previous sections, we described time series utilizing the autocorrelation function. Gray and Foster [3] and Gray, Morgan and Houston [4] suggested an equivalent description of series utilizing the power spectrum which is based on a numerical technique called the  $G_n$  transform. The S and R arrays appear in the process of calculating the G-spectral estimator, and it is these (S and R) that are utilized for order estimation. This is explicitly discussed in Gray, Kelley, and McIntire [5], where they demonstrated this new approach of ARMA modeling.

A mathematical proof of this method is in [5]. Now let's list the S and R arrays as they are defined in [5].

Definition: Let  $m$  be an integer,  $h > 0$ , and  $f$  be a real-valued function. Also let  $f_m = f(mh)$ ,

$$H_n [f_m] = \begin{vmatrix} f_m & f_{m+1} & \cdots & f_{m+n-1} \\ f_{m+1} & f_{m+2} & \cdots & f_{m+n} \\ \vdots & \vdots & \ddots & \vdots \\ f_{m+n-1} & f_{m+n} & \cdots & f_{m+2n-2} \end{vmatrix} \quad (4.18)$$

$$H_0 [f_m] \equiv 1$$

and

$$H_{n+1} [\uparrow f_m] = \begin{bmatrix} 1 & 1 & \cdots & 1 & 1 \\ f_m & f_{m+1} & \cdots & f_{m+n-1} & f_{m+n} \\ f_{m+1} & f_{m+2} & \cdots & f_{m+n} & f_{m+n+1} \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ f_{m+n-1} & f_{m+n} & \cdots & f_{m+2n-2} & f_{m+2n-1} \end{bmatrix} \quad (4.19)$$

then define

$$R_n(f_m) = \frac{H_n[f_m]}{H_{n+1}[\uparrow f_m]} \quad (4.20)$$

and

$$S_n(f_m) = \frac{H_{n+1}[\uparrow f_m]}{H_n[f_m]} \quad (4.21)$$

Pye and Atchinson [6] have shown that  $R_n(f_m)$  and  $S_n(f_m)$  can be calculated recursively by the following relations. Define

$$S_0(f_m) = 1 \quad m=0, \pm 1, \pm 2, \dots$$

$$R_1(f_m) = f_m \quad m=0, \pm 1, \pm 2, \dots$$

then

$$R_{n+1}(f_m) = R_n(f_{m+1}) \left[ \frac{S_n(f_{m+1})}{S_n(f_m)} - 1 \right] \quad (4.22)$$

and

$$S_n(f_m) = S_{n-1}(f_{m+1}) \left[ \frac{R_n(f_{m+1})}{R_n(f_m)} - 1 \right] \quad (4.23)$$

for  $n = 1, 2, \dots$  and  $m = 0, \pm 1, \pm 2, \dots$

Subroutine `gpac.for` in appendix B has the code for the above algorithm. In the following discussion it is assumed that the process in discussion is stationary and that  $\rho_m = \rho(m)$  is the autocorrelation as defined in (4.6).

Theorem 2 in [5] simply states that for an ARMA (p,q)

$$\begin{aligned} S_n(\rho_m) &= c_1 \\ S_n(\rho_{m_0-1}) &\neq c_1 \end{aligned} \quad m > m_0$$

iff  $n = p$  and  $m_0 = q - p + 1$ . Moreover,

$$c_1 = (-1)^p \left[ 1 - \sum_{k=1}^p \phi_k \right]$$

where  $\phi_k$ 's are the parameters of the AR part.

Theorem 3 in [5] states under the conditions of Theorem 2

$$\begin{aligned} S_n(\rho_m) &= c_2 \\ S_n(\rho_{m_1+1}) &\neq c_2 \end{aligned} \quad m \leq m_1$$

iff  $n = p$  and  $m_1 = -q-p$ . Moreover

$$c_2 = -\frac{c_1}{\phi_p}$$

Theorem 4 and 5 in [5] states that under the conditions of theorem 2 and replacing  $\rho_m$  by  $(-1)^m \rho_m$ ; we would get the same patterns as specified in theorem 2 and 3 with  $c_1$  and  $c_2$  replaced by  $c_3$  and  $c_4$ .

$$c_3 = (-1)^p \left( 1 - \sum_{k=1}^p (-1)^k \phi_k \right)$$

$$c_4 = (-1)^{p+1} \frac{c_3}{\phi_p}$$

Corollary 1 in [5], under the conditions of theorem 2, states

$$R_{n+1}((-1)^m \rho_m) = R_{n+1}(\rho_m) = 0 \quad m \geq m_0, m \leq m_1 - 1$$

and

$$R_{n+1}(\rho_{q-p}) \neq 0$$

$$R_{n+1}(\rho_{-q-p}) \neq 0$$

$$R_{n+1}((-1)^{q-p} \rho_{q-p}) \neq 0$$

$$R_{n+1}((-1)^{-q-p} \rho_{-q-p}) \neq 0$$

iff  $n=p$ ,  $m_0=q-p+1$  and  $m_1=-q-p-1$ . Table 4.4 and 4.5 show, respectively, the S and R array computed using (4.22) and (4.23).

$m \setminus n$	1	...	p	p+1
$-l$	$S_1(-l)$	...	$c_2$	$u^*$
$-l+1$	$S_1(-l+1)$	...	$c_2$	$u$
$\vdots$	$\vdots$		$\vdots$	$\vdots$
$-q-p-2$	$S_1(-q-p-2)$	...	$c_2$	$u$
$-q-p-1$	$S_1(-q-p-1)$	...	$c_2$	$\pm\infty$
$-q-p$	$S_1(-q-p)$	...	$c_2$	{2q non-
$\vdots$	$\vdots$		{2q non-	{constants
$q-p$	$S_1(q-p)$	...	{constants	$-c_1$
$q-p+1$	$S_1(q-p+1)$	...	$c_1$	$u$
$\vdots$	$\vdots$		$\vdots$	$\vdots$
$j$	$S_1(j)$	...	$c_1$	$u$

$$u^* = c_2 \begin{bmatrix} 0 \\ 0 \end{bmatrix} - 1$$

Table 4.4 S Array

$m \setminus n$	1	...	p	p+1
$-l$	$\rho_1(-l)$	...	$R_1(-l)$	0
$-l+1$	$\rho_1(-l+1)$	...	$R_1(-l+1)$	0
$\vdots$	$\vdots$		$\vdots$	$\vdots$
$-q-p-2$	$\rho_1(-q-p-2)$	...	$R_1(-q-p-2)$	0
$-q-p-1$	$\rho_1(-q-p-1)$	...	$R_1(-q-p-1)$	0
$-q-p$	$\rho_1(-q-p)$	...	$R_1(-q-p)$	Nonzero
$\vdots$	$\vdots$		$\vdots$	Nonzero
$q-p$	$\rho_1(q-p)$	...	$R_1(q-p)$	Nonzero
$q-p+1$	$\rho_1(q-p+1)$	...	$R_1(q-p+1)$	0
$\vdots$	$\vdots$		$\vdots$	$\vdots$
$j$	$\rho_1(j)$	...	$R_1(j)$	0

$$u^* = c_2 \begin{bmatrix} 0 \\ 0 \end{bmatrix} - 1$$

Table 4.5 R Array

$m \setminus n$	1	...	p	p+1
$-\ell$	$S_1(-\ell)$	...	$c_2$	$u^*$
$-\ell+1$	$S_1(-\ell+1)$	...	$c_2$	$u$
$\vdots$	$\vdots$		$\vdots$	$\vdots$
$-q-2$	$S_1(-q-2)$	...	$c_2$	$u$
$-q-1$	$S_1(-q-1)$	...	$c_2$	$\pm\infty$
$\vdots$	$\vdots$	...	{2q non-	{2q non-
$q-1$	$S_1(q-1)$	...	{constants	{constants
$q$	$S_1(q)$	...	$c_1$	$-c_1$
$q+1$	$S_1(q+1)$	...	$c_1$	$u$
$\vdots$	$\vdots$		$\vdots$	$\vdots$
$j$	$S_1(j)$	...	$c_1$	$u$

$$u^* = c_2 \begin{bmatrix} 0 \\ 0 \\ -1 \end{bmatrix}$$

Table 4.6 Shifted S Array

Woodward and Gray [2] suggest the use of the shifted S & R arrays, which is basically shifting the  $(i+1)^{\text{th}}$  column  $i-1$  times downward. Table 4.6 shows the shifted S array

The S array for the ARMA(3,2) of Example 4.2.3.2 is given in Table 4.7. An ARMA(3,2) can be easily identified from this array

The relationship between the GPAC and the S and R arrays is best described in [2] and is regulated by

$$\phi_{kk}^j = \frac{-S_k(p_{-k+j+1})}{S_k(p_{-k-j})} \quad (4.24)$$

m \ n	1	2	3	4	5	6
-6	-1.613	1.247	-9.154			
-5	-1.737	23.860	-9.154	u*		
-4	-4.052	2.915	-9.154	u	u	
-3	-3.556	22.437	-9.154	$\pm\infty$	$\pm\infty$	$\pm\infty$
-2	-2.651	5.686	-7.573	1.470	6.806	-7.911
-1	-2.184	4.456	-10.750	-10.450	7.143	65.674
0	-1.845	3.148	-4.452	3.122	-2.173	2.489
1	-1.606	2.606	-6.334	-1.004	-3.527	-1.090
2	-1.391	1.578	-4.165	4.165	-4.165	4.165
3	-1.328	-6.044	-4.165	u	u	
4	-2.356	2.838	-4.165	u		
5	-2.632	-6.691	-4.165			

u\* = undefined

Table 4.7 The shifted S array of ARMA(3,2) in Example 4.2.3.2

The S and R arrays can provide clearer patterns than the GPAC (as will be shown next), and they can also, along with the GPAC, be extended to the complex variable case, Using different frequencies to obtain more flexibility. For instance,  $(-1)^m \rho_m = e^{j\pi m} \rho_m$  satisfies (4.14), In fact  $\rho_m e^{j2\pi f m}$  (where f is the frequency) will always satisfy (4.14) [7]. S and R arrays have complex entries for  $f \neq 0.5n$  ( $n=0,1,2,\dots$ ).

The following example illustrates why sometimes the S array provides more information than the GPAC. Consider the ARMA(2,1) process [2]

$$Z_t - 0.5 Z_{t-1} + 0.5 Z_{t-2} = e_t - e_{t-1}$$

Table 4.8 shows the GPAC of the above ARMA using the actual autocorrelation sequence. We notice that the  $\phi_p$  pattern starts in row zero rather than in the row one suggesting that the process might be ARMA(1,1). But the zero pattern, in row one, correctly identifies the process as ARMA(2,1). Practically, when using the sample ACF, it is difficult to recognize the small entries in row zero as nonzero numbers. In the S array of Table 4.9 there is little doubt that the process in question is ARMA(2,1).

#### 4.3 Using MacModel for ACF, CCF, PACF, GPAC, S array, and R array

##### 4.3.1 Example on ACF

To calculate the sample autocorrelation sequence, choose "Autocorrelation" under the "Identify" menu as shown in Figure 4.3.

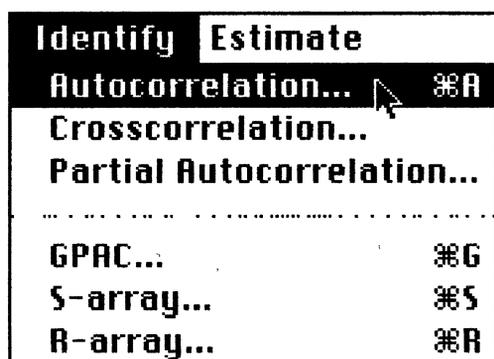


Figure 4.3 Selection of the Autocorrelation menu

q \ p	1	2	3	4	5	6
0	0.0	-.5	-.333	-.25	-.2	.1.67
1	$-\infty$	-.5	0.0	0.0	0.0	0.0
2	.5	-.5	u	u	u	u
3	-.5	-.5	u	u	u	u
4	1.5	-.5	u	u	u	u

Table 4.8 GPAC of an ARMA(2,1)

m \ n	2
-5	2
-4	2
-3	2
-2	2
-1	3
0	1.5
1	1
2	1
3	1
4	1

Table 4.9 Column 2 of the shifted S array of an ARMA(2,1)

Then you will be prompted for the number of lags needed. The number of lags defaults to 20, but can be as high as 1000 (Entering a number higher than 1000 for the lags, results in a display of a dialog box informing you of the limit and that the number of lags is set to that limit). The option "Plot ACF sequence" is preselected, if you wish not to plot the sequence, click once on the check box. Next you will be prompted for the input file and then for the output file. Figure 4.4 shows the ACF of an ARMA(2,1).

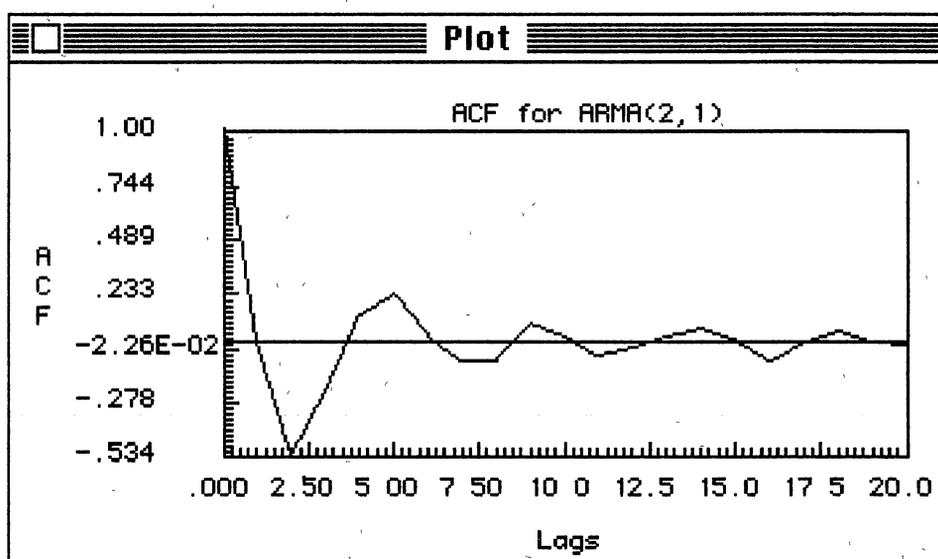


Figure 4.4 ACF of an ARMA(2,1)

#### 4.3.2 Example of CCF

To calculate the crosscorrelation sequence, select the "Crosscorrelation" from the "Identify" menu as in Figure 4.5. The rest of the procedure is identical to that of the ACF with the exception of an extra input file. The order of the input files is

Identify	Estimate
Autocorrelation...	⌘A
Crosscorrelation...	
Partial Autocorrelation...	
.....	
GPAC...	⌘G
S-array...	⌘S
R-array...	⌘R

Figure 4.5 Selection of the Crosscorrelation menu

important since  $\gamma_{zx} \neq \gamma_{xz}$ . Figure 4.6 has the result of crosscorrelating the same ARMA process used in the ACF example with itself.

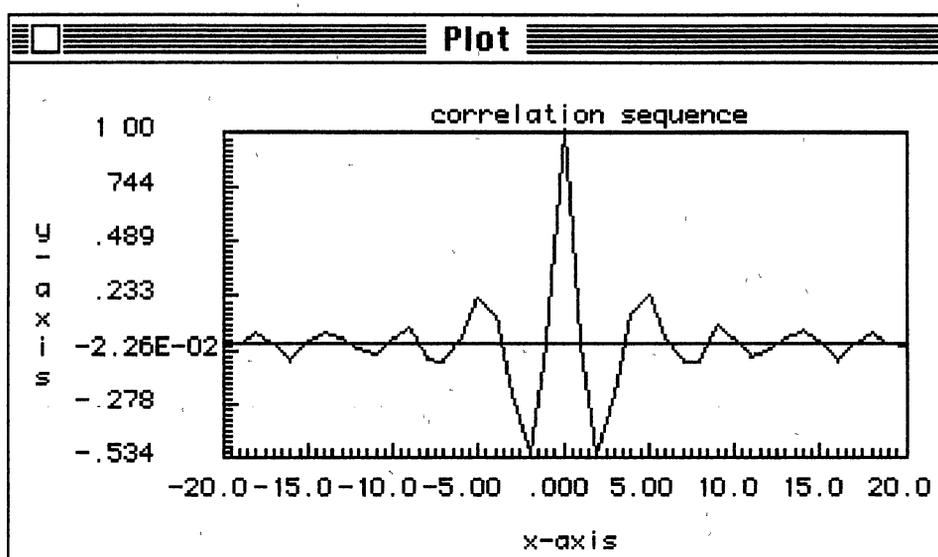


Figure 4.6 CCF of an ARMA(2,1)

### 4.3.3 Example of PACF

The process used in here is the same one used in Example 4.2.2.1. choose "Partial Autocorrelation" in the "Identify" menu (see Figure 2.8), then you will be prompted for the number of PACF lags.

Again a maximum of 1000 lags is allowed. The program will then prompt you for the ACF input file (If the number of PACF lags requested is not less than the number of the ACF lags, a dialog box will be displayed to inform you of the maximum number of lags allowed for the selected ACF sequence). If the Plot PACF sequence was checked, the results would be displayed to the screen as in Figure 4.7.

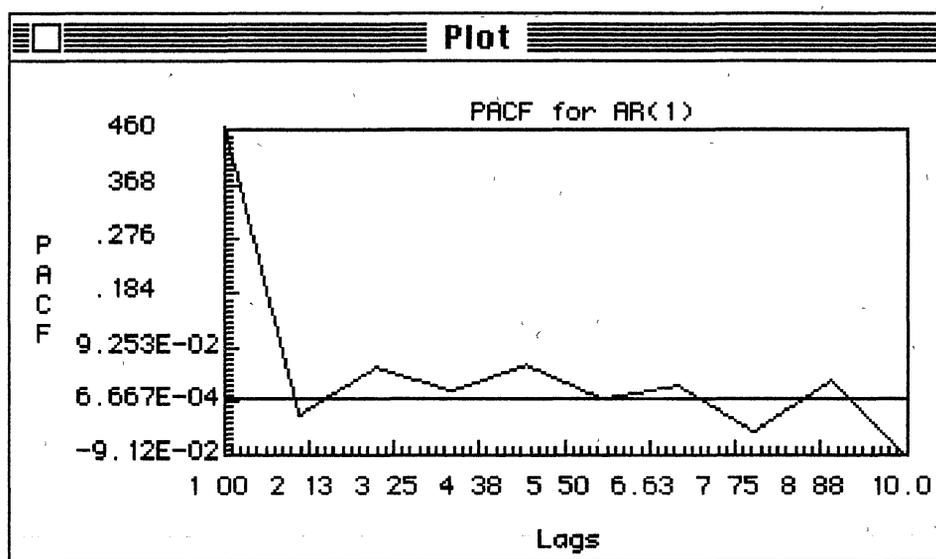


Figure 4.7 PACF of the process in Example 4.2.2.1

#### 4.3.4 Grayscale Map and Examples on GPAC,

##### S Array, and R Array

After calculating the arrays ( GPAC, S, or R) the gpac.for subroutine calls the plotgsr.for subroutine. The plotgsr.for routine takes the array just calculated then prompts the user for parameters to map the array numbers to one of the 15 graylevels that it has. Plotgsr.for uses one of two functions to map the arrays: Sigmoid or

Linear.

### Sigmoid

The Sigmoid uses the equation in Figure 4.8. The variable  $x$ , in Figure 4.8, is an array entry and  $y$  is the new mapped entry. The  $a$  and  $b$  variables are the sigmoid function parameters. Selecting  $a$  and  $b$  is crucial because they control graylevel resolution. A low value for  $a$  will place relatively close entries in the array in the same graylevel bin. On the other hand, a higher value for  $a$  might place these same entries in different bins. One would choose  $a$  to be inversely proportional to the standard deviation of the array. Select  $b$  so that the data effectively uses the grayscale. The best value for  $b$  might be around the mean of the array. The default values for  $b$  and  $a$  will be the mean and  $1/\text{std}$  respectively.

$$y = \frac{1}{1 + e^{-a(x-b)}}$$

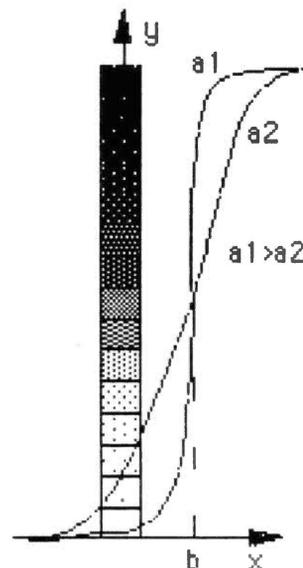


Figure 4.8 Equation and graylevel of the Sigmoid function

## Linear

This Linear function maps the values of the array from the interval  $[a,b]$  to the graylevels. Its also clips the entries of the array to a minimum of  $\min(a,b)$  and a maximum of  $\max(a,b)$ . Figure 4.9 shows the Equation and the graylevel of the linear function.

$$y = \frac{14}{b-a}(x-a)+1$$

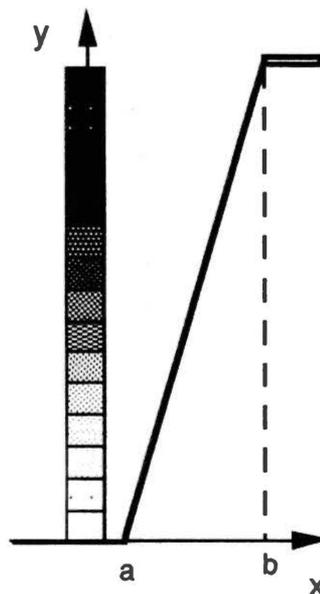


Figure 4.9 Equation and graylevel of the linear function

Choosing  $a$  and  $b$  close in value will increase the resolution of the graylevel inside  $[a,b]$ . Keep in mind, however, for this to be effective  $(a+b)/2$  should be close to the mean. The default values for  $a$  and  $b$  will be the mean  $\pm$  the standard deviation.

