# Miguel Alejandro García Navarro 1919323

#### **Homework 1**

Inflation is generated and plotted.

. . use ppi

.
. generate lppi=log(ppi)

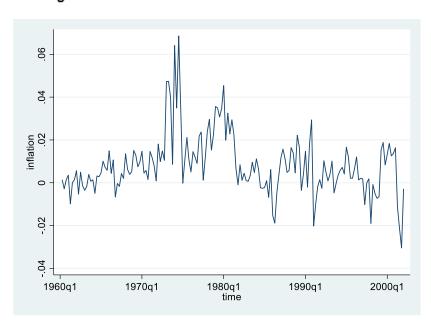
. generate inflation=d.lppi
(1 missing value generated)

. . tsline inflation

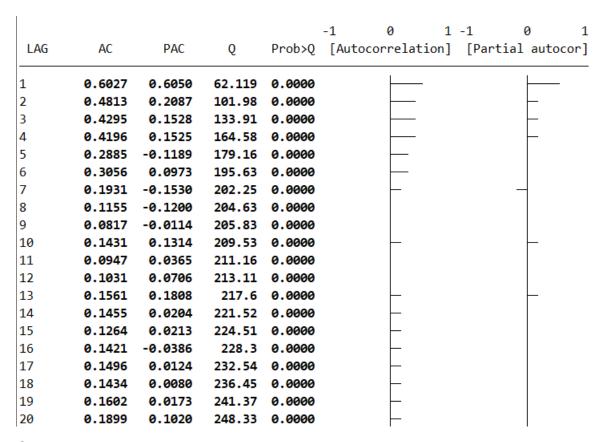
. ac inflation

. pac inflation

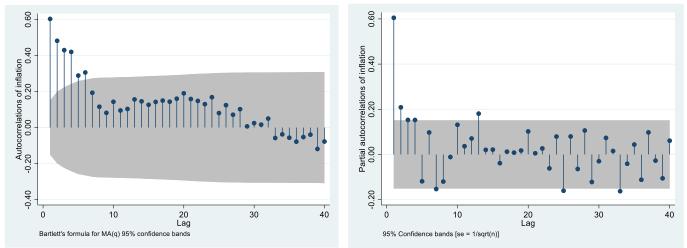
. corrgram inflation



From the plot one cannot say if it is stationary or not.



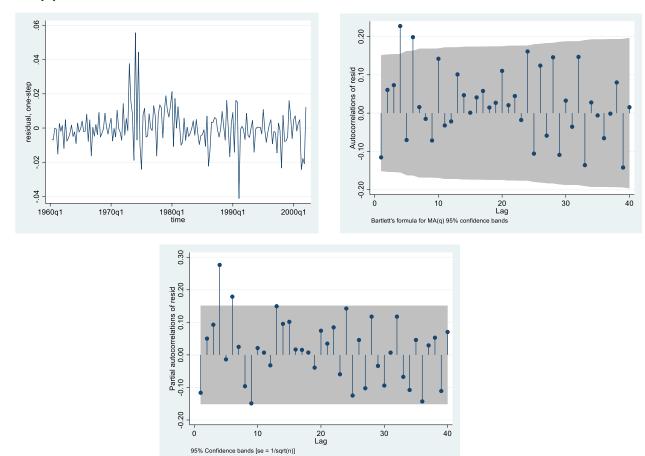
Correlogram indicates that there is autocorrelation



From the AC and PAC it seems like it is a stationary process, it slowly goes to zero in the AC, and in the PAC it has one big spike, but 4 in total at the beginning. I propose the next models:

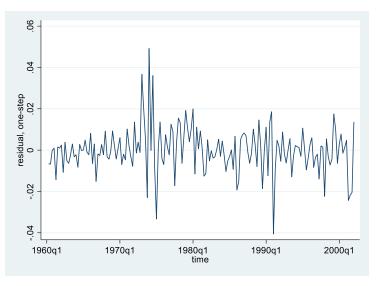
AR(1), AR(2), MA(4), MA(5), MA(6), ARMA(1,1)