After displaying the graylevel map, `plotgsr` displays a dialog box (see Figure 4.10) for adjusting  $a$  and  $b$ . At this point  $a$  and  $b$  can redrawn. The magnitude of the increments can be adjusted interactively. When the grayscale map is satisfactory the "Done"

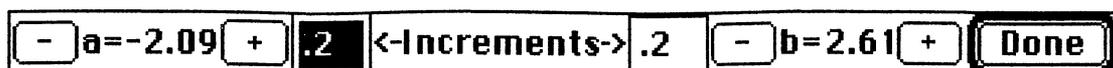


Figure 4.10 The dialog box for adjusting a and b

button is selected. Here are some helpful tips for adjusting a and b:

- If most entries become black or white, then the [a,b] interval is too small and it needs to be enlarged.
- If increasing (decreasing) a or b does not affect the graylevel map, then the mapped array entries are smaller (larger) than a or b, whichever is being changed, and thus the limit is reached.
- The chess pattern (shown in Figure 4.11) is the zero pattern. It replaces the patterns of the entries that fall in the zero bin (adjusting a or b may increase or decrease the bin size, and consequently array entries may enter or leave the zero bin).

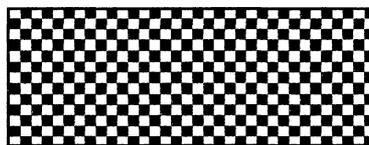


Figure 4.11 The chess pattern that indicates small values

To display the graylevel map of the GPAC (or for S or R arrays) just select the appropriate menu item under "Identify" (see Figure 2.8), select an ACF input file, enter the size of the array, select one of the functions (Sigmoid or Linear), enter a and b (or use the default), and then adjust a and b using the dialog box displayed above the array map. Figures 4.12, 4.13, and 4.14 show the grayscale GPAC, S array and R array of the ARMA(3,2) of Example

4.2.3.2 respectively. Note that the shifted S and R arrays will always be used.

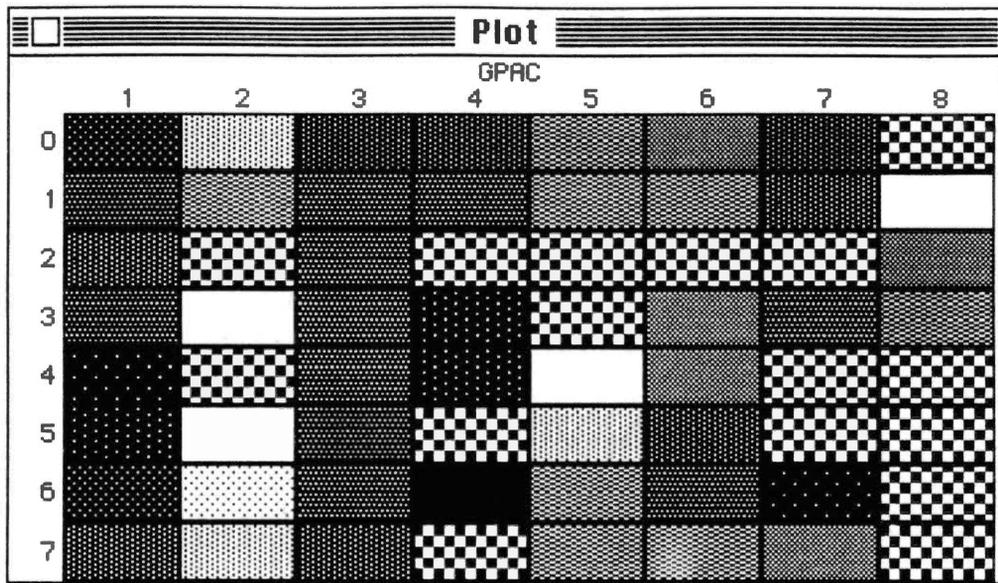


Figure 4.12 GPAC grayscale map of the ARMA in Example 4.2.3.2

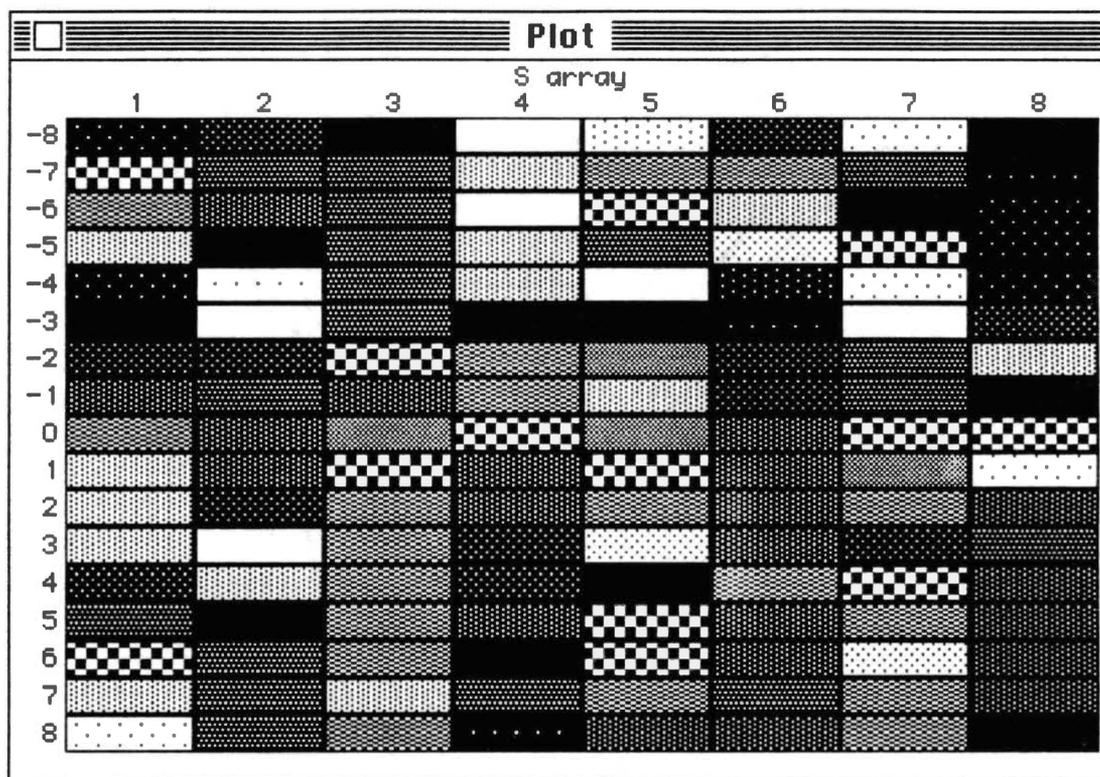


Figure 4.13 Shifted S array grayscale map of the ARMA in Example 4.2.3.2

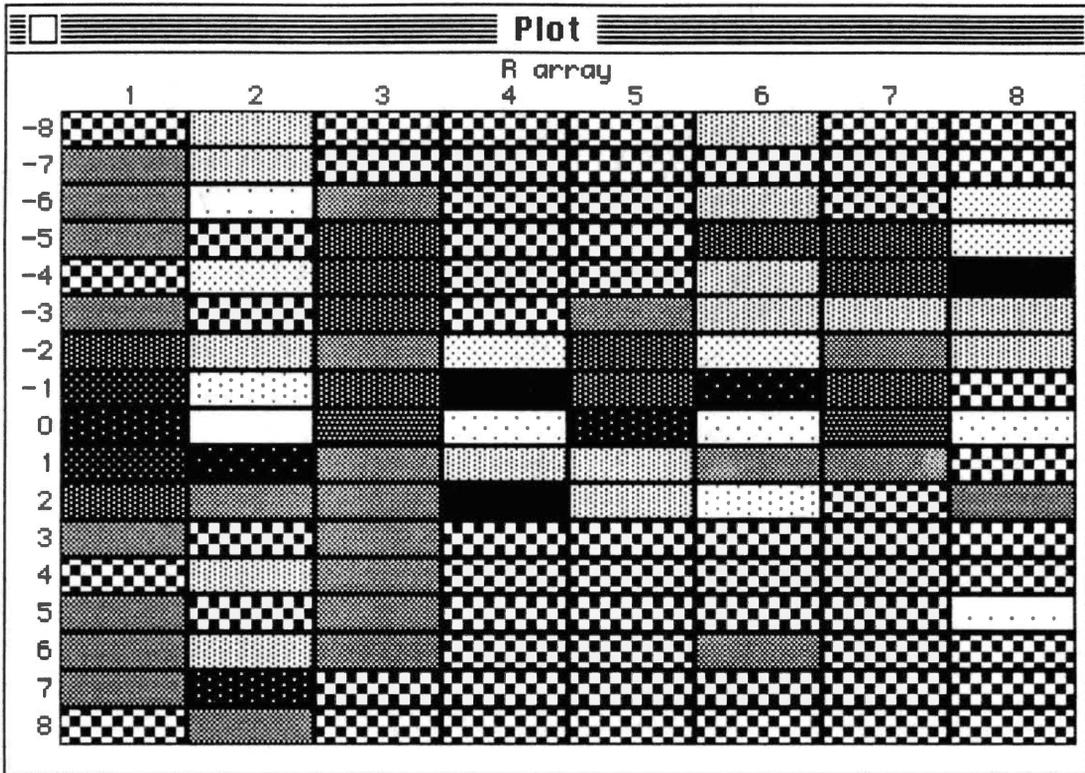


Figure 4.14 Shifted R array grayscale map of the ARMA in  
Example 4.2.3.2

## CHAPTER V

### PARAMETER ESTIMATION

Once the order of a process is identified, as described in chapter IV, the process parameters can be estimated, as depicted in the flowchart of Figure 1.1. The Maximum-Likelihood Estimation (MLE) procedure, which is well suited for estimating parameters when apriori knowledge of the parameters is not available, is described next.

#### 5.1 Maximum Likelihood Estimation

Consider independent random variables  $Z_1, Z_2, \dots, Z_N$  and observations  $z_1, z_2, \dots, z_N$ , where  $N$  is the number of observations. Also consider parameter vector  $\theta$ . Let  $f_Z(z; \theta)$  be the probability density function (pdf) of  $Z$ , and  $f_{Z_1, \dots, Z_N}(z_1, z_2, \dots, z_N; \theta)$  be the joint pdf of  $Z_1, Z_2, \dots, Z_N$ . Let us define

$$\ell(\theta) = f_{Z_1, Z_2, \dots, Z_N}(z_1, z_2, \dots, z_N; \theta) \quad (5.1)$$

as the likelihood function of  $\theta$ . In most cases the pdf has exponential form, e.g. gaussian, so let us define

$$L(\theta) = \ln[\ell(\theta)] \quad (5.2)$$

Maximizing  $L(\theta)$  is equivalent to maximizing  $\ell(\theta)$  because the logarithm of  $\ell(\theta)$  is monotonic transformation of  $\ell(\theta)$ .

Substituting (5.1) into (5.2) and keeping in mind that  $Z_1, Z_2, \dots, Z_N$  are independent

$$L(\theta) = \ln[f_{z_1}(z_1, \theta) f_{z_2}(z_2, \theta) \cdots f_{z_N}(z_N, \theta)] \quad (5.3)$$

maximizing  $L(\theta)$  implies

$$\frac{\partial}{\partial \theta} L(\theta) \Big|_{\theta = \hat{\theta}_{ML}} = 0 \quad (5.4)$$

where  $\hat{\theta}_{ML}$  is the value that maximizes  $L(\theta)$ , or  $\ell(\theta)$ .

Consider a Taylor series expansion of  $L(\theta)$  about  $\hat{\theta}_{ML}$

$$\begin{aligned} L(\theta) = & L(\hat{\theta}_{ML}) + \sum_{i=1}^N \frac{\partial}{\partial \theta_i} L(\theta) \Big|_{\theta = \hat{\theta}_{ML}} (\theta_i - \hat{\theta}_{i,ML}) \\ & + \frac{1}{2} \sum_{i=1}^N \sum_{j=1}^N \frac{\partial^2}{\partial \theta_i \partial \theta_j} L(\theta) \Big|_{\theta = \hat{\theta}_{ML}} (\theta_i - \hat{\theta}_{i,ML}) (\theta_j - \hat{\theta}_{j,ML}) + \dots \end{aligned} \quad (5.5a)$$

For  $\theta = \hat{\theta}_{ML}$  the second term of the right hand side of (5.5a) is zero

(see (5.4)). Equation (5.5a) becomes

$$L(\theta) = L(\hat{\theta}_{ML}) + \frac{1}{2} \sum_{i=1}^N \sum_{j=1}^N \frac{\partial^2}{\partial \theta_i \partial \theta_j} L(\theta) \Big|_{\theta = \hat{\theta}_{ML}} (\theta_i - \hat{\theta}_{i,ML}) (\theta_j - \hat{\theta}_{j,ML}) + \dots \quad (5.5b)$$

We notice that (5.5b) is quadratic and can be written as

$$L(\theta) = L(\hat{\theta}_{ML}) + \frac{1}{2} (\theta - \hat{\theta}_{ML})^T J_0(\theta) \Big|_{\theta = \hat{\theta}_{ML}} (\theta - \hat{\theta}_{ML}) + \dots \quad (5.5c)$$

where  $J_0$  is called the Fisher information matrix and is defined as

$$J_0(\theta) = \frac{\partial^2}{\partial \theta_i \partial \theta_j} [L(\theta)]_{\theta = \hat{\theta}_{ML}} \quad i, j = 1, 2, \dots, N$$

Equation (5.5c) can be approximated as

$$L(\theta) \approx L(\hat{\theta}_{ML}) + \frac{1}{2}(\theta - \hat{\theta}_{ML})^T J_0(\theta)|_{\theta = \hat{\theta}_{ML}} (\theta - \hat{\theta}_{ML}) \quad (5.6)$$

for  $L(\hat{\theta}_{ML})$  to be maximum, the second term of (5.6) should be negative (i.e. the Fisher information matrix,  $J_0$ , should be negative definite).

Now consider the ARMA process in (1.6). Assuming  $e_t$  is normally distributed, zero mean, and independent, the pdf for  $(e_1, \dots, e_N)$  can be written as

$$f_{e_1, \dots, e_N}(e_1, \dots, e_N) = \frac{1}{(2\pi)^N \sigma_e^N} e^{-\sum_{i=1}^N \frac{e_i^2}{2\sigma_e^2}} \quad (5.7)$$

The logarithm of the pdf becomes

$$-\frac{1}{2\sigma_e^2} \sum_{i=1}^N e_i^2 - N \ln[\sigma_e] + \frac{N}{2} \ln[2\pi] \quad (5.8)$$

Since the  $Z_t$  sequence is a one-to-one transformation of the  $e_t$  sequence (given certain initial conditions) and the Jacobian of the transformation is unity, (5.7) is also the likelihood function, where

the  $e_t$  are computed from the  $Z_t$  sequence. Thus (5.8) is also the logarithm of the likelihood function. Minimizing (5.8) implies minimizing the sum of the squares

$$S(\theta) = \sum_{i=1}^N e_i^2$$

## 5.2 Maximum Likelihood Algorithm

The mle.for subroutine implements Marquardt's Algorithm for estimating ARMA process parameters. The algorithm, which avoids calculating the second derivatives, utilizes two methods: the Gauss-Newton linearization method, and the gradient method (also known as the steepest descent). The former procedure's advantage is that it tends to converge rapidly to the least squares estimates (convergence occurs in one iteration if  $s(\theta)$  is quadratic in  $\theta$ , normally it takes few iterations); the disadvantage is that it may never converge. The biggest advantage of Steepest descent is that it will always converge to the least square estimates (if the step size is chosen appropriately); the problem, however, is it may have a slow convergence rate. The following are the equations that govern the above mentioned methods:

### Gauss-Newton

$$\Delta\theta = -\left[\frac{\partial^2}{\partial\theta^2} S(\theta)\right]^{-1} \frac{\partial}{\partial\theta} S(\theta)$$

### Gradient method

$$\Delta\theta = -[\alpha]^{-1} \frac{\partial}{\partial\theta} S(\theta)$$

### Marquardt

$$\Delta\theta = -\left[ \frac{\partial^2}{\partial\theta^2} S(\theta) + \alpha I \right]^{-1} \frac{\partial}{\partial\theta} S(\theta)$$

For large  $\alpha$  the first term to the right of the equal sign (in Marquardt's) is approximately  $[1/\alpha]$ , and the Marquardt algorithm reduces to the gradient method. For small  $\alpha$ , the same term is approximately  $[(\partial^2/\partial\theta^2) S(\theta)]^{-1}$  which reduces to the Gauss-Newton technique.

#### 5.2.1 MLE Algorithm

Let  $\theta$  be the parameter vector of the AR and MA parts of the process

$$\theta = [\phi_1 \cdots \phi_p \theta_1 \cdots \theta_q]^T$$

and let  $\theta^\circ$  be the current guess for  $\theta$  (assume  $\theta^\circ = 0$ ). Also let  $e_{t,0} = e_t(\theta^\circ)$ . The Taylor series expansion of  $e_t$  is

$$e_t = e_{t,0} + \sum_{i=1}^{p+q} \frac{\partial e_t}{\partial \theta_i} \Big|_{\theta = \theta^\circ} (\theta_i - \theta_{i,0}) + \dots \quad (5.9)$$

Linearize  $e_t$  by considering only the first two terms. Now let

$$x_{i,t} = -\frac{\partial e_t}{\partial \theta_i} \Big|_{\theta = \theta^\circ}$$

$$\mathbf{e}^0 = [\mathbf{e}_1^0 \quad \dots \quad \mathbf{e}_N^0]^T$$

$$\mathbf{e} = [\mathbf{e}_1 \quad \dots \quad \mathbf{e}_N]^T$$

Where  $t$  and  $i$  are the row number and column number respectively.

Using vector format, (5.9) becomes

$$\mathbf{e} = \mathbf{e}^0 - \mathbf{x}[\boldsymbol{\theta} - \boldsymbol{\theta}^0]$$

or, if we want to minimize  $S(\boldsymbol{\theta}) = \mathbf{e}^T \mathbf{e}$ ,

$$[\boldsymbol{\theta} - \boldsymbol{\theta}^0] = [\mathbf{x}^T \mathbf{x}]^{-1} \mathbf{x}^T \mathbf{e}^0 \tag{5.10}$$

where  $[\boldsymbol{\theta} - \boldsymbol{\theta}^0]$  is the correction term. Since  $e_t$  is a function of  $\boldsymbol{\theta}$ , to minimize  $S(\boldsymbol{\theta})$ , derived in section 5.1, we need to calculate the negative of the derivatives of  $e_t$  with respect to  $\boldsymbol{\theta}$  (i.e.  $x_{i,t}$ ). The negative of the derivative is approximated as follows

$$x_{i,t} = \frac{e_t([\theta_{1,0}, \dots, \theta_{i,0}, \dots, \theta_{p+q,0}]) - e_t([\theta_{1,0}, \dots, \theta_{i,0} + \delta_i, \dots, \theta_{p+q,0}])}{\delta_i}$$

### 5.2.2 Pseudo Code of MLE Algorithm

#### Notation:

$\delta$  Step size for derivative calculations (typically 0.01).  $\delta$  could be different for each  $\theta_i$ .

PI Correction parameter (typically 0.01). Larger PI moves the correction toward the gradient method. PIMAX is the

maximum allowed value for PI before stopping the algorithm without convergence.

**ITERMAX** The maximum number of iteration allowed before stopping the execution of the algorithm without convergence.

$\epsilon$  Tolerance to check for parameter convergence (typically 0.001).

**F<sub>2</sub>** Acceleration factor (typically between 1 and 2).

Stage 1:

Calculate the derivative

$$x_{i,t} = \frac{e_t([\theta_{1,0}, \dots, \theta_{1,0}, \dots, \theta_{p+q,0}]) - e_t([\theta_{1,0}, \dots, \theta_{1,0} + \delta_i, \dots, \theta_{p+q,0}])}{\delta_i}$$

$$A_{i,j} = \sum_{l=n}^n x_{l,t} x_{l,t} \quad \{ \mathbf{A} = [A_{ij}] = [\mathbf{x}^T \mathbf{x}] \}$$

$$g_i = \sum_{l=n}^n x_{l,t} e_t \quad \{ \mathbf{g} = \mathbf{x}^T \mathbf{e}^0 \}$$

$$D_i = \sqrt{A_{ii}}$$

Stage 2:

$$A^*_{i,j} = \frac{A_{ij}}{D_i D_j} \quad \{\text{normalize } \mathbf{A} \text{ for numerical stability}\}$$

$$A^*_{i,i} = 1 + \text{PI} \quad \{\text{combination of the two methods}\}$$

$$g^*_i = \frac{g_i}{D_i} \quad \{\text{normalize for numerical stability}\}$$

Solve the equation

$$\mathbf{A}^* \mathbf{h}^* = \mathbf{g}^* \quad \{ \mathbf{h}^* = [\boldsymbol{\theta} - \boldsymbol{\theta}^0]. \text{Change in } \boldsymbol{\theta} \}$$

For  $\mathbf{h}^*$  then scale back to obtain

$$h_j = \frac{h^*_j}{D_j} \quad \{\text{because } \mathbf{A}^* \text{ and } \mathbf{g}^* \text{ were normalized}\}$$

Calculate the new  $\boldsymbol{\theta}$

$$\boldsymbol{\theta}_{\text{new}} = \boldsymbol{\theta}_{\text{old}} + \mathbf{h}$$

Stage 3:

Check for reduction of the sum of squares. If the sum of squares is not reduced, increase PI (move toward the steepest descent technique), otherwise reduce PI and check for parameter convergence

```

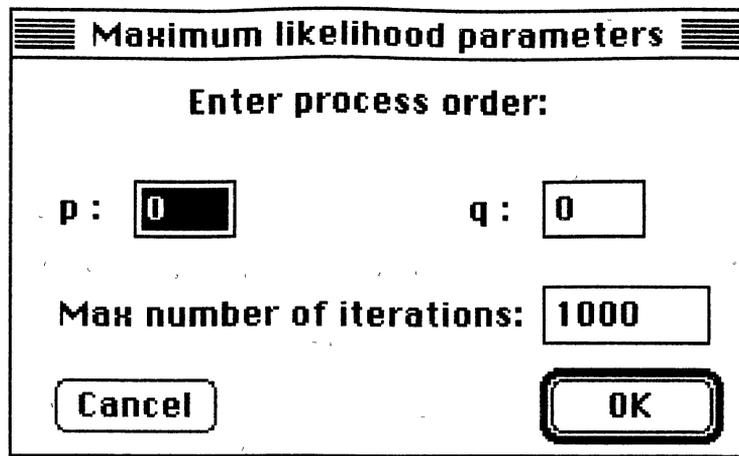
if  $S(\theta_{new}) < S(\theta_{old})$  then
  if  $|h_j| < \epsilon$  then           {check for parameter convergence}
    parameters converged
    done
  else
     $\theta_{old} = \theta_{new}$ 
     $PI = PI / F_2$                {move toward Gauss-Newton tech.}
    iter = iter + 1
    if iter > itermax then
      error message
      stop
    endif
  endif
else
   $PI = PI * F_2$                {move toward steepest descent tech.}
  if  $PI > PIMAX$  then
    error message
    stop
  endif
  GOTO stage 2
endif
GOTO stage 1

```

## 5.3 Using MacModel for MLE

Example 5.3.1

To calculate the Maximum Likelihood Estimate of an ARMA process choose "Maximum Likelihood" from the "Estimate" menu. You will be confronted with the "Maximum Likelihood Parameters" dialog box, which requests the process order and the maximum number of iterations. See Figure 5.1.



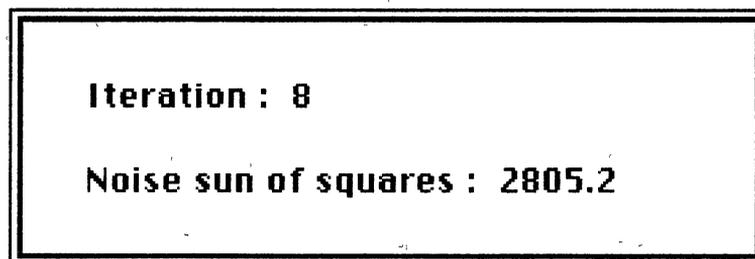
The dialog box is titled "Maximum likelihood parameters" and contains the following elements:

- Header: **Maximum likelihood parameters**
- Instruction: **Enter process order:**
- Parameter **p**: input field with value **0**
- Parameter **q**: input field with value **0**
- Parameter **Max number of iterations**: input field with value **1000**
- Buttons: **Cancel** and **OK**

Figure 5.1 Maximum Likelihood Parameters dialog box

Next the program displays the iteration number and the sum of squares as they change with the routine execution. See Figure 5.2.

Upon finishing the execution, the MLE routine displays the "MLE Report" dialog box, which contains the results of the run (See Figure 5.3). Displayed in the top center of the report is the convergence information. The number of degrees of freedom (the number of data points minus the number of estimated parameters) is also displayed, along with the standard deviation of the residuals ( $e_t$ 's) and the number of iterations completed. Each parameter (AR or MA) and its standard deviation are enclosed by parentheses. The



The dialog box displays the following information:

- Iteration : 8**
- Noise sun of squares : 2805.2**

Figure 5.2 Iteration number and the sum of squares in MLE

8/ 5/91	Parameters converged	5:32:26
Noise sum of squares:	1110.3	Degrees of freedom: 697
Residuals standard error:	1.26	Number of iterations: 50
.....		
AR	( 1.27, .04)( -.58, .04)	
parameters		
( $\phi, \sigma$ )		
.....		
MA	( -.32, .05)	
parameters		
( $\theta, \sigma$ )		
.....		
<input type="checkbox"/> Save MLE report to:	<input type="text" value="MLE.dat"/>	<input type="checkbox"/> Print MLE report
<input type="checkbox"/> Save residuals to:	<input type="text" value="residuals.dat"/>	<input type="button" value="OK"/> <input type="button" value="Cancel"/>

Figure 5.3 MLE results report

first pair of parentheses (in the AR region) enclose  $\phi_1$ , the second enclose  $\phi_2$ , etc. The MA parameters are displayed in a similar fashion in the MA region. The bottom part of the report contains three check boxes, two of which are for saving the report and the residuals. The third is for printing a hard copy of the report. This is equivalent to saving the report, then printing it by selecting "Print Text" from the File menu.

## CHAPTER VI

### DIAGNOSTIC TESTING

Once a model has been identified and the parameters estimated, diagnostic checks must be applied to check the adequacy of the model (see flowchart of Figure 1.1). There are many procedures to check for accuracy of an identified model, one of which is testing the whiteness of the residuals.

The residual-whiteness test is a procedure that checks if the residuals are truly white (see Chapter IV on how to obtain the residuals). This is done by inspecting the autocorrelation function,  $\rho_e$ . Theoretically,  $\rho_e(k)=0$  for all  $k \neq 0$  and  $\rho_e(0)=1$ . Due to the use of the sample autocorrelation, the residuals will not look perfectly white. A rule of thumb to check for whiteness is to see if the autocorrelation is within 2 standard deviations of zero. The standard deviation of the sample autocorrelation function will be  $1/\sqrt{N}$  where  $N$  is the number of data points [8].

#### Example

Consider the following AR(2) process

$$Z_t - 1.7 Z_{t-1} + 0.72 Z_{t-2} = e_t$$

Let's assume that we miss identified the process as AR(1). The MLE of the parameter of the AR(1) process for 1500 data points was found to be

$$Z_t - 0.98 Z_{t-1} = e_t$$

Now let's perform some diagnostic checking. The ACF sequence of the residuals is shown in Figure 6.1.

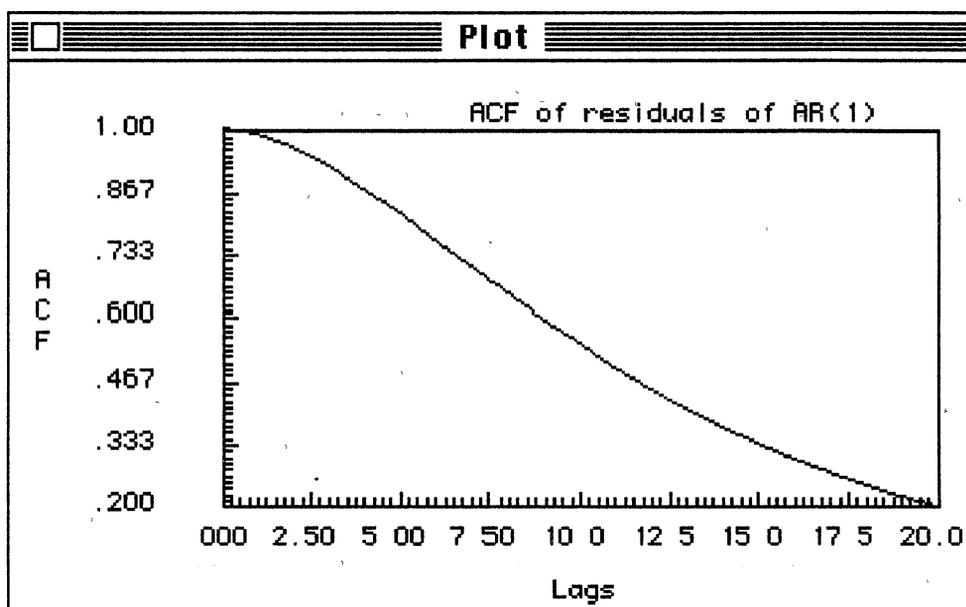


Figure 6.1 The ACF of the residuals

The residuals are not white since the ACF sequence is not confined to  $\pm 2/\sqrt{N}$  for Lags  $> 0$  ( $N=1500$  points in this example), in fact it looks like it is for an AR(1) since it has exponential shape with no oscillations. Furthermore the GPAC of the residuals in Figure 6.2 clearly identifies the process as AR(1). If we increase the order of

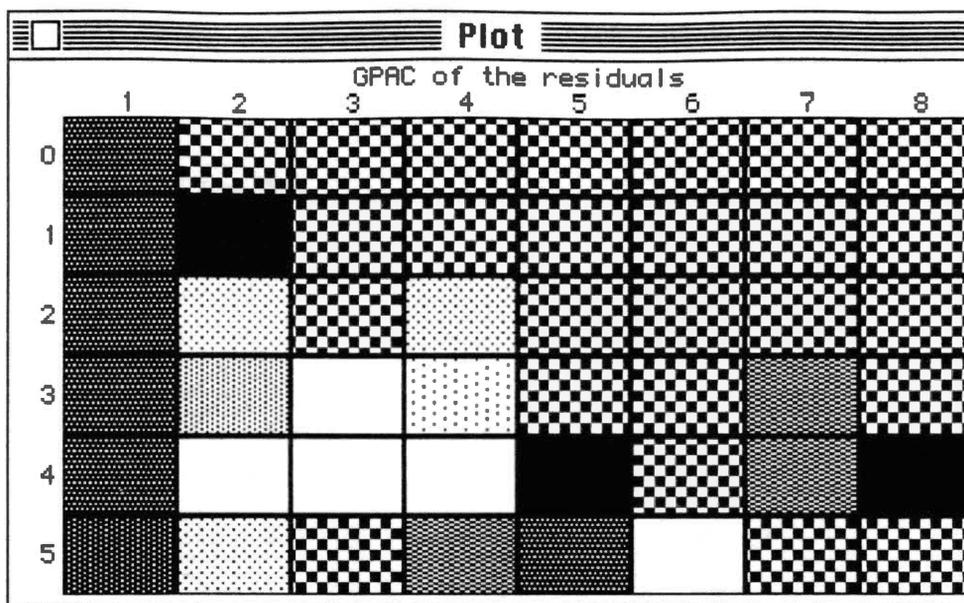


Figure 6.2 The GPAC of the residuals

the model by one, namely to an AR(2), the following parameter estimates are produced

$$Z_t - 1.69 Z_{t-1} + 0.72 Z_{t-2} = \theta_t$$

which are very close to the actual parameters.

When we perform diagnostic checks on the residuals of the AR(2) model, we get the ACF in Figure 6.3 and the GPAC in Figure 6.4. The ACF is confined to  $\pm 2/\sqrt{N}$ , and the first row of the GPAC is zero which is typical of a white noise process.

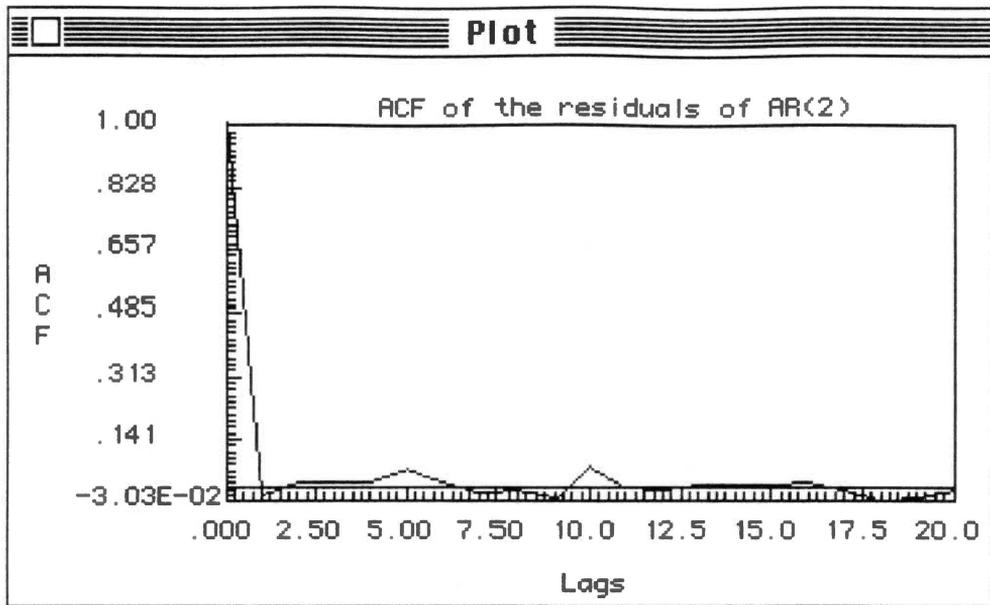


Figure 6.3 The ACF of the residuals of AR(2)

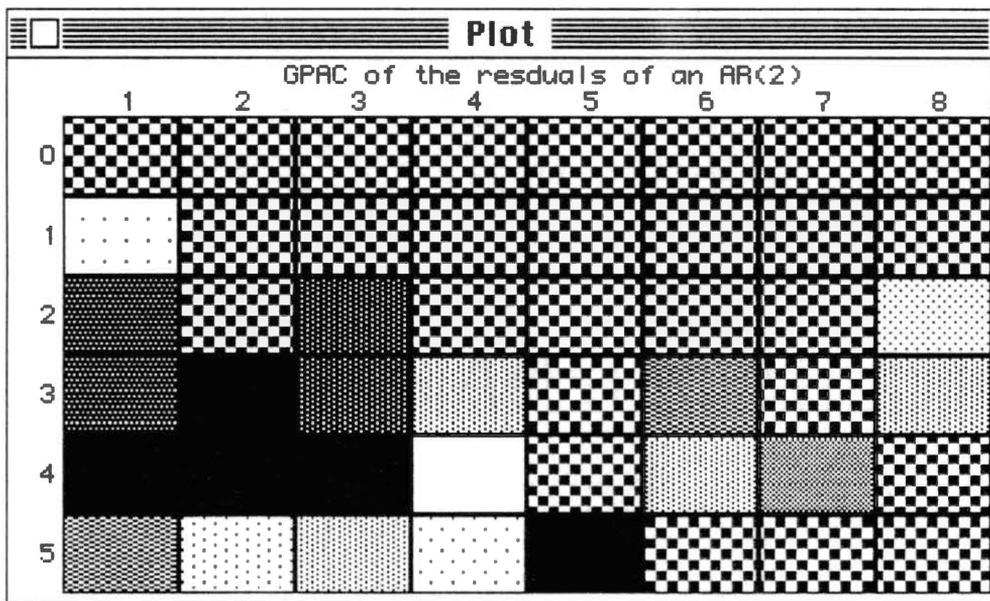


Figure 6.4 The GPAC of the residuals of AR(2)

## CHAPTER VII

### CONCLUSIONS AND RECOMMENDATIONS

This thesis discussed process identification from preliminary order determination through parameter estimation and diagnostic testing. From the diagnostic tests we learned about the model adequacy. The main thrust of this thesis was a Macintosh application program, called MacModel, written for system identification. MacModel is a menu-driven, user friendly program that conforms with Macintosh application standards.

Chapter II discussed the Macintosh Toolbox structure and the application program structure, with MacModel's main-routine flowchart depicted in Figure 2.10. It contained discussion on how to allocate, initialize, and customize menus to your needs. This was followed by an explanation on how to allocate and manipulate windows and their grafports. Easy to follow instructions on how to start-up, use, and expand MacModel were also included. Chapter III included white noise and ARMA processes simulation with examples on using MacModel. The program has plotting capabilities and uses grayscale to display graylevel array maps that make it easier to recognize patterns in the GPAC, S, and R arrays. A listing of all the routines is included in appendix B.

Chapters IV through VI included the theory behind system identification and parameter estimation. It was shown that for an MA(q) process it was sufficient to inspect the ACF sequence; For an AR(p) process the order p was determined by the PACF sequence only. For an ARMA(p,q) process, however, the GPAC had to be inspected to estimate the process order. Three patterns were formed in the GPAC: a vertical pattern, called the  $\phi_p$  pattern, which occurs in the  $p^{\text{th}}$  column of the GPAC, a horizontal pattern, called the zero pattern, which occurs in the  $q^{\text{th}}$  row, and a block pattern, known as the 0/0 pattern, which starts to the right of the  $\phi_p$  pattern and below the zero pattern.

The GPAC patterns were found not to stand-out well for some processes, so the S and R arrays method was explored. The S array has 4 patterns, which are the  $c_1$ ,  $c_2$ ,  $\pm c_1$  and  $\pm \infty$  patterns. Then the shifted S and R arrays were introduced to make it easier to recognize patterns. Complex S and R arrays were briefly discussed. It was found that  $e^{j2\pi fm} \rho_m$  satisfies the same difference equation that does  $\rho_m$ . The complex arrays were found (for frequency  $f \neq n/2$ ,  $n=0,1,2,\dots$ ) to give twice the number of patterns of the real case. This is also true for the GPAC since (4.24) showed how to recursively calculate the GPAC from the arrays. Diagnostic testing was discussed in Chapter VI to aid in determining the adequacy of the identified model. Figure 1.1 depicts a flowchart that can be used as a guide for process identification.

In conclusion we recommend that the S and R arrays be explored further, especially the complex approach, as they are

virtually unknown or unused in the engineering fields. The complex S and R arrays can give enhanced patterns and can be used to recursively calculate a complex GPAC. We also recommend continued development of MacModel. It can be easily expanded to include new system identification techniques. The use of graylevel maps to display the GPAC and S and R arrays seems to allow easier recognition of patterns. Further studies should be made of this capability.

Finally we recommend the addition or improvement of the following:

- Improve the routines to make them more numerically stable (e.g. the use of unusually large numbers may cause numerical overflows).
- Append a subroutine to find the poles of ARMA and AR processes to check for stability. Unstable processes often cause numerical overflow.
- Add the frequency as a new variable in the dialog box of Figure 4.10. The ability to adjust the frequency provides an extra degree of freedom in optimizing the graylevel map. This should enhance the patterns further. After adding the frequency, one would adjust it until a large variance of the array is obtained, then adjust a and b as discussed in section 4.3.4.
- Modify the program to include a preference menu and a profile. This would allow the users to customize the environment.
- Refresh the Plot and TTY windows.

- Modify plotgsr.for to allow the users to display a value in the array (GPAC, S, or R arrays) by clicking on the its corresponding graylevel in the map.
- Adjust the print manager to default to landscape instead of portrait upon choosing Print Graphics in the File menu.

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## APPENDIXES

**APPENDIX A**  
**TYPE DECLARATION**

Table A.1 window record structure

integer*1	windowrecord(156)
integer*2	grafport(54)
integer*2	windowkind
logical*1	visible
logical*1	hilite
logical*1	goawayflag
logical*1	spareflag
integer*4	strucrqn
integer*4	contrqn
integer*4	updaterqn
integer*4	windowdefproc
integer*4	datahandle
integer*4	titlehandle
integer*2	titlewidth
integer*4	controllist
integer*4	nextwindow
integer*4	windowpic
integer*4	refcon
equivalence	(windowrecord(1),grafport)
equivalence	(windowrecord(109),windowkind)
equivalence	(windowrecord(111),visible)
equivalence	(windowrecord(112),hilite)
equivalence	(windowrecord(113),goawayflag)
equivalence	(windowrecord(114),spareflag)
equivalence	(windowrecord(115),strucrqn)
equivalence	(windowrecord(119),contrqn)
equivalence	(windowrecord(123),updaterqn)
equivalence	(windowrecord(127),windowdefproc)
equivalence	(windowrecord(131),datahandle)
equivalence	(windowrecord(135),titlehandle)
equivalence	(windowrecord(139),titlewidth)
equivalence	(windowrecord(141),controllist)
equivalence	(windowrecord(145),nextwindow)
equivalence	(windowrecord(149),windowpic)
equivalence	(windowrecord(153),refcon)

Table A.2 Grafport structure

integer*2	grafport(54)
integer*2	device
integer*2	portbits(7)
integer*2	portrect(4)
integer*4	visrgn
integer*4	cliprgn
integer*1	bkpat(8)
integer*1	fillpat(8)
integer*2	pnloc(2)
integer*2	pnsiz(2)
integer*2	pnmode
integer*1	pnpat(8)
integer*2	pnvis
integer*2	txfont
integer*2	txface
integer*2	txmode
integer*2	txsize
integer*4	spextra
integer*4	fgcolor
integer*4	bkcolor
integer*2	colrbit
integer*2	patstretch
integer*4	picsave
integer*4	rgnsave
integer*4	polysave
integer*4	grafprocs
equivalence	(grafport(1),device)
equivalence	(grafport(2),portbits(1))
equivalence	(grafport(9),portrect(1))
equivalence	(grafport(13),visrgn)
equivalence	(grafport(15),cliprgn)
equivalence	(grafport(17),bkpat(1))
equivalence	(grafport(21),fillpat(1))
equivalence	(grafport(25),pnloc(1))
equivalence	(grafport(27),pnsiz(1))
equivalence	(grafport(29),pnmode)
equivalence	(grafport(30),pnpat(1))
equivalence	(grafport(34),pnvis)
equivalence	(grafport(35),txfont)
equivalence	(grafport(36),txface)
equivalence	(grafport(37),txmode)

equivalence (grafport(38),txsize)  
equivalence (grafport(39),spextra)  
equivalence (grafport(41),fgcolor)  
equivalence (grafport(43),bkcolor)  
equivalence (grafport(45),colrbit)  
equivalence (grafport(46),patstretch)  
equivalence (grafport(47),picsave)  
equivalence (grafport(49),rgnsave)  
equivalence (grafport(51),polysave)  
equivalence (grafport(53),grafprocs)

Table A.3 Event Record Structure

```

integer*2  eventrecord(8)  ! overlying structure

      integer*2  what      ! type of event:
                          ! 0 = null
                          ! 1 = mouse down
                          ! 2 = mouse up
                          ! 3 = key down
                          ! 4 = key up
                          ! 5 = auto-key
                          ! 6 = update
                          ! 7 = disk inserted
                          ! 8 = activate
                          ! 9 = abort
                          ! 11 = I/O driver
                          ! 12 = application defined
                          ! 13 = application defined
                          ! 14 = application defined
                          ! 15 = application defined

integer*4  message      ! extra event information:
                          ! keyboard: ASCII code in bits 0-7
                          ! disk inserted: drive number
                          ! Activate and deactivate: window
                          pointer
                          ! Mouse: undefined

integer*4  when          ! time of event in 60ths of seconds
integer*2  where(2)     ! mouse location in global
                          coordinates

integer*2  modifiers    ! state of mouse button and
                          modifier keys:
                          ! 1 = activate/deactivate
                          ! 2 = System/application
                          window
                          ! 4 = unused
                          ! 8 = unused
                          ! 16 = unused
                          ! 32 = unused
                          ! 64 = unused
                          ! 128 = mouse button
                          ! 256 = Command key
                          ! 512 = Shift key
                          ! 1024 = Caps Lock key