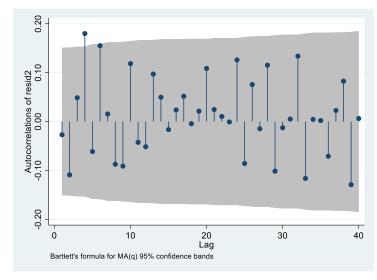
## **AR(1)**

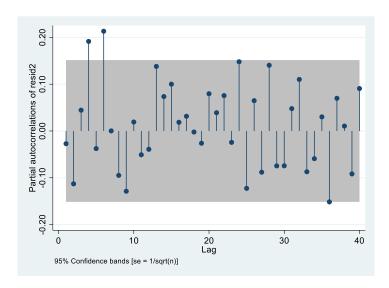


The residuals of the AR(1) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

## **AR(2)**

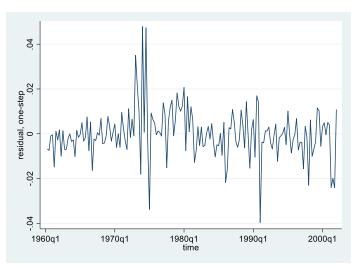


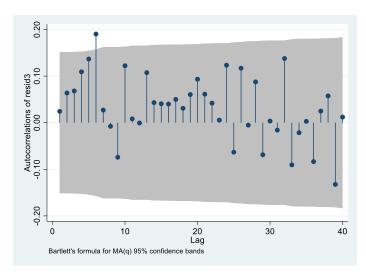


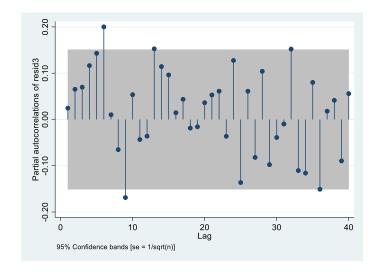


The residuals of the AR(2) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

### **MA(4)**

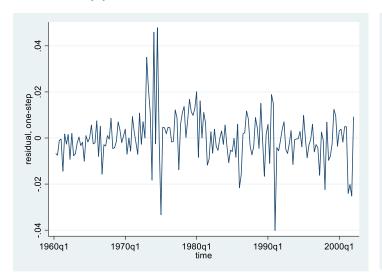


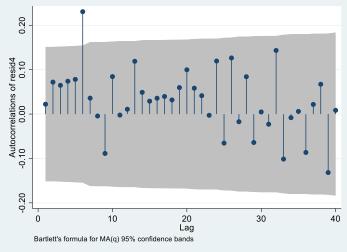


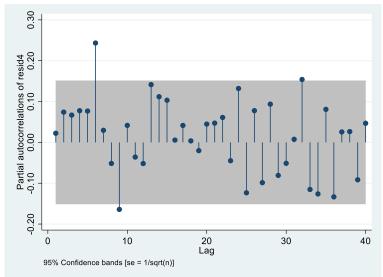


The residuals of the MA(4) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

#### **MA(5)**

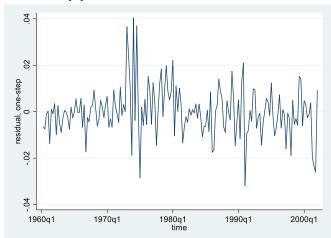


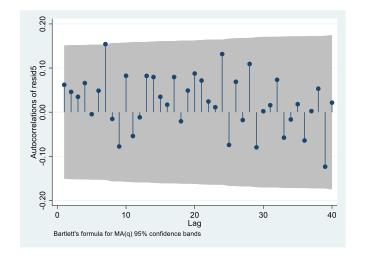


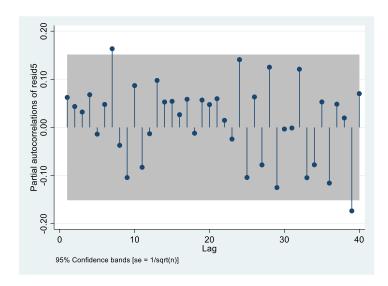


The residuals of the MA(5) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

### **MA(6)**

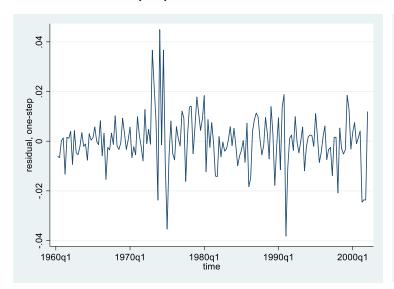


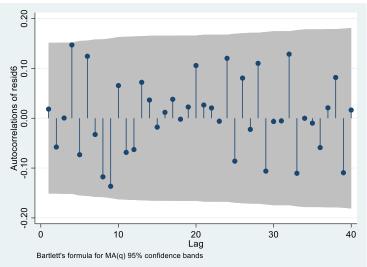


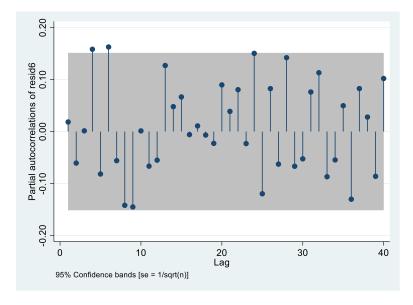


The residuals of the MA(6) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

## **ARMA(1,1)**







The residuals of the ARMA(1,1) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