```

2048 = Option key

! 4096 = unused

! 8192 = unused

! 16384 = unused

! 32768 = unused

equivalence (eventrecord(1),what)  
equivalence (eventrecord(2),message)  
equivalence (eventrecord(4),when)  
equivalence (eventrecord(6),where(1))  
equivalence (eventrecord(8),modifiers)

**Table A.4 eventmask values**

-1	= all events
0	= null
1	= mouse down
2	= mouse up
3	= key down
4	= key up
5	= auto-key
6	= update
7	= disk inserted
8	= activate
9	= abort
10	= network
11	= I/O driver
12	= application defined
13	= application defined
14	= application defined
15	= application defined

**Table A.5 mouseloc interpretation**

integer mouseloc	! mouse location from FINDWINDOW:
	! 0 = none of the following
	! 1 = in the menu bar
	! 2 = in system window
	! 3 = in content region
	! 4 = in drag region
	! 5 = in grow region
	! 6 = in go away region

**APPENDIX B**  
**PROGRAM CODE LISTINGS**

```

*****
*
* MacModel:  The main program.  It contains the initializations and the
*             event loop.
*
*****

    program MacModel

        implicit none                ! helps keep us out of trouble

        include hd:include files:Estm-menu.inc

*
* Pointer for creating the menus
*

        integer*4 menuhandle(10)     ! pointer to menu
        integer*4 menuhandle1(2)

*
* The following structure defines an event record for making calls to
* theMacintosh event manager. Events are occurrences such as the
* detection of a change in the state of the mouse button, capturing
* keyboard input, and detecting the insertion of a disk. You can specify
* the specific events that your application is interested in handling.
*

        integer*4 eventmask          ! specifies the events of interest
C                                     !
C                                     ! 1 = null
C                                     ! 2 = mouse down
C                                     ! 4 = mouse up
C                                     ! 8 = key down
C                                     ! 16 = key up
C                                     ! 32 = auto-key
C                                     ! 64 = update
C                                     ! 128 = disk inserted
C                                     ! 256 = activate
C                                     ! 512 = abort
C                                     ! 1024 = network
C                                     ! 2048 = I/O driver
C                                     ! 4096 = application defined
C                                     ! 8192 = application defined
C                                     ! 16384 = application defined
C                                     ! 32768 = application defined

        integer*2 eventrecord(8)     ! overlying structure

        integer*2 what                ! type of event:
C                                     !
C                                     ! 0 = null
C                                     ! 1 = mouse down
C                                     ! 2 = mouse up
C                                     ! 3 = key down
C                                     ! 4 = key up
C                                     ! 5 = auto-key
C                                     ! 6 = update
C                                     ! 7 = disk inserted
C                                     ! 8 = activate

```

```

C          ! 9 = abort
C          ! 10 = network
C          ! 11 = I/O driver
C          ! 12 = application defined
C          ! 13 = application defined
C          ! 14 = application defined
C          ! 15 = application defined
integer*4 message ! extra event information:
C          ! keyboard: ASCII code in bits 0-7
C          ! disk inserted: drive number
C          ! Activate and deactivate: window pointer
C          ! Mouse: undefined
integer*4 when ! time of event in 60ths of seconds
integer*2 where(2) ! mouse location in global coordinates
integer*2 modifiers ! state of mouse button and modifier keys:
C          ! 1 = activate/deactivate
C          ! 2 = System/application window
C          ! 4 = unused
C          ! 8 = unused
C          ! 16 = unused
C          ! 32 = unused
C          ! 64 = unused
C          ! 128 = mouse button
C          ! 256 = Command key
C          ! 512 = Shift key
C          ! 1024 = Caps Lock key
C          ! 2048 = Option key
C          ! 4096 = unused
C          ! 8192 = unused
C          ! 16384 = unused
C          ! 32768 = unused

```

```

equivalence (eventrecord(1),what)
equivalence (eventrecord(2),message)
equivalence (eventrecord(4),when)
equivalence (eventrecord(6),where(1))
equivalence (eventrecord(8),modifiers)
integer*4 flag

```

```

*
* The following structure defines a window record for making calls to
* theMacintosh window manager. The two windows defined by this program
* willnot need to manipulate the window record, but the structure is
* definedfor reference
*

```

```

integer*4 tty_window ! pointer to the tty window
integer*4 plot_window ! pointer to the graphics window
integer*4 dialog_win ! pointer to the dialog window
integer*4 dialog_win1
integer*4 plot_sclbr
common /win/ tty_window,plot_window

integer*1 tty_record(156) ! tty window record
integer*1 plot_record(156) ! graphics window record
integer*1 dialog_recd(170) ! dialog window record
integer*2 portrect(4) ! to store the plot window size

```

```
equivalence (plot_record(17),portrect(1))
```

```
integer*2 port(54)      ! grafport
integer*2 windowkind   ! type of window:
c                       ! 0 = standard document window
c                       ! 1 = alert box or modal dialog box
c                       ! 2 = plain box
c                       ! 3 = plain box with shadow
c                       ! 4 = document window without size box
c                       ! 10 = round cornered window
logical*1 visible      ! true when window is visible
logical*1 hilite       ! highlighted when true
logical*1 goaway       ! has a go away box when true
logical*1 spareflag    ! reserved
integer*4 strucrgn     ! Quickdraw region
integer*4 contrgn      ! Quickdraw region
integer*4 updatern     ! Quickdraw region
integer*4 windowdefproc ! pointer to window definition function
integer*4 datahandle   ! pointer for window definition function
integer*4 titlehandle  ! pointer to title
integer*4 titlewidth   ! width (in pixels) of title
integer*4 controllist  ! pointer to control list for Control Mgr
integer*4 nextwindow   ! pointer to next window in window list
integer*4 windowpic    ! pointer to Quickdraw picture of contents
integer*4 refcon       ! reference value field
```

```
equivalence (tty_record(1),port)
equivalence (tty_record(104),windowkind)
equivalence (tty_record(109),visible)
equivalence (tty_record(110),hilite)
equivalence (tty_record(111),goaway)
equivalence (tty_record(112),spareflag)
equivalence (tty_record(113),strucrgn)
equivalence (tty_record(117),contrgn)
equivalence (tty_record(121),updatern)
equivalence (tty_record(125),windowdefproc)
equivalence (tty_record(129),datahandle)
equivalence (tty_record(133),titlehandle)
equivalence (tty_record(137),titlewidth)
equivalence (tty_record(139),controllist)
equivalence (tty_record(143),nextwindow)
equivalence (tty_record(147),windowpic)
equivalence (tty_record(151),refcon)
```

```
*
* Miscellaneous declarations
*
```

```
integer*4 toolbx      ! the tool box interface
character*256 str255 ! function to create a Pascal LSTRING
integer*4 window      ! general purpose pointer
integer*4 size,w,h,w1,h1 ! for growing windows
integer*2 rect(4), rect1(4) ! rectangle coordinates
integer mouseloc      ! mouse location from FINDWINDOW:
```

```

c          ! 0 = none of the following
c          ! 1 = in the menu bar
c          ! 2 = in system window
c          ! 3 = in content region
c          ! 4 = in drag region
c          ! 5 = in grow region
c          ! 6 = in go away region

logical  cnclflag
real    dum
integer*4  proc
character*64 char_mtrx(3)

integer*4  mypict, item_ptr,item_list(2)
integer*4  itemhit, error
integer*4  appllimit      ! address of current application limit
integer*4  newlimit      ! new application limit
parameter (appllimit=z'00000130')

newlimit = LONG(appllimit)      ! get the current limit
newlimit = newlimit-102400      !allocate an additional 100k of stack
call toolbox(SETAPPLLIMIT,newlimit) !set the new application limit

*
* Set up the event manager mask (you should accept responsibility for
* allevents to insure that the event queue is flushed; some calls such
* as MENUSELECT will not work properly if there are extra mouse up
* events lying around):
*
    eventmask = -1

*
* Close MacFortran I/O window (never make a DISPOSEWINDOW call on this
* window):
*
    window = toolbox(FRONTWINDOW)
    call toolbox(CLOSEWINDOW,window)
    window = toolbox(FRONTWINDOW)
    call toolbox(HILITEWINDOW,window,.false.)

*
* Build the menus (for details refer to "Menu Initialization and
* Allocation" in "The MacFortran Tool Box Interface"):
*
* Most Toolbox initialization required is done by runtime. Only
* Text Edit needs to be initialized here. Also open resource file.

    call toolbox(TEINIT)
    error=toolbox(OPENRESFILE,char(8) // 'dlog.res')
    if (error=-1) write(9,*) 'Resource file busy or missing'

    menuhandle(1) = toolbox(NEWMENU,29,char(1) // char(z'14'))

c Setup the apple menu
    call toolbox(APPENDMENU,menuhandle(1),
+          str255("About MacModel...; (-)")

```

```

    call toolbox(ADDRESMENU,menuhandle(1), 'DRVR')
    call toolbox(INSERTMENU,menuhandle(1),0) ! insert at end of list

c Setup the File menu
    menuhandle(2) = toolbox(NEWMENU,30,str255("File"))
    call toolbox(APPENDMENU,menuhandle(2),str255("List.../L;
+Plot.../P;Print Text...;(Print Graphics...;Transfer...;Quit/Q"))
    call toolbox(INSERTMENU,menuhandle(2),0) ! insert at end of list

c Setup the Edit menu
    menuhandle(3) = toolbox(NEWMENU,31,str255("Edit"))
    call toolbox(APPENDMENU,menuhandle(3),
+
    str255("Undo/Z;(-;Cut/X;Copy/C;
+Paste;Clear"))
    call toolbox(INSERTMENU,menuhandle(3),0) ! insert at end of list

c Setup the Simulation menu and its submenu
    menuhandle(4) = toolbox(NEWMENU,32,str255("Simulate"))
    call toolbox(APPENDMENU,menuhandle(4),
+
    str255("!AWhite Noise/ ;ARMA..."))
    call toolbox(INSERTMENU,menuhandle(4),0) ! insert at end of list

c 65 (decimal)=41 hex= A ASCII
    menuhandle(5) = toolbox(NEWMENU,65,str255("White Noise"))
    ! 65 decimal
    call toolbox(APPENDMENU,menuhandle(5),
+
    str255("Gaussian...;Uniform..."))
    call toolbox(INSERTMENU,menuhandle(5),-1) ! -1 Hierarchial menu

c Setup the Correlation menu
    menuhandle(6) = toolbox(NEWMENU,33,str255("Identify"))
    call toolbox(APPENDMENU,menuhandle(6),
+
    str255("Autocorrelation.../A;Crosscorrelation...;
+Partial Autocorrelation...;(-;GPAC.../G;S-array...;
+R-array.../R"))
    call toolbox(INSERTMENU,menuhandle(6),0) ! insert at end of list

c Setup the Estimation menu
    menuhandle(7) = toolbox(NEWMENU,34,str255("Estimate"))
    call toolbox(APPENDMENU,menuhandle(7),
+
    str255("Maximun Likelihood..."))
    call toolbox(INSERTMENU,menuhandle(7),0) ! insert at end of list

    call toolbox(DRAWMENUBAR)

*
* Create the windows, only display the TTY window; the SETPORT call
* allows I/O to take place:
*

    tty_window = toolbox(PTR,tty_record)
    rect(1) = 40
    rect(2) = 3
    rect(3) = 338
    rect(4) = 503
    tty_window = toolbox(NEWWINDOW,tty_window,rect,
+
    str255("TTY"),.false.,0,-1,.true.,0)
    call toolbox(SETPORT,tty_window)
    call toolbox(TEXTFONT,4) ! monaco

```

```

call toolbox(TEXTSIZE,9)          ! 9 point

plot_window = toolbox(PTR,plot_record)
rect(1) = 40
rect(2) = 3
rect(3) = 334
rect(4) = 507
plot_window = toolbox(NEWWINDOW,plot_window,rect,
+   str255("Plot"),.false.,0,TTY_WINDOW,.true.,0)
  call toolbox(SETPORT,plot_window)
  call toolbox(TEXTFONT,4)        ! monaco
  call toolbox(TEXTSIZE,9)        ! 9 point

C-----
c main event processing loop
c constraints on window dragging:
C-----

rect(1) = 25
rect(2) = 25
rect(3) = 300
rect(4) = 500
mypict = 0

do
  if (toolbox(GETNEXTEVENT,eventmask,eventrecord)) then

    select case (what)

      case (1)          ! mouse down

        mouseloc = toolbox(FINDWINDOW,where>window)

        if (mouseloc=1) then
          flag=0
          call menus(where,portrect,menuhandle(1),
&             port,mypict,flag,message)
+         if (mypict<>0) call toolbox(ENABLEITEM,
          menuhandle(2),4) !enables print graphics menu

        else if (mouseloc=3) then
          call toolbox(SELECTWINDOW>window)

        else if (mouseloc=4) then
          call toolbox(DRAGWINDOW>window,where>rect)

        else if (mouseloc=5) then
          h1 = portrect(3)-portrect(1) !height
          w1 = portrect(4)-portrect(2) !width
          size = toolbox(GROWWINDOW>window,where>rect)
          w = size .and. z'ffff' 'high-word of size is the
          h = shift(size,-16)    ! vertical measurements,
          ! horizontalis in the low.
          if ((h1.NE.h).OR.(w1.NE.w)) then
            call toolbox(SIZEWINDOW>window,w,h,.true.)

          if (window=plot_window).and.(mypict<>0) then
            call toolbox(SETPORT,plot_window)

```

```

        call clrwin(plot_window)
        rect1(1) = 0
        rect1(2) = 0
        rect1(3) = h
        rect1(4) = w
        call toolbox(DRAWPICTURE, mypict, rect1)
        call toolbox(SETPORT, tty_window)
    endif
    endif
    else if (mouseloc=6) then
        if (toolbox(TRACKGOAWAY, window, where))
+           call toolbox(HIDEWINDOW, window)
        end if

    case(3)           !key down
        if (modifiers=384 .or. modifiers=1408) then
            ! 384=command, 1408=caps lock command
            flag=1
            call menus(where, portrect, menuhandle(1),
&                port, mypict, flag, message)
        end if
    case default

    end select

    end if
    repeat
end
end

```

```

*****
*
* menus: a mouse down event was detected in the menu area; process menu
*       selection
*
*****

      subroutine menus (where, portrect, menuhandle, port, array_pict,
+                   flag, message)

      implicit none

      include hd:include files:Estm-menu.inc

      integer*4 toolbx, array_pict, flag, message
      integer*4 error

      integer*4 tty_window          ! tty window pointer
      integer*4 plot_window        ! plot window pointer
      common /win/ tty_window, plot_window !, pic_window

      integer menuhandle, npts
      integer*4 menuhandle1(2)
      integer*2 where(2)          ! mouse location from the event record

      integer*2 port(54)          ! grafport
      integer*2 portrect(4)
      integer*4 mywindow, proc

*
* variables for making menu selections
*
      integer*2 menuselection(2)  ! menu selection information
      ! (1) = menuid
      ! (2) = menu item number
      integer*4 menudata          ! for use left of equals sign
      integer*4 mnusel4          ! To convert menuselection(2)
      ! to 4 bytes
      character*20 itemname      ! to store the item name
      integer refnum

      equivalence (menuselection, menudata)

*
* Menu selection constants:
*
      integer Apple, Edit, File, aboutMM ! menus
      integer Simulate, Identify         ! menus
      integer Estimate                   ! menus
      integer List, Plot, Print, Printg  ! "File" menu selections
      integer Transfer, Quit
      integer White, G_Noise, U_Noise, ARMA ! "Simulate" menu selections
      integer ACF, CCF, PACF              ! "Identify" menu selections
      integer GPAC, S_array, R_array
      integer MLE                         ! "Estimate" menu selection

```

```

parameter (Apple=29, File=30, Edit=31, Simulate=32)
parameter (aboutMM=1)
parameter (Identify=33, Estimate=34)
parameter (List=1, Plot=2, Print=3, Printg=4, Transfer=5, Quit=6)
parameter (White=65, ARMA=2)
parameter (G_Noise=1, U_Noise=2)
parameter (ACF=1, CCF=2, PACF=3)      ! 4 is the separating line
parameter (GPAC=5, S_array=6, R_array=7)
parameter (MLE=1)
integer   i, j
logical   editflag, doneflag, cncflflag, exist
real      dum
character opt*4
character*64 filename, char_mtrx(3)

```

```

-----
* The MENUSELECT tool box call handles the messy details of
highlighting

```

```

* menus and menu selections, pulling menus down, and determining which
* item was selected. The HILITEMENU call at the end of the select case
* blocks actually unhighlights the menus.
-----

```

```

if (flag.eq.1) then
  opt=' ' //char(message)
  menudata=toolbx(MENUKEY, opt)
else
  menudata = toolbx(MENUSELECT, where)
endif
mnusel4= menuselection(2)      ! convert to 4 bytes
select case (menuselection(1))

  case (Apple)                ! AppleMenu
    call clrwin(tty_window)
    if(menuselection(2).EQ. aboutMM) then
      proc = 3
      dum=0
      call dlog(8200,0,0,dum,0,0,0,menuhandle1,
+         cncflflag,proc,char_mtrx)
    else
      call toolbx(GETITEM, menuhandle,
+         mnusel4, itemname)
      refnum = toolbx(OPENDSKACC, itemname)
    endif

  case (File)                 ! the "File" menu was selected

    select case (menuselection(2))

      case (List)
        call clrwin(tty_window)
        call list(tty_window)

      case (Plot)
        call toolbx(SETPORT,plot_window)
        call clrwin(plot_window)
        call subplot(array_pict,portrect,0,npts)
        call toolbx(SETPORT,tty_window) ! because it was set to
        call setcur(0)! plot_window in plot subroutine

```

```

case (Print)
  call print

case (Printg)
  rect(1)=word(plot_window+16)
  rect(2)=word(plot_window+18)
  rect(3)=word(plot_window+20)
  rect(4)=word(plot_window+22)
  call toolbox(SETPORT,plot_window)
  call toolbox(DRAWPICTURE,array_pict,rect)
  call printg(array_pict)
  call toolbox(SETPORT,tty_window)

case (Transfer)
  call transfer

case (Quit)
  inquire (file='MacModel.scratch',exist=exist)
  if (exist) then
    open(1,file='MacModel.scratch',status='old')
    close(1,status='DELETE')
  endif
  stop

end select

case (Edit)

  editflag = toolbox(SYSTEMEDIT,mnusel4-1)

case (Simulate)          ! the "Simulation" menu was selected
  select case (menuselection(2))
  case (ARMA)
    call clrwin(plot_window)
    call doarma(array_pict,portrect)
    call setcur(0)
    call toolbox(SETPORT,tty_window)
  end select

case (White)            ! the "White Noise" menu was selected
  select case (menuselection(2))
  case (G_Noise)
    call clrwin(plot_window)
    call dowhit(0,array_pict,portrect)    !0: gaussian noise
  case (U_Noise)
    call clrwin(plot_window)
    call dowhit(1,array_pict,portrect)    !1: uniform noise
  end select
  call setcur(0)
  call toolbox(SETPORT,tty_window)

case (Identify)        ! the "Correlation" menu was selected

  select case (menuselection(2))

  case (ACF)
    call clrwin(plot_window)
    call corlat(1,array_pict,portrect)

```

```

    call toolbox(SETPORT, tty_window)

case (CCF)
    call clrwin(plot_window)
    call corlat(2, array_pict, portrect)
    call toolbox(SETPORT, tty_window)

case (PACF)
    call clrwin(plot_window)
    call pacf(array_pict, portrect)
    call toolbox(SETPORT, tty_window)

case (GPAC)
    call clrwin(plot_window)
    call gpac(1, array_pict, portrect)
    call toolbox(DRAWPICTURE, array_pict, portrect)
    call toolbox(SETPORT, tty_window)

case (S_array)
    call clrwin(plot_window)
    call gpac(2, array_pict, portrect)
    call toolbox(DRAWPICTURE, array_pict, portrect)
    call toolbox(SETPORT, tty_window)

case (R_array)
    call clrwin(plot_window)
    call gpac(3, array_pict, portrect)
    call toolbox(DRAWPICTURE, array_pict, portrect)
    call toolbox(SETPORT, tty_window)

end select

case (Estimate)          ! "Estimate" menu was selected

    select case (menuselection(2))

    case (MLE)
        call clrwin(tty_window)
        call MLE

    end select

case default            ! just playing with the mouse

end select
call toolbox(HILITEMENU, 0)
end

```

```
*****
*
* dlog:  Manages all the dialog boxes with the exception of the dialog
*        that adjusts a and b.
*
*****
```

```
c w= the dlog id#
c esize= number of edit text fields
c ssize= number of static text fields
c array= data in edit fields
c okbutton= the item number of the ok button
c cancelbutton= the item number of the cancel button
c offset item number where the edit field starts ie. if ok button is
c item #1 and cancelbutton is item #2 then the offset is 2.
c NOTE: always have the ok and cancel buttons the first buttons used, if
c you don't want to have either of these buttons to be a default, then
c make a "dummy" item #1and have the ok and cancel #2 and #3. Or if you
c don't want to have a cancel buttonand you don't want the ok to be the
c default button then make a "dummy" item #1 and set the cancelbutton
c to 0 and start the ok at item #2.
c userdef is a defined variable that contains misc information.
c nmbr is the array number 1=dim,2=oper,3=fri,4=val
c cnclflag returns false if the user wants to terminate the function
c proc is a flag that to indicate the calling procedure
c char_mtrx analogous to mtrx but for characters instead of real is
c used in plot.
c proc=0 calling routine is anyone except the listed below
c proc=1 calling routine is plotgsr
c proc=2 calling routine is plot
c proc=3 calling routine is menus
c proc=4 calling routine is estm_menu
c proc=5 calling routine is doarma
c proc=6 calling routine is dowhite
c proc=7 calling routine is corlat
c proc=8 calling routine is pacf
c proc=9 calling routine is doarma (p & q dialog box)
c proc=10 calling routine is plotgsr
c proc=11 calling routine is gpac (second time only -alert-)
c proc=12 calling routine is mle
```

```
subroutine dlog(w, esize, ssize, aray, okbutton, cancelbutton, offset,
& userdef, cnclflag, proc, char_mtrx)
implicit none
include hd:include files:utilities.inc
integer*2 rect(4), itemhit, itemtype, wrect(4)
integer*4 disable
parameter(disable=128)
integer*4 j, i, offset, esize, ssize, pd, w, flag
integer*4 hte, er, toolbx
integer*4 okbutton, cancelbutton, longhit, window
integer*4 userdef(2)
integer*4 sigmoid, linear, proc, rdio_chk, check3, check4, check5
parameter (sigmoid=3, linear=4)
logical doneflag, cnclflag
character*256 str255, frchar, powr, edfld(100), blnk, static(100)
character*64 char_mtrx(*), temp
real aray(*), freal
```

```

data wrect /0,0,470,630/
doneflag = .false.

call toolbx(INITDIALOGS,0)
window=toolbx(FRONTWINDOW)
pd = toolbx(GETNEWDIALOG,w,0,-1)
call toolbx(SETPORT, pd)
c Disable the unneeded edit fields if proc is doarma
if (proc=5) then
  do I= userdef(1)+offset+1,12+offset
    !inhibit the AR edit fields
    call toolbx(GETDITEM,pd,i,itemtype,hte,rect)
    call toolbx(SETDITEM,pd,i,8+disable,hte,rect)
    !8: is static field
  enddo
  do I= userdef(2)+offset+1+12,24+offset
    !inhibit the MA edit fields
    call toolbx(GETDITEM,pd,i,itemtype,hte,rect)
    call toolbx(SETDITEM,pd,i,8+128,hte,rect)
  enddo
endif

call toolbx(SHOWWINDOW,pd)

c Inserting bolding around 'ok' button
if (okbutton<>-1) then
  call toolbx(GETDITEM,pd,okbutton,itemtype,hte,rect)
  call toolbx(PENSIZE,3,3)
  call toolbx(INSETRECT,rect,-4,-4)
  call toolbx(FRAMEROUNDRECT,rect,16,16)
endif
do 5 i=1,32
5   blnk=trim(blnk)//'
do 10 i=1,esize
10  edfld(i)='

c Get handles to static text fields and extract strings
do 15 i=1,ssize
  call toolbx(GETDITEM,pd,esize+offset+i,itemtype,hte,rect)
  call toolbx(GETITEXT,hte,static(esize+offset+i))
15  continue

c Add the numbers (actually they are characters to the edit text fields
c if the calling subroutine is PLOT or PLRGSR.
if (proc=2).OR.(proc=10) then
  do 20 i=1,esize
    powr=str255(frchar(array(i),'1PG9.3'))
    call toolbx(GETDITEM,pd,offset+i,itemtype,hte,rect)
    call toolbx(SETITEXT,hte,powr)
    powr=blnk
20  continue
endif

c items 3,4,& 5 are the text items (plot labels) in plot dialog box
if (proc=2) then
  do i=1,3
    call toolbx(GETDITEM,pd,i+2,itemtype,hte,rect)
    call toolbx(SETITEXT,hte,char_mtrx(i))
  enddo
endif

```

```

        enddo
    endif
c item # 2 in plotgsr is a text item (array title).
    if (proc=10) then
        call toolbx(GETDITEM,pd,3,itemtype,hte,rect)
        call toolbx(SETITEXT,hte,char_mtrx(1))
    endif
c add the text items of mle report (results of mle routine).
    if (proc=12) then
        do i= 1,2                !char_mtrx(10:11) are lables for edit text
            call toolbx(GETDITEM,pd,i+5,itemtype,hte,rect)
            call toolbx(SETITEXT,hte,str255(char_mtrx(i+9)))
        enddo
        do i= 1, 9
            call toolbx(GETDITEM,pd,i+13,itemtype,hte,rect)
            call toolbx(SETITEXT,hte,str255(char_mtrx(i)))
        enddo
    endif
c Put the character strings back into the static text fields
    do 25 i=1,ssize
        call toolbx(GETDITEM,pd,esize+offset+i,itemtype,hte,rect)
        call toolbx(SETITEXT,hte,static(esize+offset+i))
25    continue
    if (proc=10) then
        write(temp,83) array(3), array(4)
83    format('Array STD: ',G9.4,' Array mean: ',f8.3)
        call toolbx(GETDITEM,pd,13,itemtype,hte,rect)
        call toolbx(SETITEXT,hte,str255(temp))
    endif
    if (proc=11) then
        call toolbx(PARAMTEXT,str255(char_mtrx(1)),
+           str255(char_mtrx(2)),str255(char_mtrx(3)),
+           str255(char_mtrx(4)));
    endif

    if (proc=6).OR.(proc=7).OR.(proc=8).OR.(proc=9) then
        call toolbx(GETDITEM,pd,3,itemtype,hte,rect)
        call toolbx(SETCTLVALUE,hte,1)
        rdio_chk = 1                !1 :plot sequence
    endif
    check3=0;  check4=0;  check5=0;

    if (esize<>0) then !if there is edit fields, highlight the first
        if ((proc=5).and.(userdef(1)=0)) then !skip the AR edit fields
            call toolbx(SELITEXT,pd,offset+12+1,0,10)
        else
            call toolbx(SELITEXT,pd,offset+1,0,10)
        endif
    endif
    if (proc=12) then ! highlight first edit field if proc is mle
        call toolbx(SELITEXT,pd,7,0,10)
    endif

c Main loop
    do

c Modal dialog handles all events that the user makes.
c Itemhit is the item number from ResEdit- there will be "offset" number

```

of items

```

call toolbx(MODALDIALOG, 0, itemhit)
if (proc=3) doneflag=.true.      ! About menu
longhit = itemhit                ! 4 byte version of itemhit

if (longhit .EQ. okbutton) then
  call extract(pd,offset,esize,edfld,aray)
  if (proc=2) then
    do i=1,3                      !for edit fields with text arguments
      call toolbx(GETDITEM,pd,i+2,itemtype,hte,rect)
      call toolbx(GETITEXT,hte,char_mtrx(i))
    enddo
  endif
  if (proc=10) then              !for edit fields with text arguments
    call toolbx(GETDITEM,pd,3,itemtype,hte,rect)
    call toolbx(GETITEXT,hte,char_mtrx(1))
  endif
  if (proc=12) then
    do i=1,2                      !for edit fields with text arguments
      call toolbx(GETDITEM,pd,i+5,itemtype,hte,rect)
      call toolbx(GETITEXT,hte,char_mtrx(i+9))
    enddo
  endif
  doneflag=.true.
  cnclflag=.true.

elseif (longhit .EQ. sigmoid) .AND. (proc=1) then
  rdio_chk=sigmoid
  doneflag=.true.
  cnclflag=.true.

elseif (longhit .EQ. linear) .AND. (proc=1) then
  rdio_chk=linear
  doneflag=.true.
  cnclflag=.true.

elseif (longhit .EQ. cancelbutton) then
  doneflag=.true.
  cnclflag=.false.

+ elseif (longhit .EQ. 3) .AND. ((proc=6) .OR.
  (proc=7) .OR. (proc=8) .OR. (proc=9)) then
  call toolbx(GETDITEM,pd,3,itemtype, hte,rect)
  if (rdio_chk=1) then
    call toolbx(SETCTLVALUE,hte,0)
    rdio_chk=0
  elseif (rdio_chk=0) then
    call toolbx(SETCTLVALUE,hte,1)
    rdio_chk=1
  endif

+ elseif ((longhit=3) .OR. (longhit=4) .OR. (longhit=5)) .AND.
  (proc=12) then
  call toolbx(GETDITEM,pd,longhit,itemtype, hte,rect)
  if (longhit=3) then
    if (check3=1) then
      call toolbx(SETCTLVALUE,hte,0)
      check3=0
    
```

```

        elseif (check3=0) then
            call toolbox(SETCTLVALUE,hte,1)
            check3=1
        endif
elseif (longhit=4) then
    if (check4=2) then
        call toolbox(SETCTLVALUE,hte,0)
        check4=0
    elseif (check4=0) then
        call toolbox(SETCTLVALUE,hte,1)
        check4=2
    endif
elseif (longhit=5) then
    if (check5=4) then
        call toolbox(SETCTLVALUE,hte,0)
        check5=0
    elseif (check5=0) then
        call toolbox(SETCTLVALUE,hte,1)
        check5=4
    endif
endif
endif
if (doneflag) exit
repeat                ! Next dialog item.
if (proc=12) then
    proc = check3+check4+check5
else
    proc=rdio_chk
endif
c Closes the dialog window and redisplay the main window
call toolbox(DISPOSEDIALOG,pd)
call toolbox(SETPORT>window)
call toolbox(SELECTWINDOW>window)
return
end

-----
c Extract the characters from the edit fields
-----
subroutine extract(pd,offset,esize,edfld,aray)
implicit none
include hd:include files:utilities.inc
integer*2 rect(4),itemtype
integer*4 i,esize,pd,offset,toolbox,hte
character*256 str255,frchar,powr,edfld(100),blnk,static(100)
real array(*),freal

c Get handles to edit text fields and extract data from fields
do 10 i=1,esize
    call toolbox(GETDITEM,pd,offset+i,itemtype,hte,rect)
    call toolbox(GETITEXT,hte,edfld(i))
10 continue

c Subroutine sort takes character data from the text edit fields and
c sorts them into a real array.
call sortr(esize,edfld,aray)

return

```

end

-----  
 c Sorting routine to put the character array "edfld" into a real array  
 "aray"  
 -----

```

subroutine sortr(esize,edfld,aray)
  implicit none
  integer*4 i,esize
  character*256 edfld(*),dl
  real freal,aray(*)

  do 10 i=1,esize
    dl=edfld(i)
    aray(i)=freal(dl(2:11))
    edfld(i)=' '
10  continue
  return
end

```

-----  
 c This routine converts numeric data to character type  
 c given the following information:  
 c

```

-----
function frchar(qreal,qtype)
  implicit none
  integer*4 err
  character*(*) frchar
  character*(*) qtype
  character*16 temp
  character q1*9,q2*7
  real qreal

  if (qreal .LT. (1.0E-20) .AND. qreal.GT. (-1.0E-20)) then
    frchar=' '
  endif
c Set default conversion to F format
  q2= qtype
  q1='(//q2//) '
10  continue
  write(temp,q1,err=200)qreal
  frchar=temp
  return

200  continue
  frchar='err in conv'
  return
end

```

-----  
 c This a function routine to convert ASCII data to a REAL format.  
 c

```

-----
real function freal(temp)
  implicit none
  integer*4 i,j,k,fmt,err
  character*(*)temp
  character*20 ascii

```

```
      j=0
      k=0
      ascii='
      ascii=temp
c Find start and ending of number to convert
do 20 i = 1, 20
    if(j.EQ.0.AND.ascii(i:i).NE.' ')j=i
    IF(j.NE.0.AND.ascii(i:i).EQ.' ')then
        k=i-1
        goto 40
    endif
20  continue

c Find decimal if one is not found put one there
40  continue
    if (k.EQ.0) goto 200
    do 50 i=j,k
        if(ascii(i:i).EQ.'.') goto 60
50  continue
    k=k+1
    ascii(k:k)='.'

c Internal read to convert character numbers to real data
60  continue
    read(ascii(j:k),fmt=100,err=200) freal
100 format(G10.4)
    goto 300

200  continue
    freal=0.0

300  continue
    return
    end
```

```
*****
*
* plt_gsr: Draws the grayscale map that corresponds to numbers in GPAC,
*          S, or R arrays.
*
*****
```

```
subroutine plt_gsr(flag,array_pict,array,rows,columns,rect)
implicit none
```

```
integer flag
integer*4 array_pict,toolbx
integer ary_size,rows,columns,i,j,func_type
parameter(ary_size=26)
real theta,alpha
real array(-2*ary_size:ary_size,0:ary_size), zero_num
real nw_array(-2*ary_size:ary_size,0:ary_size)
integer array_ptrn(0:2*ary_size,0:ary_size)
character*64 filename,title
character ch*2, str255*256
integer*2 rect(4)
logical cnclflag
```

```
call ary_map(flag,cnclflag,func_type,rows,columns,title,
+           alpha,theta,zero_num,array,nw_array)
if (.NOT.cnclflag) return
call num_to_ptrn(nw_array,array_ptrn,rows,
+              columns,zero_num)
call pict_to_scrn(array_ptrn,rows,columns,title,
+              flag,array_pict,rect)
call optmap(flag,func_type,rows,columns,alpha,theta,
+          array_pict,array,rect,title)
```

```
return
end
```

```
*****
*
* ary_map: This routine apply the selected function on GPAC, S, or R
*          array entries and return the new array in nw_array
*
*****
```

```
subroutine ary_map(flag,cnclflag,func_type,rows,columns,
+ title,alpha,theta,zero_num,array,nw_array)
implicit none
```

```
integer*4 toolbx,menuhandle(2),flength
integer flag,proc,sigmoid,limiter,func_type
parameter(sigmoid=3,limiter=4)
integer g_pac,s_array,r_array
parameter(g_pac=1,s_array=2,r_array=3)
integer ary_size,rows,columns,i,j,n
parameter(ary_size=26)
real theta,alpha,ed fld_data(4),zero_num,mean,var
real array(-2*ary_size:ary_size,0:ary_size),dum
real nw_array(-2*ary_size:ary_size,0:ary_size)
character*64 char_mtrx(3),title
```

```
character ch*2, str255*256
logical cnclflag
```

c Calculate the array mean and variance

```
n=0; mean=0
do i=1,columns
  do j=0,rows-1
    if array(j,i)>10 then
      dum=10
    elseif array(j,i)<-10 then
      dum=-10
    else
      dum=array(j,i)
    endif
    mean = mean + dum
    n = n + 1
  enddo
enddo
mean = mean/float(n)

n=0; var=0
do i=1,columns
  do j=0,rows-1
    if array(j,i)>10 then
      dum=10
    elseif array(j,i)<-10 then
      dum=-10
    else
      dum=array(j,i)
    endif
    var = (dum - mean)**2 + var
    n = n + 1
  enddo
enddo
var = SQRT(var/float(n)) ! Standard deviation

proc = 1 !flag to indicate that pltsg
!is the calling routine
call dlog(5110,0,0,ed_fld_data,-1,2,4,menuhandle,
+ cnclflag,proc,char_mtrx)
if (.NOT.cnclflag) return
func_type = proc !proc is also returned as a flag
!to indicate which function (sigmoid
!or limiter) was selected
```

c set the title according to the array type

```
if (flag=g pac) then
  char mtrx(1) = str255('GPAC')
elseif (flag=s array) then
  char mtrx(1) = str255('S array')
elseif (flag=r array) then
  char_mtrx(1) = str255('R array')
endif
if (proc=sigmoid) then
  proc=10
  ed_fld_data(1) = 1/var
  ed_fld_data(2) = mean
```

```

ed_fld_data(3) = var
ed_fld_data(4) = mean
call dlog(5120,2,3,ed_fld_data,1,2,3,menuhandle,
+       cnclflag,proc,char_mtrx)
if (.NOT.cnclflag) return
alpha = ed_fld_data(1)
theta = ed_fld_data(2)
title = char_mtrx(1)
flength = ichar(title(1:1))
title = title(2:flength+1)
call lim_sigm(sigmoid,array,nw_array,rows,columns,
+       alpha,theta,zero_num)
elseif (proc=limiter) then
  proc=10
  ed_fld_data(1) = mean-var
  ed_fld_data(2) = mean+var
  ed_fld_data(3) = var
  ed_fld_data(4) = mean
  call dlog(5130,2,3,ed_fld_data,1,2,3,menuhandle,
+       cnclflag,proc,char_mtrx)
  if (.NOT.cnclflag) return
  alpha = ed_fld_data(1)
  theta = ed_fld_data(2)
  title=char_mtrx(1)
  flength = ichar(title(1:1))
  title = title(2:flength+1)
  call lim_sigm(limiter,array,nw_array,rows,columns,
+       alpha,theta,zero_num)
endif

return
end

```

```

*****
*
* num_to_ptrn: Changes GPAC, S, or R arrays entries to integer numbers
*               that correspond to certain patterns.
*
*****

```

```

subroutine lim_sigm(flag,array,nw_array,rows,columns,
+       alpha,theta,zero_num)
implicit none

integer flag,ary_size,rows, columns, i, j
parameter(ary_size=26)
real theta,alpha,zero_num
real array(-2*ary_size:ary_size,0:ary_size)
real nw_array(-2*ary_size:ary_size,0:ary_size)

if (flag=3) then ! sigmoid
  do i=0, rows-1
    do j=1,columns
      nw_array(i,j) = 1/(1+exp(-alpha*(array(i,j)-theta)))
    enddo
  enddo
  zero_num = 1/(1+exp(-alpha*(0-theta))) ! # that corresponds

```

```

! to an actual zero
return
elseif (flag=4) then      ! limiter
  if (alpha=theta) theta = theta +.1      ! Avoid zero division
  do i=0, rows-1
    do j=1, columns
      if (array(i, j)<min(alpha,theta)) then
        if (alpha>theta) then
          nw_array(i, j)= 15
        else
          nw_array(i, j)=1
        endif
      elseif (array(i, j)>max(theta,alpha)) then
        if (alpha>theta) then
          nw_array(i, j)= 1
        else
          nw_array(i, j)=15
        endif
      else
        nw_array(i, j)=(14*(array(i, j)-alpha)/
+                               (theta-alpha))+1
      endif
    enddo
  enddo
  zero_num=((-14*alpha)/(theta-alpha))+1      ! # that corresponds
! to an actual zero
return
endif
end
*****
*
* num_to_ptrn: Changes GPAC, S, or R arrays entries to integer numbers
*               that correspond to certain patterns.
*
*****

subroutine num_to_ptrn(array, array_ptrn, rows,
+                       columns, zero_num)
implicit none

integer ary_size;      parameter(ary_size=26)
real array(-2*ary_size:ary_size,0:ary_size)
real seg, max, min, zero_num
integer array_ptrn(0:2*ary_size,0:ary_size)
integer i, j, columns, rows, num_ptrn
parameter (num_ptrn=15)

* Get maximum and minimum of array

min = array(1,1)
max = array(1,1)

do j = 1, columns
  do i = 0, rows-1
    if (array(i, j)<min) min = array(i, j)
    if (array(i, j)>max) max = array(i, j)
  enddo

```

enddo

seg = float (max - min) / float (num\_ptrn)

\*  
\*  
\*  
\*  
\*

---

Classify entries of array as one of 15 patterns

---

```

do j = 1, columns
  do i = 0, rows-1
    if (array(i,j) > zero_num - seg / 2.) .AND.
      (array(i,j) < zero_num + seg / 2) then
+       array_ptrn(i,j) = 0
    elseif (array(i,j) < min + seg) then
+       array_ptrn(i,j) = num_ptrn
    elseif (min + seg <= array(i,j) .and.
+       array(i,j) < min + 2 * seg) then
+       array_ptrn(i,j) = num_ptrn - 1
    elseif (min + 2 * seg <= array(i,j) .and.
+       array(i,j) < min + 3 * seg) then
+       array_ptrn(i,j) = num_ptrn - 2
    elseif (min + 3 * seg <= array(i,j) .and.
+       array(i,j) < min + 4 * seg) then
+       array_ptrn(i,j) = num_ptrn - 3
    elseif (min + 4 * seg <= array(i,j) .and.
+       array(i,j) < min + 5 * seg) then
+       array_ptrn(i,j) = num_ptrn - 4
    elseif (min + 5 * seg <= array(i,j) .and.
+       array(i,j) < min + 6 * seg) then
+       array_ptrn(i,j) = num_ptrn - 5
    elseif (min + 6 * seg <= array(i,j) .and.
+       array(i,j) < min + 7 * seg) then
+       array_ptrn(i,j) = num_ptrn - 6
    elseif (min + 7 * seg <= array(i,j) .and.
+       array(i,j) < min + 8 * seg) then
+       array_ptrn(i,j) = num_ptrn - 7
    elseif (min + 8 * seg <= array(i,j) .and.
+       array(i,j) < min + 9 * seg) then
+       array_ptrn(i,j) = num_ptrn - 8
    elseif (min + 9 * seg <= array(i,j) .and.
+       array(i,j) < min + 10 * seg) then
+       array_ptrn(i,j) = num_ptrn - 9
    elseif (min + 10 * seg <= array(i,j) .and.
+       array(i,j) < min + 11 * seg) then
+       array_ptrn(i,j) = num_ptrn - 10
    elseif (min + 11 * seg <= array(i,j) .and.
+       array(i,j) < min + 12 * seg) then
+       array_ptrn(i,j) = num_ptrn - 11
    elseif (min + 12 * seg <= array(i,j) .and.
+       array(i,j) < min + 13 * seg) then
+       array_ptrn(i,j) = num_ptrn - 12
    elseif (min + 13 * seg <= array(i,j) .and.
+       array(i,j) < min + 14 * seg) then
+       array_ptrn(i,j) = num_ptrn - 13
    elseif (min + 14 * seg <= array(i,j) .and.
+       array(i,j) <= max) then
+       array_ptrn(i,j) = num_ptrn - 14

```

```

        else
            array_ptrn(i,j) = 16
        endif
    enddo
enddo
return
end

```

```

*****
*
* pict_to_scrn : draws picture of GPAC, S, or R arrays and maps it to
*               screen
*
*****