The next two tables summarize some of the properties of each model tested.

Yellow-shaded are the ones that can be compared. The others are rejected either because of the significancy of their coefficients or because they do not imply stationarity and/or invertibility

	AR(1)	AR(2)	MA(4)	
Coefficients				
Are they all				
individually	Yes	Yes	Yes	
significant? (t-test)				
Are they all jointly				
significant (F-test or	Yes	Yes	Yes	
chi-squared test)				
Do they imply				
stationarity (AR				
coefficients) and	Yes	Yes	No	
invertibility (MA				
coefficients)				
Information criterion				
AIC	-1025.94	-1030.975	-1026.423	
BIC	-1016.57	-1018.48	-1007.679	
Diagnostic checks -	Diagnostic checks – residuals			
Plot the residuals –				
do they exhibit any	No	No	Yes	
remaining pattern?				
ACFs and PACFs of				
residuals – do they	No	No No		
indicate white noise?				
Ljung-Box Q-Test (p-				
values in brackets				
Q_lag4	12.826 (0.0122)	8.221 (0.0838)	3.6792 (0.4512)	
Q_lag 8	20.7 (0.0080) <sup>′</sup>	14.534 (0.0689)	13.474 (0.0965)	
Q_lag 12	25.53 (0.0125)	19.386 (0.0796)	17.173 (0.1432)	

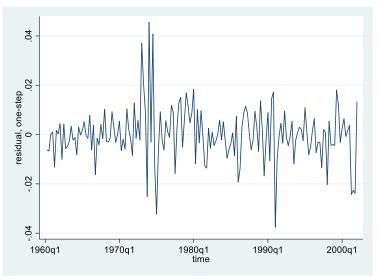
	MA(5)	MA(6)	ARMA(1,1)
Coefficients			
Are they all			
individually	No	Yes	Yes
significant? (t-test)			

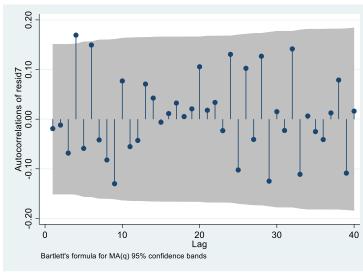
Are they all jointly significant (F-test or chi-squared test)  Do they imply stationarity (AR coefficients) and invertibility (MA coefficients)  Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they indicate white noise?  Ljung-Box Q-Test (p-yaluse in brackets			T	,	
Do they imply stationarity (AR coefficients) and No No Yes invertibility (MA coefficients)  Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they indicate white noise?  Ljung-Box Q-Test (p-	significant (F-test or	Yes	Yes	Yes	
stationarity (AR coefficients) and No No Yes invertibility (MA coefficients)  Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they indicate white noise?  Ljung-Box Q-Test (p-					
coefficients) and No No Yes invertibility (MA coefficients)  Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they indicate white noise?  Ljung-Box Q-Test (p-	Do they imply				
invertibility (MA coefficients)  Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they indicate white noise?  Ljung-Box Q-Test (p-	stationarity (AR				
Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they indicate white noise?  Ljung-Box Q-Test (p-	coefficients) and	No	No	Yes	
Information criterion  AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they No No No No indicate white noise?  Ljung-Box Q-Test (p-	invertibility (MA				
AIC -1025.692 -1034.996 -1035.257  BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they No No No No No indicate white noise?  Ljung-Box Q-Test (p-	coefficients)				
BIC -1003.824 -1010.004 -1022.761  Diagnostic checks – residuals  Plot the residuals – do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they No No No No indicate white noise?  Ljung-Box Q-Test (p-	Information criterion				
Diagnostic checks – residuals  Plot the residuals – do they exhibit any No No No remaining pattern?  ACFs and PACFs of residuals – do they No No No No indicate white noise?  Ljung-Box Q-Test (p-	AIC	-1025.692	-1034.996	-1035.257	
Plot the residuals – do they exhibit any No No No No remaining pattern?  ACFs and PACFs of residuals – do they No No No No indicate white noise?  Ljung-Box Q-Test (p-	BIC	-1003.824	-1010.004	-1022.761	
do they exhibit any remaining pattern?  ACFs and PACFs of residuals – do they No No No indicate white noise?  Ljung-Box Q-Test (p-	Diagnostic checks – residuals				
remaining pattern?  ACFs and PACFs of residuals – do they No No No indicate white noise?  Ljung-Box Q-Test (p-	Plot the residuals –				
ACFs and PACFs of residuals – do they No No No Indicate white noise?  Ljung-Box Q-Test (p-	do they exhibit any	No	No	No	
residuals – do they No No No No Indicate white noise?  Ljung-Box Q-Test (p-	remaining pattern?				
indicate white noise?  Ljung-Box Q-Test (p-	ACFs and PACFs of				
Ljung-Box Q-Test (p-	residuals – do they	No	No	No	
	indicate white noise?				
values in brackets	Ljung-Box Q-Test (p-				
values iii biachets	values in brackets				
Q_lag4   2.6576 (0.6166)   1.9866 (0.7382)   4.3911 (0.3557)	Q_lag4	2.6576 (0.6166)	1.9866 (0.7382)	4.3911 (0.3557)	
Q_lag 8   13.339 (0.1007)   6.6712 (0.5725)   10.711 (0.2186)	•	` ,	` ,	` ,	
Q_lag 12   16.063 (0.1884)   9.5473 (0.6556)   16.416 (0.1729)	_	` ,	` ,	` ,	