```

```

subroutine pict_to_scrn(array_ptrn, rows, columns, title,
+                       flag, array_pict, rect1)
implicit none

integer*4 toolbox, flag
integer ary_size;      parameter(ary_size=26)
integer array_ptrn(0:2*ary_size, 0:ary_size)
integer columns, rows, i, j
integer*4 array_pict, w, h, title_len, t_start
integer*2 rect(4), rect1(4)
character str255*256, title*64

integer TEXTFONT, TEXTFACE, TEXTMODE, TEXTSIZE, SPACEEXTRA, DRAWCHAR,
+       DRAWSTRING, DRAWTEXT, CHARWIDTH, STRINGWIDTH, TEXTWIDTH,
+       GETFONTINFO
parameter (TEXTFONT=Z'88708000', TEXTFACE=Z'88808000',
+         TEXTMODE=Z'88908000', TEXTSIZE=Z'88A08000',
+         SPACEEXTRA=Z'88E10000', DRAWCHAR=Z'88308000',
+         DRAWSTRING=Z'88430000', DRAWTEXT=Z'88511200',
+         CHARWIDTH=Z'88D48000', STRINGWIDTH=Z'88C70000',
+         TEXTWIDTH=Z'88651200', GETFONTINFO=Z'88B30000')

integer OPENPICTURE, KILLPICTURE, CLOSEPICTURE, DRAWPICTURE
parameter (OPENPICTURE=Z'8F3B0000', KILLPICTURE=Z'8F510000',
+         CLOSEPICTURE=Z'8F400000', DRAWPICTURE=Z'8F616000')
integer SETRECT, CLIPRECT, FILLRECT, FRAMERECT
parameter (SETRECT=Z'8A731248', CLIPRECT=Z'87B30000',
+         FILLRECT=Z'8A536000', FRAMERECT=Z'8A130000')
integer MOVETO, HIDEPEN, SHOWPEN, PENSIZE
parameter (MOVETO=Z'89309000', HIDEPEN=Z'89600000',
+         SHOWPEN=Z'89700000', PENSIZE=Z'89B09000')
INTEGER ERASERECT
PARAMETER (ERASERECT=Z'8A330000')
integer*1 pat0(8), pat1(8), pat2(8), pat3(8), pat4(8)
integer*1 pat5(8), pat6(8), pat7(8), pat8(8)
integer*1 pat9(8), pat10(8), pat11(8), pat12(8)
integer*1 pat13(8), pat14(8), pat15(8), pat16(8)

```

c this pattern (pat16) is just to detect if a number in array\_ptrn  
c was not accounted for (for error detection and debug)

```

data pat16 /b'00000000',

```

```
+          b'11111111',
+          b'00000000',
+          b'11111111',
+          b'00000000',
+          b'11111111',
+          b'00000000',
+          b'11111111'/'
```

```
data pat15 /b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00000000'/'
```

```
data pat14 /b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00010000',
+          b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00000000'/'
```

```
data pat13 /b'10000000',
+          b'00000000',
+          b'00000000',
+          b'00000000',
+          b'00001000',
+          b'00000000',
+          b'00000000',
+          b'00000000'/'
```

```
data pat12 /b'10000000',
+          b'00000000',
+          b'00001000',
+          b'00000000',
+          b'10000000',
+          b'00000000',
+          b'00001000',
+          b'00000000'/'
```

```
data pat11 /b'10001000',
+          b'00000000',
+          b'00100010',
+          b'00000000',
+          b'10001000',
+          b'00000000',
+          b'00100010',
+          b'00000000'/'
```

```
data pat10 /b'10001000',
+          b'00100010',
+          b'10001000',
+          b'00100010',
```

```
+          b'10001000',
+          b'00100010',
+          b'10001000',
+          b'00100010'/

data pat9 /b'11001100',
+          b'00110011',
+          b'11001100',
+          b'00110011',
+          b'11001100',
+          b'00110011',
+          b'11001100',
+          b'00110011'/

data pat8 /b'10101010',
+          b'01010101',
+          b'10101010',
+          b'01010101',
+          b'10101010',
+          b'01010101',
+          b'10101010',
+          b'01010101'/

data pat7 /b'01110111',
+          b'11011101',
+          b'01110111',
+          b'11011101',
+          b'01110111',
+          b'11011101',
+          b'01110111',
+          b'11011101'/

data pat6 /b'10101010',
+          b'11111111',
+          b'01010101',
+          b'11111111',
+          b'10101010',
+          b'11111111',
+          b'01010101',
+          b'11111111'/

data pat5 /b'01110111',
+          b'11111111',
+          b'11011101',
+          b'11111111',
+          b'01110111',
+          b'11111111',
+          b'11011101',
+          b'11111111'/

data pat4 /b'01111111',
+          b'11111111',
+          b'11110111',
+          b'11111111',
+          b'01111111',
+          b'11111111',
+          b'11110111',
+          b'11111111'/
```

```

    data pat3 /b'01111111',
+           b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11110111',
+           b'11111111',
+           b'11111111',
+           b'11111111'/

    data pat2 /b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11101111',
+           b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11111111'/

    data pat1 /b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11111111',
+           b'11111111'/
                ! this pattern replaces the patterns of the
                ! numbers within a seg/2 from zero
    data pat0 /b'11110000',
+           b'11110000',
+           b'11110000',
+           b'11110000',
+           b'00001111',
+           b'00001111',
+           b'00001111',
+           b'00001111'/

    call toolbox(SETRECT, rect, 0, 0, 512, 342)
    call toolbox(CLIPRECT, rect)
    h = (rect1(3)-rect1(1)-21)/rows
    w = (rect1(4)-rect1(2)-20)/columns
    array_pict = toolbox(OPENPICTURE, rect1)
c Array title
c   monaco 9 point is 5 pixels horizontal and 7 vertical per character
    title_len = len(trim(title))
    t_start = (rect1(4)-rect1(2))/2 - 5*title_len/2
    call toolbox(MOVETO,t_start,9)
    write(9,90) title
    90   format (A64)
c print row indicies
    do i=0,rows-1
        call toolbox(SETRECT, rect,1*w-w,i*h,1*w,i*h+h)
        call toolbox(MOVETO,0,21+i*h+h/2+3)
        if (flag=1) then
            write(9,91) i
        elseif (flag=2).OR.(flag=3) then

```

```

        write(9,91) -rows/2+i
    endif
91     format (i3)
    enddo
c print column indicies
    do j=1,columns+1
        call toolbox(SETRECT, rect,j*w-w,0*h,j*w,0*h+h)
        call toolbox(MOVETO,20+j*w-w/2-7,19)
        write(9,92) j
92     format (i2)
    enddo
    call toolbox(MOVETO,20,19)

    do j=1, columns
        do i=0, rows-1
c 20 & 19 are the horizontal and vertical offset respectively
        call toolbox(SETRECT, rect,20+j*w-w,21+i*h,
+           20+j*w,21+i*h+h)
            select case(array_ptrn(i,j))
            case(0)
                call toolbox(FILLRECT, rect, pat0)
            case(1)
                call toolbox(FILLRECT, rect, pat1)
            case(2)
                call toolbox(FILLRECT, rect, pat2)
            case(3)
                call toolbox(FILLRECT, rect, pat3)
            case(4)
                call toolbox(FILLRECT, rect, pat4)
            case(5)
                call toolbox(FILLRECT, rect, pat5)
            case(6)
                call toolbox(FILLRECT, rect, pat6)
            case(7)
                call toolbox(FILLRECT, rect, pat7)
            case(8)
                call toolbox(FILLRECT, rect, pat8)
            case default
                call toolbox(FILLRECT, rect, pat9)
            case(10)
                call toolbox(FILLRECT, rect, pat10)
            case(11)
                call toolbox(FILLRECT, rect, pat11)
            case(12)
                call toolbox(FILLRECT, rect, pat12)
            case(13)
                call toolbox(FILLRECT, rect, pat13)
            case(14)
                call toolbox(FILLRECT, rect, pat14)
            case(15)
                call toolbox(FILLRECT, rect, pat15)
            case default
                call toolbox(FILLRECT, rect, pat16)
            end select
        call toolbox(FRAMERECT, rect)
    enddo
    enddo
call toolbox(CLOSEPICTURE, array_pict)

```

```

call toolbox(DRAWPICTURE, array_pict, rect1)
return
end

```

```

*****
*
* optmap : Displays a dialogbox then it retrieves the new value of alpha
*          or theta before redrawing the grayscale map.
*
*****

```

```

subroutine optmap(flag,func_type,rows,columns,alpha,
+               theta,array_pict,array,rect,title)
implicit none
include hd:include.files:utilities.inc
integer flag,rows, columns,array_pict,hte,func_type
integer*2 itemhit,itemtype,ibox(4),rect(4),j
integer*4 pd,toolbox,longhit>window,ihandle
integer*4 done,less_a,more_a,less_b,more_b
parameter(done=1,less_a=2,more_a=3,less_b=4,more_b=5)
integer ary_size;          parameter(ary_size=26)
real theta,alpha
real freall,zero_num,inc_alpha,inc_theta
real array(-2*ary_size:ary_size,0:ary_size)
real nw_array(-2*ary_size:ary_size,0:ary_size)
integer array_ptrn(0:2*ary_size,0:ary_size)
character*256 str255,static(4),edfld,alfa_theta
character title*64, temp*10
logical doneflag

doneflag=.false.
call toolbox(INITDIALOGS,0)
window=toolbox(FRONTWINDOW)
pd = toolbox(GETNEWDIALOG,5150,0,-1)
call toolbox(SETPORT,pd)
call toolbox(SHOWWINDOW,pd)

```

c Inserting bolding around 'ok' button

```

call toolbox(GETDITEM,pd,done,itemtype,ihandle,ibox)
call toolbox(PENSIZE,3,3)
call toolbox(INSETRECT,ibox,-4,-4)
call toolbox(FRAMEROUNDRECT,ibox,16,16)

```

```

do 10 j=1,3
  call toolbox(GETDITEM,pd,j+7,itemtype,ihandle,ibox)
  call toolbox(GETITEXT,ihandle,static(j))

```

10 continue

```

do 20 j=1,3
  call toolbox(GETDITEM,pd,j+7,itemtype,ihandle,ibox)
  if (j=1) then      ! display alpha on dialog box
    write(temp,90) alpha
    static(j) = str255('a'//temp)
  elseif (j=2) then ! display theta on dialog box
    write(temp,90) theta
    static(j)=str255('b'//temp)
  endif
  call toolbox(SETITEXT,ihandle,static(j))

```

20 continue

```

    call toolbox(SELITEXT,pd,6,0,10)
    inc_alpha = 0.2
    inc_theta = 0.2
c   main loop
    do
        call toolbox(MODALDIALOG,0,itemhit)
                                !itemhit is the item number from
ResEdit
        longhit = itemhit      ! 4 byte version.
        if (longhit .EQ. done) then
            doneflag=.true.
        elseif (longhit .EQ. less_a) then
            alpha=alpha-inc_alpha
        elseif (longhit .EQ. more_a) then
            alpha=alpha+inc_alpha
        elseif (longhit .EQ. less_b) then
            theta=theta-inc_theta
        elseif (longhit .EQ. more_b) then
            theta=theta+inc_theta
        elseif (longhit .EQ. 6).OR.(longhit .EQ. 7) then
            call toolbox(GETDITEM,pd,longhit,itemtype,hte,ibox)
            call toolbox(GETITEXT,hte,edfld)
            if (longhit=6) inc_alpha= freall(edfld(2:11))
            if (longhit=7) inc_theta= freall(edfld(2:11))
            edfld = '
        endif
        if (longhit=less_a).OR.(longhit=more_a).OR.
+         (longhit=less_b).OR.(longhit=more_b) then
            if (alpha<-9.99) alpha=-9.99
            if (alpha>9.99) alpha =9.99
            if (theta<-9.99) theta=-9.99
            if (theta>9.99) theta =9.99
c Update alpha or theta
            if (longhit=less_a).OR.(longhit=more_a) then
                call toolbox(GETDITEM,pd,(longhit+6)/2*2,
+                                     itemtype,hte,ibox)
                write(temp,90) alpha
                format(f5.2)
                temp='a'//temp
            else
                ! (longhit=less_b).OR.(longhit=more_b)
                call toolbox(GETDITEM,pd,(longhit+4)/2*2+1,
+                                     itemtype,hte,ibox)
                write(temp,90) theta
                temp='b'//temp
            endif
            alfa_theta= temp
            call toolbox(SETITEXT,hte,str255(alfa_theta))

c Subroutine calls to update the grayscale map.
        call toolbox(SETPORT>window)
        call lim_sigm(func_type,array,nw_array,rows,columns,
+                 alpha,theta,zero_num)
        call num_to_ptrn(nw_array,array_ptrn,rows,
+                 columns,zero_num)
        call pict_to_scrn(array_ptrn,rows,columns,title,
+                 flag,array_pict,rect)
        call toolbox(DRAWPICTURE,array_pict,rect)

```

```

endif

call toolbox(SETPORT,pd)
if (doneflag) exit
repeat

call toolbox(DISPOSEDIALOG,pd)
call toolbox(SETPORT>window)
call toolbox(SELECTWINDOW>window)
return
end

```

```

-----
c   This a function routine to convert ASCII data to a REAL format.
c   This function is duplicated in dlog.for.  Keep only one.
-----

```

```

real function freall(temp)
implicit none
integer*4 i,j,k,fmt,err
character*(*)temp
character*20 ascii

j=0
k=0
ascii=' '
ascii=temp
c Find start and ending of number to convert
do 20 i = 1, 20
  if(j.EQ.0.AND.ascii(i:i).NE.' ')j=i
  IF(j.NE.0.AND.ascii(i:i).EQ.' ')then
    k=i-1
    goto 40
  endif
20  continue

c Find decimal if one is not found put one there
40  continue
  if (k.EQ.0) goto 200
  do 50 i=j,k
    if(ascii(i:i).EQ.'.') goto 60
50  continue
  k=k+1
  ascii(k:k)='.'

c Internal read to convert character numbers to real data
60  continue
  read(ascii(j:k),fmt=100,err=200)freall
100 format(G10.4)
  goto 300

200  continue
  freall=0.0

300  continue
  return
end

```

```

*****
*
* plot:  plots any given data (x,y) to the screen.  Also it returns
*        a picture handel of the plot.  The size of the plot is rect.
*
*****
      subroutine plot(plotpic,rect,proc,x,y,npts)
      implicit none
      include hd:Include files:utilities.inc

      integer*4  toolbx,xmajor,xminor,ymajor,yminor,npts
      integer*4  xaxsmin,xaxsmax,yaxsmin,yaxsmax,plotpic
      integer    i,eof,status,plotseq;parameter(eof=-1)
      integer*2  rect(4)
      integer*4  proc
      character*64 filename,xaxis,yaxis,title,prompt
      real x(*), y(*)

      data xmajor,xminor,ymajor,yminor/8,10,6,10/
                                ! for short and long tick marks

      if (proc=0) then
        prompt = 'Select a file to plot:'
        call getfil('TEXT', filename,prompt)
        if (filename=' ') return

        call setcur(4)
        open(unit=2, file=filename)
        i=1; status=0
        while ((status<>eof).and.(i<4000))
          read(2,*,IOSTAT=status) x(i), y(i)
          i=i+1
        repeat
100      npts = i-2
          close(2)
        endif

        xaxsmin=80
        xaxsmax=rect(4) - 15
        yaxsmin=25
        yaxsmax=rect(3) - 40
        xaxis='x-axis'
        yaxis='y-axis'
        if (proc=6) then
          title='noise sequence'
        elseif (proc=7) then
          title='correlation sequence'
        elseif (proc=8) then
          title='PACF sequence'
        elseif (proc=9) then
          title='arma sequence'
        else
          title=filename
        endif

        call plot_data(npts,x,y,xmajor,xminor,ymajor,yminor,xaxsmin,
&          xaxsmax,yaxsmin,yaxsmax,xaxis,yaxis,title,rect,plotpic)

```

```

call setcur(0)
return
end

```

```

-----
C
C
C   The program uses the following variables:
C
C   num- this is the number of data points that are to be plotted.
C   x(*)- this is the array for the x-axis points
C   y(*)- this is the array for the y-axis points
C   xmajor- the number of x-axis major divisions
C   xminor- the number of x-axis minor divisions
C   ymajor- the number of y-axis major divisions
C   yminor- the number of y-axis minor divisions
C   xaxsmin- the starting point for the x-axis in pixels
C   xaxsmax- the ending point for the x-axis in pixels
C   yaxsmin- the starting point for the y-axis in pixels
C   yaxsmax- the ending point for the y-axis in pixels
C   xaxis- the title for the x-axis
C   yaxis- the title for the y-axis
C   title- the title for the plot
-----

```

```

subroutine plot_data(num,x,y,xmajor,xminor,ymajor,yminor,xaxsmin
& ,xaxsmax,yaxsmin,yaxsmax,xaxis,yaxis,title,rect,plotpic)
implicit none
include hd:Include files:utilities.inc
integer*4 xticx,xticy,xticxm,yticx,yticy,yticym,toolbx,h,v,error
integer*4 xmajor,xminor,ymajor,yminor,rk,dx,dy,xlen,xstart
integer*4 xaxsmin,xaxsmax,yaxsmin,yaxsmax,plotpic,ylen,ystart
integer*4 j,tlen,tstart,flength,num
integer*2 rect(4),rect1(4)
integer*4 menuhandle(2),proc
character*1 ychar
character*64 xaxis,yaxis,title,char_mtrx(3)
character*256 str255
real xmax,xmin,ymax,ymin,xmax2,ymax2,xmin2,ymin2
real delx,dely,delx2,dely2,varx,vary
real x(*),y(*),mtrx(4)
logical cnclflag

call automatic(x,y,num,xmax,xmin,ymax,ymin)
xmax2=xmax
xmin2=xmin
ymax2=ymax
ymin2=ymin
mtrx(1)=xmin2
mtrx(2)=xmax2
mtrx(3)=ymin2
mtrx(4)=ymax2
char_mtrx(1)=str255(xaxis)
char_mtrx(2)=str255(yaxis)
char_mtrx(3)=str255(title)
proc=2
call setcur(0)
call dlog(1300,4,6,mtrx,1,2,5,menuhandle,cnclflag,
+      proc,char_mtrx)
call setcur(4)
if (.NOT.cnclflag) return          ! was the button hit Cancel?

```

```

xaxis=char mtrx(1)
flength = Ichar(xaxis(1:1))
xaxis = xaxis(2:flength+1)
yaxis=char mtrx(2)
flength = Ichar(yaxis(1:1))
yaxis = yaxis(2:flength+1)
title=char mtrx(3)
flength = Ichar(title(1:1))
title = title(2:flength+1)
xmin2=mtrx(1)
xmax2=mtrx(2)
ymin2=mtrx(3)
ymax2=mtrx(4)
delx=(xmax-xmin)/float(xmajor)
  delx2=(xmax2-xmin2)/float(xmajor)
  dely=(ymax-ymin)/float(ymajor)
  dely2=(ymax2-ymin2)/float(ymajor)

  call toolbox(TEXTFONT,4)      !monaco
  call toolbox(TEXTSIZE,9)     ! 9 pt.
rect1(1) =0
rect1(2) =0
rect1(4) =512
rect1(3) =342
call toolbox(CLIPRECT, rect1)
call toolbox(ERASERECT,rect)
plotpic=toolbox(OPENPICTURE,rect)
c-----
c set up the labels on axis
c-----
c the x axis
c monaco 9 point is 5 pixels horizontal per character
xlen=len(trim(xaxis))
xstart=((xaxsmax-xaxsmin)/2 + xaxsmin) - 5*xlen/2
  call toolbox(MOVETO,xstart,yaxsmax+35)
  write(9,60)xaxis
60   format(A64)

c the y axis
c monaco 9 point is 7 pixels vertical per character
ylen=len(trim(yaxis))
ystart=((yaxsmax-yaxsmin)/2 + yaxsmin) - 7*ylen/2
h=xaxsmin-70
v=ystart
  call toolbox(MOVETO,h,v)
do 65 j=1,ylen
ychar=yaxis(j:j)
  write(9,70)ychar
v=ystart+11*j
  call toolbox(MOVETO,h,v)
65  continue
70  format(A1)

c the title
tlen=len(trim(title))
tstart=((xaxsmax-xaxsmin)/2 + xaxsmin) - 5*tlen/2
call toolbox(MOVETO,tstart,yaxsmin-3)
write(9,75)title

```

```

75   format (A50)
C-----
c set up the numbers on the axis
C-----
c the x axis
  call toolbx (MOVETO,xaxsmin-20,yaxsmax+15)
  do 90 j=1,xmajor+1
  varx=xmin2+(delx2*(float(j)-1.))
  write(9,80)varx
80   format (1PG9.3,$)
  h=(xaxsmin-20)+(j*(xaxsmax-xaxsmin)/xmajor)
  call toolbx (MOVETO,h,yaxsmax+15)
90   continue

c the y axis
  call toolbx (MOVETO,xaxsmin-55,yaxsmax+2)
  do 110 rk=1,ymajor+1
  vary=ymin2+(dely2*(float(rk)-1.))
  write(9,100)vary
100  format (1PG9.3,$)
  v=(yaxsmax+2)-(rk*(yaxsmax-yaxsmin)/ymajor)
  call toolbx (MOVETO,xaxsmin-55,v)
110  continue
C-----
c set up axis
C-----
  call toolbx (MOVETO,xaxsmin,yaxsmin)
  call toolbx (LINETO,xaxsmin,yaxsmax)
  call toolbx (LINETO,xaxsmax,yaxsmax)
  call toolbx (LINETO,xaxsmax,yaxsmin)
  call toolbx (LINETO,xaxsmin,yaxsmin)
C-----
c set up tick marks on x axis
C-----
  do j =1, xmajor*xminor
  xtix=xaxsmin+j*(xaxsmax-xaxsmin)/(xminor*xmajor)
  yticx=yaxsmax
  call toolbx (MOVETO,xticx,yticx)
  if (mod(j,xminor)=0) then
    call toolbx (LINETO,xticx,yticx-5)      !Major tick marks
  else
    call toolbx (LINETO,xticx,yticx-3)      !Minor tick marks
  endif
  enddo
C-----
c set up tick marks on y axis
C-----
  do j =1, ymajor*yminor
  xticy=xaxsmin
  yticx=yaxsmax-j*(yaxsmax-yaxsmin)/(ymajor*yminor)
  call toolbx (MOVETO,xticy,yticx)
  if (mod(j,yminor)=0) then
    call toolbx (LINETO,xticy+5,yticx)      !Major tick marks
  else
    call toolbx (LINETO,xticy+3,yticx)      !Minor tick marks
  endif
  enddo
C-----

```

```

c draw the y = 0 line (if it exists)
c-----
  if (ymax2*ymin2.LT.0.) then
    dx=xaxsmin
    dy=int(float(yaxsmax)-float(yaxsmax-yaxsmin)*(0.0-ymin2)
    &      / (ymax2-ymin2))
    call toolbx(MOVETO,dx,dy)
    dx=xaxsmax
    call toolbx(LINETO,dx,dy)
  endif

```

```

c-----
c plot points
c-----
  dx=xaxsmin+(xaxsmax-xaxsmin)*(x(1)-xmin2)/(xmax2-xmin2)
  dy=yaxsmax-(yaxsmax-yaxsmin)*(y(1)-ymin2)/(ymax2-ymin2)
  h=dx
  v=dy
  call toolbx(MOVETO,h,v)
  do 160 j=2,num
    dx=int(float(xaxsmin)+float(xaxsmax-xaxsmin)*(x(j)-xmin2)
    &      / (xmax2-xmin2))
    dy=int(float(yaxsmax)-float(yaxsmax-yaxsmin)*(y(j)-ymin2)
    &      / (ymax2-ymin2))
    h=dx
    v=dy
    call toolbx(LINETO,h,v)
160  continue

```

```

c-----
c end of program
c-----
  call toolbx(CLOSEPICTURE)
  call toolbx(DRAWPICTURE,plotpic,rect)
  return
end

```

```

c-----
c subroutine automatic finds the max and min of the two data arrays
c-----

```

```

  subroutine automatic(x,y,num,xmax,xmin,ymax,ymin)
  implicit none
  integer*4 j
  real xmax,xmin,ymax,ymin
  real x(*),y(*)
  xmax=x(1)
  xmin=x(1)
  ymax=y(1)
  ymin=y(1)
  do 190 j=2,num
    IF (x(j) .GT. xmax) xmax=x(j)
    IF (x(j) .LT. xmin) xmin=x(j)
    IF (y(j) .GT. ymax) ymax=y(j)
    IF (y(j) .LT. ymin) ymin=y(j)
190  continue
  IF (xmin = xmax) xmax = xmax + 1
  IF (ymin = ymax) ymax = ymax + 1
  return
end

```

```

*****
*
* dowhit: generates gaussian or unifom noise.
*       flag : 1 (uniform noise)
*           2 (gaussian noise)
*
*****

subroutine dowhit(flag,plotpic,rect)
implicit none
include hd:include files:utilities.inc

integer flag

integer*4 toolbx, error, misc(2),plotpic
integer*2 rect(4)
integer npts,i,seed,plotseq,proc
real noisebuf(4000),x(4000),mean,var,ed_fld_data(5)
character temp*3
integer*2 good
character*64 FILENAME, prompt, origname,char_mtrx(4)
logical cnclflag

proc=6
ed_fld_data(1) = 0.           !mean
ed_fld_data(2) = 1.           !var
ed_fld_data(3) = 5709         !seed
ed_fld_data(4) = 500         !# of pts as displayed in dialog box
call dlog(3100,4,4,ed_fld_data,1,2,3,misc,
+         cnclflag,proc,char_mtrx)
if (.NOT.cnclflag) return
call setcur(4)
mean = ed_fld_data(1)
var = ed_fld_data(2)
seed = int(ed_fld_data(3))
npts = int(ed_fld_data(4))
plotseq=proc                !proc returns 1 if plot is needed

if (npts>4000) then
proc=11
char_mtrx(1)=' '
char_mtrx(2)='Cannot generate more than 4000 points.'
char_mtrx(3)=' '
char_mtrx(4)='4000 points are being generated'
call dlog(515,0,0,ed_fld_data,1,0,2,misc,
+         cnclflag,proc,char_mtrx)
npts=4000
endif

call white(mean,var,seed,flag,npts,noisebuf)
prompt = "save noise sequence as:"
origname = "noise.dat"
call setcur(0)
call putfil(FILENAME, prompt, origname)
if (filename<>' ') then
call setcur(4)
open(1,file=filename,status='new')

```

```

do i=1,npts
  write(1,*) i-1,',',noisebuf(i)
enddo
close(1)
endif

if (plotseq = 1) then
do i=1,npts
  x(i)=i-1
enddo
  call plot(plotpic,rect,6,x,noisebuf,npts)
endif
return
end

```

```

*****
*
* WHITE: CALCULATES WHITE NOISE. THE USER IS PROMPTED FOR
* THE MEAN, VARIANCE, AND SEED.
*
*****

```

```

SUBROUTINE WHITE(MEAN, VAR, SEED, FLAG, N, E)

```

```

implicit none
INTEGER SEED, FLAG,N,I,J
REAL RANDOM,MEAN,E(*),VAR

IF (FLAG.EQ.1) THEN !uniform noise
DO I=1,N
E(I)= RANDOM(SEED)*SQRT(VAR*12.) + MEAN
ENDDO
ELSEIF (FLAG.EQ.0) THEN !gaussian noise
DO 20 I=1,N
E(I)=0
DO J=1,12
E(I)=E(I)+RANDOM(SEED)
ENDDO
E(I)=E(I)*SQRT(VAR*1.) + MEAN
ENDDO
ENDIF
END

```

```

REAL FUNCTION RANDOM(SEED)

```

```

INTEGER SEED

SEED=MOD(3125*SEED,65536)
RANDOM=(SEED/65536.) - 0.5
RETURN
END

```

```

*****
*
* doarma: Simulates ARMA, AR, and MA.
*
*****
      subroutine doarma(plotpic,rect)

      implicit none
      integer*4  toolbx,p_and_q(2),proc,dum,plotpic,plotseq
      integer*2  rect(4)
      integer p,q,i,npts,status,eof  ;parameter(eof=-1)
      character*64 filename, prompt, origname,char_mtrx(3)
      real  noisebuf(-20:4000,2),armabuf(-20:4000)
      real  phi(20),theta(20), ed_fld_data(25),x(4000),y(4000)
      logical cnclflag

*
* prompt the user for parameters needed
*

      proc=9                !calling proc. is doarma
      ed_fld_data(1) = 0.    !AR order (p)
      ed_fld_data(2) = 0.    !MA order (q)
      call dlog(3200,2,3,ed_fld_data,1,2,3,p_and_q,
+          cnclflag,proc,char_mtrx)
      if (.NOT.cnclflag) return
      p = int(ed_fld_data(1))
      q = int(ed_fld_data(2))
      if (p>12) p=12
      if (p<0) p =0
      if (q>12) q=12
      if (q<0) q =0
      if ((p=0).and.(q=0)) return
      plotseq = proc

      do i=1,25
         ed_fld_data(i) = 0.0    !parameters
      enddo
      proc=5
      p_and_q(1) = p              ! send p & q to display exactly
      p_and_q(2) = q              ! p+q edit fields
      call dlog(3210,24,0,ed_fld_data,1,2,2,p_and_q,
+          cnclflag,proc,char_mtrx)
      if (.NOT.cnclflag) return
      call setcur(4)
      dum=0
      do i=1,p
         phi(i) = ed_fld_data(i)          !AR parameters
         if (phi(i)<>0) dum=dum+1
      enddo
      do i=1,q
         theta(i) = ed_fld_data(12+i)    !MA parameters
         if (theta(i)<>0) dum=dum+1
      enddo
      if (dum=0) return            ! dum=0 if all parameters are zeros
      call setcur(0)
      prompt = 'Select a noise file input to ARMA:'
      call getfil("TEXT",filename,prompt)

```

```

    if (filename=' ') return
    call setcur(4)
*
* read data from 'filename' file
*
    open(unit=2, file=filename)
    i=0; status=0
    while ((status<>eof).and.(i<4000))
        read(2,*,IOSTAT=status) noisebuf(i,1), noisebuf(i,2)
        i=i+1
    repeat
    npts = i-1
    close(2)

    call arma(phi,p,theta,q,npts,noisebuf,armabuf)

*
* prompt the user for output file and save data to it
*
    prompt = "save ARMA sequence as:"
    origname = "arma.dat"
    call setcur(0)
    call putfil(filename,prompt,origname)
    if (filename<>' ') then
        call setcur(4)
        open(1,file=filename,status='new' )
        do i=0,npts-1
            write(1,*) noisebuf(i,1),',',armabuf(i)
        enddo
        close(1)
    endif
    if (plotseq=1) then
        do i=1,npts
            x(i) = noisebuf(i-1,1)
            y(i) = armabuf(i-1)
        enddo
        call plot(plotpic,rect,9,x,y,npts)
    endif
    call setcur(0)

    return
    end

*****
*
* ARMA: CALCULATES AN ARMA SEQUENCE GIVEN ITS ORDERS AND
* PARAMETERS.
*
*****
SUBROUTINE ARMA (PHI,P,THETA,Q,N,E,Z)

IMPLICIT NONE
INTEGER P,Q,I,K,N
REAL Z(-20:4000), E(-20:4000,2), PHI(20), THETA(20), ACC

DO 10 I=-20,N-1
10 Z(I)=0

```

```
DO 20 I=-20,-1
  E(I,2)=0

DO 30 K=0,N-1
  DO 40 I=1,P
    Z(K)=Z(K) + PHI(I)*Z(K-I)
  DO 50 I= 1,Q
    Z(K)=Z(K) - THETA(I)*E(K-I,2)
  Z(K) = Z(K) + E(K,2)
END
```

```

*****
*
*   CORLAT: PERFORMS AUTOCORRELATION AND CROSSCORRELATION
*
*****

```

```

subroutine corlat(flag,plotpic,rect)

implicit none

integer*2 rect(4)
integer*4 flag,proc,plotseq,plotpic,cross,acf
parameter(acf=1,cross=2)
integer*4 toolbx,error,misc(2)
integer lags,npts,npts2,i,status,eof ;parameter(eof=-1)
character*64 filename,prompt,origname,char_mtrx(4)
character*3 temp
real databuf1(0:4000,2),databuf2(0:4000,2),ed_fld_data
real x(1000),y(1000)
logical cncflflag

proc=7
ed_fld_data = 0 !ACF lags
call dlog(4100,1,1,ed_fld_data,1,2,3,misc,
+ cncflflag,proc,char_mtrx)
if (.NOT.cncflflag) return
lags = int(ed_fld_data)
plotseq=proc
if (lags>1000) then
  proc=11
  char_mtrx(1)=''
  char_mtrx(2)='A maximum of 1000 lags can be generated.'
  char_mtrx(3)='1000 ACF lags are being generated.'
  char_mtrx(4)=''
  call dlog(515,0,0,ed_fld_data,1,0,2,misc,
+ cncflflag,proc,char_mtrx)
endif
prompt = 'Select an input file for correlation:'
call getfil("TEXT",filename,prompt)
if (filename=' ') return

c read data from 'filename' file
call setcur(4)
open(unit=2, file=filename)
i=0; status=0
while ((status<>eof).and.(i<1000))
  read(2,*,IOSTAT=status) databuf1(i,1), databuf1(i,2)
  i=i+1
repeat
npts = i-2
close(2)

if (lags>=npts) then
  call setcur(0)
  proc=11
  lags = npts-1
  write(temp,92) lags

```

```

92   format (I3)
      char_mtrx(1)=''
      char_mtrx(2)='Lags MUST be less than the number of'
      char_mtrx(3)='points.'
      char_mtrx(4)= temp//' lags will be generated.'
      call dlog(515,0,0,ed_fld_data,1,0,2,misc,
+      cnclflag,proc,char_mtrx)
      call setcur(4)
    endif

    if (flag=cross) then                                ! for cross correlation only
      call setcur(0)
      prompt = 'Select a second input file for correlation:'
      call getfil("TEXT",filename,prompt)
      if (filename=' ') return
      call setcur(4)
      open(unit=2, file=filename)
      i=0; status=0
      while ((status<>eof).and.(i<1000))
        read(2,*,IOSTAT=status) databuf2(i,1), databuf2(i,2)
        i=i+1
      repeat
      npts2 = i-2
      close(2)
      if (npts>npts2) then
        do i=npts2,npts-1
          databuf2(i,2)=0
        enddo
      elseif (npts2>npts) then
        do i=npts ,npts2-1
          databuf1(i,2)=0
        enddo
      endif
      npts = max(npts,npts2)
    endif

    if (flag=acf) then
      call correlate(databuf1,databuf1,npts,lags,acf)
    else
      call correlate(databuf1,databuf2,npts,lags,cross)
    endif

*
* prompt the user for output file and save data to it
*
      prompt = "save correlation sequence as:"
      if (flag=acf) origname = "acf.dat"
      if (flag=cross) origname = "ccf.dat"
      call setcur(0)
      call putfil(filename,prompt,origname)
      if (filename<>' ') then
        call setcur(4)
        open(1,file=filename,status='new')
        if (flag=2) lags = 2*lags
        do i=0,lags
          write(1,*) databuf1(i,1),',',databuf1(i,2)
        enddo
        ENDFILE(1)

```

```

      close(1)
endif

if (plotseq=1) then
  if (flag=2) lags = 2*lags
  do i=1, lags+1
    x(i) = databuf1(i-1,1)
    ed fld_data=x(i)
    y(i) = databuf1(i-1,2)
    ed fld_data=y(i)
  enddo
  call plot(plotpic, rect, 7, x, y, lags+1)
endif
call setcur(0)
return
end

```

```

*****
*****
***** THIS ROUTINE SUBTRACTS THE MEAN FROM A GIVEN PROCESS BEFORE IT
***** CALCULATES THE AUTOCORRELATION SEQUENCE.
*****
*****

```

SUBROUTINE CORRELATE(E1, E2, N, LAG, FLAG)

IMPLICIT NONE

```

REAL E1(0:4000,2), E2(0:4000,2)
REAL CORRP(0:1000), CORRN(0:1000), VAR1, VAR2
INTEGER TAU, FLAG, I, N, LAG

```

```

CALL SUBMEAN(E1, N)
CALL SUBMEAN(E2, N)

```

```

VAR1 = 0
VAR2 = 0
DO I = 0, N-1
  VAR1 = E1(I,2)**2 + VAR1
  VAR2 = E2(I,2)**2 + VAR2

```

```

ENDDO
VAR1 = SQRT(VAR1/N)
VAR2 = SQRT(VAR2/N)

```

```

DO TAU=0, LAG
  CORRP(TAU)=0.
  DO I=1, N-TAU
    CORRP(TAU) = (E1(I,2)*E2(I+TAU,2)) + CORRP(TAU)
  ENDDO
  CORRP(TAU) = CORRP(TAU)/FLOAT(N-TAU)
  CORRP(TAU) = CORRP(TAU)/(VAR1*VAR2)
ENDDO

```

```

IF (FLAG.EQ.2) THEN
  DO 30 TAU=0, -LAG, -1
    CORRN(-TAU)=0.

```

```

DO I=1, N+TAU
  CORRN(-TAU) = (E2(I,2)*E1(I-TAU,2))+CORRN(-TAU)
ENDDO
CORRN(-TAU) = CORRN(-TAU) / ((VAR1 * VAR2) * (N-TAU))
ENDDO

```

```

DO I =0, LAG-1
  E1(I,1) = -(LAG-I)
  E1(I,2) = CORRN(LAG-I)
ENDDO

```

```

DO I=LAG, 2*LAG
  E1(I,1) = I-LAG
  E1(I,2) = CORRP(I-LAG)
ENDDO

```

```
ELSE
```

```

DO I=0, LAG
  E1(I,2) = I
  E1(I,2) = CORRP(I)
ENDDO
ENDIF

```

```
RETURN
```

```
END
```

```

*****
***
*** SUBMEAN: SUBTRACT THE MEAN FROM E SEQUENCE
***
*****

```

```

SUBROUTINE SUBMEAN(E,N)
IMPLICIT NONE

```

```

REAL E(0:4000,2), MEAN
INTEGER I,N

```

```

MEAN = 0.
DO I = 0,N-1
  MEAN = MEAN + E(I,2)
ENDDO
MEAN = MEAN/FLOAT(N)
DO I = 1, N
  E(I,2) = E(I,2) - MEAN
ENDDO
RETURN
END

```

```

*****
*
* LEVINSON: CALCULATES THE PARTIAL AUTOCORRELATION SEQUENCE USING
* LEVINSON ALGORITHM. THE USER IS PROMPTED FOR ACF, # OF
* LAGS, AND THE OUTPUT FILE.
*
*****
      SUBROUTINE LEVINSON (plotpic,rect)

      IMPLICIT NONE

      integer*4  toolbx,misc(2),plotpic
      REAL PACF(100),VARE(0:101),PHI(0:101,0:101)
      REAL Q(101),ACF(0:1000),DUM,ed_fld_data,x(1000),y(1000)
      integer*2  rect(4)
      INTEGER I, M, N, LAGP, LAG, STATUS,EOF,proc,plotseq
      PARAMETER(EOF = -1)
      CHARACTER*64 FILENAME,PROMPT,ORIGNAME,CHAR_MTRX(4)
      character temp*3
      logical cncflflag

      proc=8
      ed_fld_data = 0          !PACF lags
      call dlog(4300,1,1,ed_fld_data,1,2,3,misc,
+          cncflflag,proc,char_mtrx)
      if (.NOT.cncflflag) return
      lagp = int(ed_fld_data)
      plotseq = proc
      prompt = 'Select an ACF input file to PACF:'
      call getfil("TEXT",filename,prompt)
      if (filename=' ') return

*
* read data from 'filename' file
*
      call setcur(4)
      open(unit=2, file=filename)
      i=0; status=0
      while ((status<>eof).and.(i<100))
          read(2,*,IOSTAT=status) dum, acf(i)
          i=i+1
      repeat
      lag = i-1
      close(2)

      if ((LAG-1).LE.LAGP) THEN
          LAGP = LAG-2
          proc=11
          write(temp,92) LAGP
92  format(I3)
          char_mtrx(1)='PACF lags SHOULD be 2 less than the ACF lags.'
          char_mtrx(2)= temp//' PACF lags are being generated.'
          char_mtrx(3)=''
          char_mtrx(4)=''
          call dlog(515,0,0,ed_fld_data,1,0,2,misc,
+          cncflflag,proc,char_mtrx)
      endif
      endif

C
C INITIALIZATIONS
C

```

```

VARE(0) = ACF(0)
Q(1) = ACF(1)
DO I = 0, LAG
    PHI(I,0) = -1.
ENDDO

PHI(1,1) = Q(1)/VARE(0)
VARE(1) = VARE(0)*(1-(PHI(1,1)**2))
C
C ALGORITHM'S MAIN LOOP
C
DO M=1, LAGP
    Q(M+1) = 0.
    DO N = 0, M
        Q(M+1) = Q(M+1) + ACF(M+1-N)*(-PHI(M,N))
    ENDDO
    PHI(M+1,M+1) = Q(M+1)/VARE(M)
    DO N = 1,M
        PHI(M+1,N) = PHI(M,N) - PHI(M+1,M+1)*PHI(M,M+1-N)
    ENDDO
    VARE(M+1) = VARE(M)*(1+PHI(M+1,M+1)**2)
ENDDO

*
* prompt user for output file and save data to it
*
prompt = "save PACF sequence as:"
origname = "pacf.dat"
call setcur(0)
call putfil(filename,prompt,origname)
if (filename<>' ') then
    call setcur(4)
    open(1,file=filename,status='new')
    do i = 1, lagp
        write(1,*) i,phi(i,i)
    enddo
    close(1)
endif

if (plotseq=1) then
    do i=1,lagp
        x(i) = i
        y(i) = phi(i,i)
    enddo
    call plot(plotpic,rect,8,x,y,lagp)
endif
call setcur(0)
return
end

```

```
*****
*
* THIS SUBROUTINE CALCULATES THE GENERALIZED PARTIAL AUTOCORRELATION
* ARRAY GIVEN THE AUTOCORRELATION, ACF, SEQUENCE. THE USER IS PROMPTED
* IN THE MAIN PROGRAM FOR THE ACF, # OF LAGS, AND THE OUTPUT FILE.
*
```

```
*****
```

```

SUBROUTINE GPAC (FLAG,ARRAY_PICT,RECT)
  IMPLICIT NONE
  INCLUDE hd:include files:Estm-menu.inc

  INTEGER*4 ARRAY_PICT,proc
  INTEGER*2 RECT(4)
  INTEGER ARY_SIZE
  PARAMETER (ARY_SIZE=26)
  REAL PHIKJ(-2*ARY_SIZE:ARY_SIZE,0:ARY_SIZE)
  real S(-2*ARY_SIZE:ARY_SIZE,0:ARY_SIZE)
  REAL ACF(0:1000), R(-2*ARY_SIZE:ARY_SIZE,0:ARY_SIZE)
  REAL PI, W, ed fld_data(3)
  INTEGER I, J, K, dum, FLAG
  INTEGER KLAG, JLAG, LAG, STATUS
  INTEGER EOF, g_pac, s_array, r_array
  PARAMETER (EOF=-1, g_pac=1, s_array=2, r_array=3)
  INTEGER*4 toolbx, misc(2)
  CHARACTER*64 filename, prompt, origname, char_mtrx(4)
  character temp*3
  LOGICAL cnclflag

```

```
*****
```

```
*****
```

```
*****      INITIALIZATION OF S AND R ARRAYS
```

```
*****
```

```
*****
```

```
C PROMPT THE USER FOR THE PARAMETERS
```

```

IF (FLAG=G PAC) THEN
  PROMPT = 'Select an ACF input file to GPAC:'
ELSEIF (FLAG=S ARRAY) THEN
  PROMPT = 'Select an ACF input file to S ARRAY:'
ELSE
  PROMPT = 'Select an ACF input file to R ARRAY:'
ENDIF
CALL GETFIL("TEXT",filename,prompt)
IF (FILENAME=' ') RETURN

OPEN (UNIT=2, FILE=FILENAME)
I=0; STATUS=0
WHILE ((STATUS<>EOF).AND.(I<1000))
  READ(2,*,IOSTAT=STATUS) dum, ACF(I)
  I=I+1
REPEAT
LAG = I-2
if .NOT.(lag<ary_size) lag =ary_size-1
!to avoid array boundary error
CLOSE(2)

do