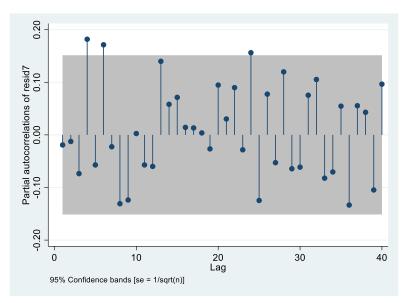
Based on these results, I propose these other models to test:

AR(3), AR(4), MA(3) and ARMA(2,1)

# AR(3)

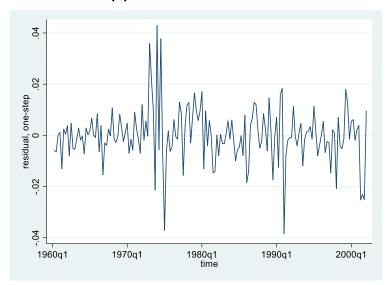


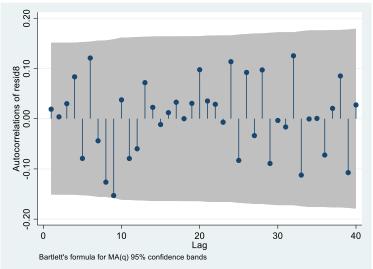


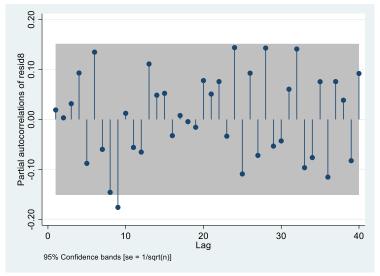


The residuals of the AR(3) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

## AR(4)

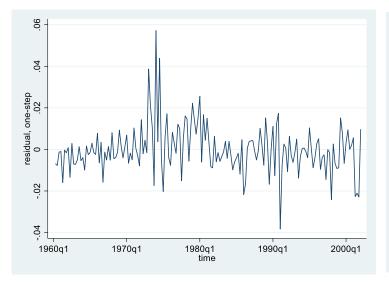


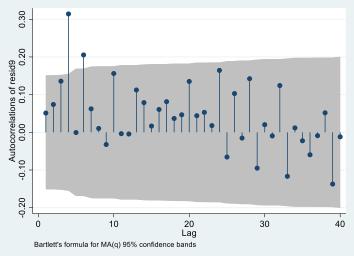


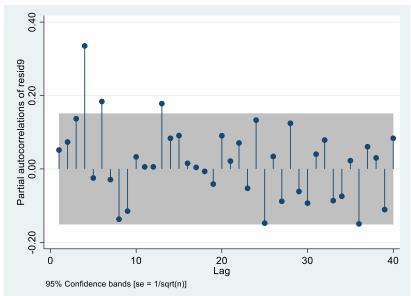


The residuals of the AR(4) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

### **MA(3)**

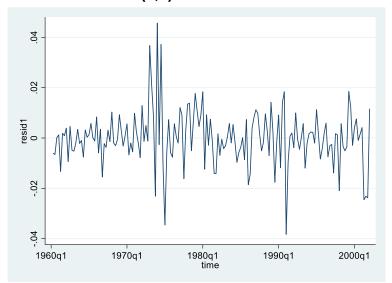


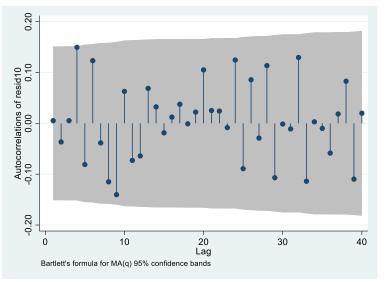


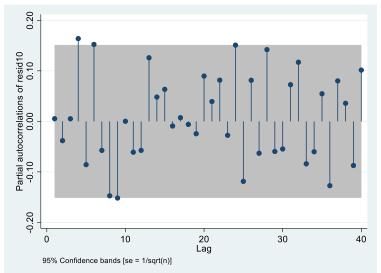


The residuals of the MA(3) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

### **ARMA(2,1)**



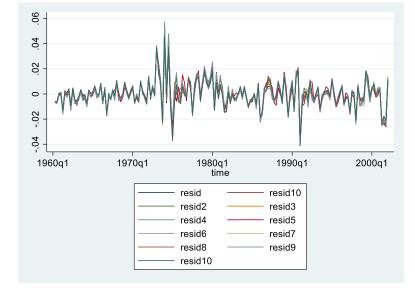




The residuals of the ARMA(2,1) plotted seem to be white-noise, but it can be seen that autocorrelation cannot be said to be zero.

One thing to be noted is that, from all the models tested here, the residuals look

almost the same:



The next two tables summarize the properties of each model. Again, the yellowshaded is the only one that was not rejected based on the significance of its coefficients and on stationarity and invertibility.

	AR(3)	AR(4)	MA(3)		
Coefficients					
Are they all					
individually	Yes	No	No		
significant? (t-test)					
Are they all jointly					
significant (F-test or	Yes	Yes	Yes		
chi-squared test)					
Do they imply					
stationarity (AR					
coefficients) and	Yes	Yes	Yes		
invertibility (MA					
coefficients)					
Information criterion					
AIC	-1032.677	-1034.347	-1014.393		
BIC	-1017.057	-1015.603	-998.7736		
Diagnostic checks -	Diagnostic checks – residuals				
Plot the residuals –					
do they exhibit any	No	No	No		
remaining pattern?					
ACFs and PACFs of					
residuals – do they	No	No	No		
indicate white noise?					
Ljung-Box Q-Test (p-					
values in brackets					
Q_lag4	5.8852 (0.2079)	1.4257 (0.8397)	21.769 (0.0002)		
Q_lag 8	11.943 (0.1538)	8.2913 (0.4055)	29.911 (0.0002)		
Q_lag 12	16.947 (0.1516)	14.55 (0.2670)	34.505 (0.0006)		

	ARMA(2,1)
Coefficients	
Are they all	
individually	No
significant? (t-test)	
Are they all jointly	
significant (F-test or	Yes
chi-squared test)	
Do they imply	
stationarity (AR	No
coefficients) and	

invertibility (MA	
coefficients)	
Information criterion	
AIC	-1033.434
BIC	-1017.814
Diagnostic checks -	residuals
Plot the residuals –	
do they exhibit any	No
remaining pattern?	
ACFs and PACFs of	
residuals – do they	No
indicate white noise?	
Ljung-Box Q-Test (p-	
values in brackets	
Q_lag4	4.1339 (0.3882)
Q_lag 8	10.587 (0.2262)
Q_lag 12	16.558 (0.1670)

From the accepted models, we have the next:

Information criterion	AR(1)	AR(2)	ARMA(1,1)	AR(3)
AIC	-1025.94	-1030.975	-1035.257	-1032.677
BIC	-1016.57	-1018.48	-1022.761	-1017.057

From these four models, the one with the lowest AIC and BIC is the ARMA(1,1), so this is considered to be the best model.