```

```

proc=0
ed_fld_data(1) = 8           !KLAG
ed_fld_data(2) = 8           !JLAG
ed_fld_data(3) = 0.0        !W
call dlog(5100,3,3,ed_fld_data,1,2,2,misc,
+       cnclflag,proc,char_mtrx)
if (.NOT.cnclflag) return
KLAG = int(ed_fld_data(1))
JLAG = int(ed_fld_data(2))
W = ed_fld_data(3)

if (KLAG+JLAG-1>LAG) then
  proc=11
  write(temp,92) LAG
92  format(I3)
  char_mtrx(1)=''
  char_mtrx(2)='(width + height - 1) SHOULD be ≤ '//temp
  char_mtrx(3)=''
  char_mtrx(4)='( '//temp//' = autocorrelation lags) '
  call dlog(514,0,0,ed_fld_data,1,0,2,misc,
+       cnclflag,proc,char_mtrx)
  else
  exit
endif
repeat
  DO J = 0, ARY_SIZE
    DO I = -2*ARY_SIZE, ARY_SIZE
      R(I,J)=1
      S(I,J)=0
    ENDDO
  ENDDO

  PI = ATAN(1.)*4.
  DO I= 0, LAG
    R(I,1) = COS(2.*PI*W*I) * ACF(I)/ACF(0)
    R(-I,1) = COS(2.*PI*W*(-I)) * ACF(I)/ACF(0)
  ENDDO
  DO I = 0, lag+1
    S(-I,0) = 1
    S(I,0) = 1
  ENDDO
*****
*****
*****  CALCULATING THE S AND R ARRAYS
*****
*****
DO 50  K = 1, LAG

  DO 30 J = (LAG-K), -(LAG+K), -1
    IF (R(J,K).EQ.0.) R(J,K) = 1E-2
    S(J,K) = S(J+1,K-1) * (R(J+1,K)/R(J,K) -1.)
30  CONTINUE

  DO 40 J = (LAG-K), -(LAG+K), -1
    IF (S(J,K).EQ.0.) S(J,K)=1E-2
    R(J,K+1) = R(J+1,K) * (S(J+1,K)/S(J,K) -1)
40  CONTINUE

```

```

50    CONTINUE
*****
*****
*****  CALCULATING THE    GPAC = -S(K, J-K+1) / S(K, -K-J)
*****
*****
      if (flag=g_pac) then
        DO 60 K = 1, KLAG
          DO 70 J = 0, JLAG
            IF (S(-K-J,K).EQ.0.)    S(-K-J,K) = 1E-2
            PHIKJ(J,K) = -S(J-K+1,K) / S(-K-J,K)
70      CONTINUE
60      CONTINUE

      prompt = "save GPAC array as:"
      origname = "gpac.dat"
      call putfil(filename,prompt,origname)
      if (filename<>' ') then
        open(1,file=filename,status='new')
        write(1,91) (i,i=1,KLAG)
        do J=0,JLAG
          write(1,90) J, (PHIKJ(J,K),K=1,KLAG)
        enddo
        close(1)
      endif
      CALL plt_gsr(FLAG,ARRAY_PICT,PHIKJ,JLAG,KLAG,RECT)
      elseif(flag=s_array) then
        do j=-JLAG,JLAG
          do i=1,KLAG
            R(J+JLAG,I) = S(J-I+1,I)    !write shifted-S into R
          enddo
        enddo
        prompt = "save S-array as:"
        origname = "s_array.dat"
        call putfil(filename,prompt,origname)
        if (FILENAME<>' ') then
          open(1,file=filename,status='new')
          write(1,91) (i,i=1,KLAG)
          do J=0,2*JLAG
            write(1,90) J-JLAG, (R(J,I),I=1,KLAG)
          enddo
          close(1)
        endif
        CALL plt_gsr(FLAG,ARRAY_PICT,R,2*JLAG+1,KLAG,RECT)
      elseif (flag=r_array) then
        do j=-JLAG,JLAG
          do i=1,KLAG
            S(J+JLAG,I) = R(J-I+1,I)    !write shifted-R into S
          enddo
        enddo
        prompt = "save R-array as:"
        origname = "r_array.dat"
        call putfil(filename,prompt,origname)
        if (FILENAME<>' ') then
          open(1,file=filename,status='new')
          write(1,91) (i,i=1,KLAG)
          format(9x,20(i2,7x))
          do J=0,2*JLAG
91

```

```
90      write(1, 90) J-JLAG, (S(J, I), I=1, KLAG)
        format(1X, I3, 1X, 20(1X, F8.4))
        enddo
        close(1)
      endif
      CALL plt_gsr(FLAG, ARRAY_PICT, S, 2*JLAG+1, KLAG, RECT)
    endif

RETURN
END
```

```

*****
*
* THIS SUBROUTINE ESTIMATES THE PARAMETERS OF AN ARMA(P,Q) FILTER
* GIVEN THE ARMA SEQUENCE USING APPROXIMATE LIKELIHOOD ESTIMATION
* (i.e. I.C. OF Z'S ARE ZEROS). IT ALSO CALCULATES THE COVARIANCE
* AS WELL AS THE RESIDUALS (Ei) WHICH ARE OUTPUTTED TO A FILE FOR
* FURTHER ANALYSIS.
** THE RECURSIVELY CALCULATED PARAMETERS ARE RETURNED IN TH(N,P+Q).
* WHERE N, P, & Q ARE THE SEQUENCE LENGTH, AR ORDER, AND MA ORDER.
*
*****
      SUBROUTINE MLE
      IMPLICIT NONE
      include hd:include files:utilities.inc

      INTEGER*4 toolbx
      integer as,ps                !array size and param vector size respec.
      parameter(as=4000,ps=15)
      REAL Z(-ps:as),THETA(ps),X(ps,0:as),A(ps,ps),EI(-ps:as),H(ps)
      REAL G(ps),ASTR(ps,ps),D(ps),GSTR(ps),HSTR(ps),EIPD(-ps:as)
      REAL THEOLD(ps),EOLD(-ps:as),ENEW(-ps:as),Zl(ps) !,TH(as,ps)
      REAL COVAR(ps,ps),SOLD,SNEW,RCOND,DET(2),VAR
      INTEGER IPVT(ps),T,P,Q,DUM,I,K,j,STATUS,EOF
      PARAMETER(EOF = -1)
      CHARACTER*64 FILENAME, PROMPT, ORIGNAME, char_mtrx(11)
      REAL PI, EPS, F2, DELTA, ed_fld_data(3)
      INTEGER PIMAX, ITERMAX, LDA, ITER,N,PD,WINDOW,HTE
      integer*2 rect(4),itemtype
      integer misc(2),proc,dd,mm,yy,seconds,hours,minutes,flength
      character temp*13,temp1*65, str255*256
      logical cncflflag,exist, ITERFLAG, PIFLAG
      integer*4 appllimit          ! address of current application limit
      integer*4 newlimit          ! new application limit
      parameter (appllimit=z'00000130')
      DATA PI,EPS,PIMAX,F2,DELTA/.01,.01,1000,5,.01/

      newlimit = LONG(appllimit)   ! get the current limit
      newlimit = newlimit-102400   !allocate an additional 100k of stack
      call toolbx(SETAPPLLIMIT,newlimit) !set the new application limit

      LDA=PS
      ITER =1
      ITERFLAG = .FALSE.
      PIFLAG   = .FALSE.

3     proc=0                      !calling proc. is mle
      ed_fld_data(1) = 0.          !AR order (p)
      ed_fld_data(2) = 0.          !MA order (q)
      ed_fld_data(3) = 1000       !ITERMAX (max # of iterations)
      call dlog(6000,3,4,ed_fld_data,1,2,2,misc,
+          cncflflag,proc,char_mtrx)
      if (.NOT.cncflflag) GOTO 300
      p = int(ed_fld_data(1))
      q = int(ed_fld_data(2))
      if ((p=0).and.(q=0)) GOTO 300
      if ((p+q)>ps) then
          proc=11

```

```

write(temp,92) ps
char_mtrx(1)=''
char_mtrx(2)='p + q should not exceed '//temp
char_mtrx(3)=''
char_mtrx(4)=''
call dlog(515,0,0,ed_fld_data,1,0,2,misc,
+       cnclflag,proc,char_mtrx)
      GOTO 3
endif
ITERMAX= int(ed_fld_data(3))
prompt = 'Select an input file for Maximum Likelihood Estimate:'
call getfil("TEXT",filename,prompt)
if (filename=' ') GOTO 300
call setcur(4)
*
* read data from 'filename' file
*
open(unit=2, file=filename)
i=1; status=0
while ((status<>eof).and.(i<as))
  read(2,*,IOSTAT=status) dum,z(i)
  i=i+1
repeat
if (i>= as) then
  proc=11
  write(temp,92) as
  char_mtrx(1)=''
  char_mtrx(2)='Number of points should not exceed '//temp
  char_mtrx(3)='The first '//trim(temp)//' points will be used.'
  char_mtrx(4)=''
  call dlog(515,0,0,ed_fld_data,1,0,2,misc,
+       cnclflag,proc,char_mtrx)
endif
n = i-2
close(2)
C
C INITIALIZE PARAMETER VECTOR THETA
C
DO I = 1, P+Q
  THETA(I) = 0.
ENDDO
DO I=-PS, 0
  EI(I) = 0.
  EIPD(I) = 0.
  Z(I) = 0.
  EOLD(I) = 0.
  ENEW(I) = 0.
ENDDO

call toolbx(INITDIALOGS,0)
window=toolbx(FRONTWINDOW)
pd = toolbx(GETNEWDIALOG,6200,0,-1)
call toolbx(SETPORT,pd)
call toolbx(SHOWWINDOW,pd)
write(temp1,88) iter
call toolbx(GETDITEM,pd,1,itemtype,hte,rect)
call toolbx(SETITEXT,hte,str255(temp1))

```

```

C
C CALCULATION OF X
C
1 CALL ECAL(THETA,Z,P,Q,N,EI,0)
  DO I = 1, P+Q
    CALL ECAL(THETA,Z,P,Q,N,EIPD,I)
    DO T = 1, N
      X(I,T) = (EI(T) - EIPD(T))/DELTA
    ENDDO
  ENDDO
C
C CALCULATION OF A ( A = X'*X )
C
  DO I = 1, P+Q
    DO J = 1, P+Q
      A(I,J) = 0.
      DO T=1, N
        A(I,J) = A(I,J) + X(I,T)*X(J,T)
      ENDDO
    ENDDO
  ENDDO
C
C CALCULATION OF G ( G = X'*E0 )
C
  DO I = 1, P+Q
    G(I) = 0.
    DO T = 1, N
      G(I) = G(I) + X(I,T)*EI(T)
    ENDDO
  ENDDO
C
C CALCULATION OF D
C
  DO I = 1, P+Q
    D(I) = SQRT(A(I,I))
  ENDDO
C
C NORMALIZE A & CALCULATE ASTR AND GSTR
C
2 DO I = 1, P+Q
  DO J = 1, P+Q
    ASTR(I,J) = A(I,J) / (D(I)*D(J))
  ENDDO
  ASTR(I,I) = 1. + PI
  GSTR(I) = G(I) / D(I)
ENDDO
C
C SOLVE FOR HSTR ( ASTR * HSTR = GSTR ) UTILIZING LINPAC SUBROUTINES
C
CALL SGECO(ASTR,LDA,P+Q,IPVT,RCOND,Z1)
CALL SGEDI(ASTR,LDA,P+Q,IPVT,DET,Z1,1)
DO I = 1, P+Q
  H(I) = 0.
  DO J = 1, P+Q
    H(I) = H(I) + ASTR(I,J) * GSTR(J)/D(I)
  ENDDO
ENDDO
C

```

C CALCULATE SOLD AND SNEW (SUM OF ERRORS SQUARED)

C

```
DO I = 1, P+Q
  THEOLD(I) = THETA(I)
  THETA(I) = THETA(I) + H(I)/10
```

ENDDO

```
CALL ECAL(THETA, Z, P, Q, N, ENEW, 0)
CALL ECAL(THEOLD, Z, P, Q, N, EOLD, 0)
```

SOLD = 0.

SNEW = 0.

```
DO T = 1, N
```

SOLD = SOLD + EOLD(T)\*\*2

SNEW = SNEW + ENEW(T)\*\*2

ENDDO

```
write(templ,88) iter
```

88 format('Iteration : ',I4)

```
call toolbx(GETDITEM,pd,1,itemtype,hte,rect)
```

```
call toolbx(SETITEXT,hte,str255(templ))
```

```
write(templ,89) snew
```

89 format('Noise sum of squares : ',f10.1)

```
call toolbx(GETDITEM,pd,2,itemtype,hte,rect)
```

```
call toolbx(SETITEXT,hte,str255(templ))
```

C

C CALCULATION OF COVARIANCE MATRIX

C

```
CALL SGECO(A, LDA, P+Q, IPVT, RCOND, Z1)
```

```
CALL SGEDI(A, LDA, P+Q, IPVT, DET, Z1, 1)
```

```
DO I = 1, P+Q
```

```
DO J = 1, P+Q
```

COVAR(I, J) = SOLD\*A(I, J)/FLOAT(N-P-Q)

ENDDO

ENDDO

C

C TEST FOR CONVERGENCE

C

```
IF (SNEW.LT.SOLD) THEN
```

DUM = 0.

```
DO I = 1, P+Q
```

```
IF (ABS(H(I)).GT.EPS) THEN
```

DUM = 1.

```
ENDIF
```

ENDDO

```
IF (DUM.EQ.0.) THEN
```

```
DO I = 1, P+Q
```

```
WRITE(9,*) (COVAR(I, J), J=1, P+Q)
```

ENDDO

```
GOTO 200
```

! DONE

```
ELSE
```

```
ITER = ITER + 1
```

```
IF (ITER.GT.ITERMAX) THEN
```

```
ITER = ITER - 1
```

```
ITERFLAG=.TRUE.
```

```
GOTO 200
```

! TERMINATE CALCULATION

```
ENDIF
```

```
PI = PI/F2
```

```
ENDIF
```

```
ELSE
```

```
PI = PI * F2
```

```

      IF (PI.GT.PIMAX) THEN
        PIFLAG=.TRUE.
        GOTO 200                ! TERMINATE CALCULATION
      ENDIF
      IF (ITER.GT.ITERMAX) THEN
        ITERFLAG=.TRUE.
        GOTO 200                ! TERMINATE CALCULATION
      ENDIF
      GOTO 2
    ENDIF
  GOTO 1

```

\*

\* prompt the user for output files and save data to them

\*

```

200  call toolbox(DISPOSEDIALOG, pd)
     call toolbox(SETPORT, window)
     proc=12                !calling proc. is doarma
     call date(mm,dd,yy)
     write(temp,90) mm,dd,yy
90   format(I2,2('/',I2))
     char_mtrx(1) = temp          ! date
     call time(seconds)
     hours = seconds/3600;    seconds= mod(seconds,3600)
     minutes = seconds/60;   seconds= mod(seconds,60)
     write(temp,94) hours,minutes,seconds
94   format(I2,2(':',I2))
     char_mtrx(2) = temp          ! time
     write(temp,91) snw
91   format(f7.1)
     char_mtrx(3) = temp          ! noise sum of squares
     write(temp,92) n-p-q
92   format(I4)
     char_mtrx(4) = temp          ! degrees of freedom
     var = 0
     do i = 1, n
       var = ei(I)**2 + var
     enddo
     write(temp,103) sqrt(var/n)
103  format(G10.3)
     char_mtrx(5) = temp          ! residuals STD
     write(temp,92) iter
     char_mtrx(6) = temp          ! # of iterations
     char_mtrx(7) = ''
     do i=1, p
       write(temp,93) theta(i),sqrt(covar(i,i))
       char_mtrx(7) = trim(char_mtrx(7))//temp
       ! AR parameters and their STD
93   format('(',f5.2,',',f5.2,')')
     enddo
     char_mtrx(8) = ''
     do i=p+1, q+p
       write(temp,93) theta(i),sqrt(covar(i,i))
       char_mtrx(8) = trim(char_mtrx(8))//temp
       ! MA parameters and their STD
     enddo
     if (iterflag) then
       char_mtrx(9) = ' No convergence. ITER exceeded max.'

```

```

elseif ( piflag) then
    char_mtrx(9) = '      No convergence. PI exceeded max.'
else
    char_mtrx(9) = '                        Parameters converged'
endif
char_mtrx(10) = 'residuals.dat'
char_mtrx(11) = 'MLE.dat'
call setcur(0)
call dlog(6100,0,6,ed_fld_data,1,2,7,misc,
+       cncflflag,proc,char_mtrx)
if (.NOT.cncflflag) GOTO 300
call setcur(4)
if ((proc.and.B'001')=1) then ! proc is a flag to indicate
    filename=char_mtrx(10)      ! the selected options.
    flength = ichar(filename(1:1))
    filename = filename(2:flength+1)
    inquire (file=filename,exist=exist)
    if (exist) then
        prompt = "Save residuals as:"
        origname = filename
        call setcur(0)
        call putfil(filename,prompt,origname)
        call setcur(4)
        if (filename=' ') GOTO 201
    endif
    open(1,file=filename,status='new')
    do i=1 ,n
        write(1,*) i-1,ei(i)
    enddo
    close(1)
endif

201 if (( proc.and.B'010')=2) then
    filename=' '
    filename=char_mtrx(11)      ! the selected options.
    flength = ichar(filename(1:1))
    filename = filename(2:flength+1)
    inquire (file=filename,exist=exist)
    if (exist) then
        prompt = "Save MLE report as:"
        origname = filename.
        call setcur(0)
        call putfil(filename,prompt,origname)
        call setcur(4)
        if (filename=' ') GOTO 202
    endif
    open(1,file=filename,status='new')
    write(1,95) trim(char_mtrx(1)),trim(char_mtrx(9)),
+       trim(char_mtrx(2))
95  format(4x,'Date: ',A,5x,A,5x,'Time: ',A/)
    write(1,96) char_mtrx(3),char_mtrx(4)
96  format(/,4x,'Noise sum of squares: ',A,T40,
+       'Degrees of freedom: ',A/)
    write(1,97) char_mtrx(5),char_mtrx(6)
97  format(4x,'Residuals standard error: ',A,T40,
+       'Number of iterations: ',A/)
    write(1,100)
100 format(4x,'AR parameters (phi,std)')

```

```

j=1
while (j*5-4<=p)
  temp1=''
  do i=j*5-4, min(5*j,p)
    write(temp,98) theta(i),sqrt(covar(i,i))
    temp1 = trim(temp1)//temp
  enddo
  write(1,102) temp1
  j=j+1
repeat
102  format(4x,A)
98   format(5(' ',f5.2,',',f5.2,')', :)//

write(1,99)
99   format(/4x,'MA parameters (theta,std)')
j=1
while (j*5-4+p<=p+q)
  temp1=''
  do i=j*5-4+p, min(5*j+p,p+q)
    write(temp,98) theta(i),sqrt(covar(i,i))
    temp1 = trim(temp1)//temp
  enddo
  write(1,102) temp1
  j=j+1
repeat
close(1)
endif
202  if ((proc.and.B'100')=4) then
      if ((proc.and.B'010')=2).AND.(filename<>' ') then
        call spool(filename,0,1)
      else
        filename = 'MacModel.scratch'
        open(1,file=filename,status='new')
        write(1,95) trim(char_mtrx(1)),trim(char_mtrx(9)),
+         trim(char_mtrx(2))
        write(1,96) char_mtrx(3),char_mtrx(4)
        write(1,97) char_mtrx(5),char_mtrx(6)
        write(1,100)

        j=1
        while (j*5-4<=p)
          temp1=''
          do i=j*5-4, min(5*j,p)
            write(temp,98) theta(i),sqrt(covar(i,i))
            temp1 = trim(temp1)//temp
          enddo
          write(1,102) temp1
          j=j+1
        repeat

        write(1,99)
        j=1
        while (j*5-4+p<=p+q)
          temp1=''
          do i=j*5-4+p, min(5*j+p,p+q)
            write(temp,98) theta(i),sqrt(covar(i,i))
            temp1 = trim(temp1)//temp
          enddo
        repeat

```

```

        enddo
        write(1,102) temp1
        j=j+1
    repeat
    close(1)
    call spool(filename,0,1)
    endif
endif
300 call setcur(0)
    newlimit = LONG(appllimit)           ! get the current limit
    newlimit = newlimit+102400         ! allocate an additional 100k
of stack
    call toolbx(SETAPPLLIMIT,newlimit) ! set the new application
limit

```

```
RETURN
```

```
END
```

```

*****
*****
*****      SUBROUTINE TO CALCULATE THE RESIDUALS
*****
*****

```

```

SUBROUTINE ECAL(THETA,Z,P,Q,N,E,I)
IMPLICIT NONE

```

```

integer as,ps           !array size and param vector size respec.
parameter(as=4000,ps=15)
REAL THETA(ps), E(-ps:as), Z(-ps:as),DELTA,E1,E2
PARAMETER(DELTA=.01)
INTEGER P,Q,T,J,K,N,I

```

```

IF (I.NE.0) THETA(I) = THETA(I) + DELTA
DO T=1,N
    E1 = 0.
    DO J=1,P
        IF ((T-J).GE.0.) E1 = E1 + Z(T-J) * THETA(J)
    ENDDO
    E2 = 0.
    DO K=1,Q
        IF ((T-K).GE.0.) E2= E2 + E(T-K) * THETA(P+K)
    ENDDO
    E(T) = Z(T) - E1 + E2
ENDDO
IF (I.NE.0) THETA(I) = THETA(I) - DELTA
RETURN
END

```

```

*****
*****
*****      SUBROUTINES FROM LINPAC TO CALCULATE THE INVERSE
*****
*****

```

```

subroutine sgedi(a,lda,n,ipvt,det,work,job)
subroutine sgeco(a,lda,n,ipvt,rcond,z)

```

VITA

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